Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 1 of 82

EXHIBIT 102

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 2 of 82

UNITED STATES DISTRICT COURT

NORTHERN DISTRICT OF CALIFORNIA

IN RE: ROUNDUP PRODUCTS LIABILITY LITIGATION

Case No. 16-md-02741-VC

MDL No. 2741

This document relates to:

ALL ACTIONS

EXPERT REPORT OF DR. CHRISTOPHER D. CORCORAN, Sc.D.

1 EVALUATION OF GLYPHOSATE EXPOSURE AND CANCER RISK IN RATS AND MICE

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Dr. Chris Corcoran Department of Mathematics and Statistics Utah State University, Logan, UT

6 I. <u>SUMMARY</u>

7 This report examines the rodent studies of glyphosate and cancer risk, particularly the seven feeding 8 experiments using rats and five using mice that were reviewed in the expert report prepared by Dr. Chris 9 Portier. The overarching question is whether these animal experiments provide a scientific basis to opine 10 that glyphosate causes cancer in rats and mice. A few critical characteristics of these studies require 11 careful consideration in addressing this question. Most crucially, the hundreds of individual tumor types 12 evaluated within each experiment across both male and female rodents make it virtually certain that 13 apparent "statistically significant" results will be observed for individual tumors that are in fact due to 14 nothing more than chance. This necessitates the use of common statistical methods that account for 15 multiple tests applied repeatedly to the same data. In addition, most of the tumor types are relatively uncommon, which warrants additional prudence in choosing appropriate statistical methods. In this 16 17 report, I outline these issues, discussing in Section III how they are managed in everyday statistical 18 practice. In Section IV, I apply the appropriate methods to the glyphosate rodent data and find no 19 evidence whatsoever of a glyphosate effect on the risk any of the tumors evaluated across these studies 20 after accounting for multiple tests. In Section V, I consider the discussion and results in Sections III and 21 IV in the context of Dr. Portier's expert report. Dr. Portier suggests that the glyphosate experiments do 22 provide some evidence of tumor risk among rodents. However, his statistical approaches are deeply flawed, leading him to overstate his findings and seriously misrepresent the data in aggregate. These 23 24 flaws would prove fatal in any peer review. Most significantly, the results from the animal experiments 25 that were highlighted by Dr. Portier were handpicked because of their "statistical significance", without 26 appropriately accounting for the large number of tests for other tumors that demonstrated no evidence of a 27 glyphosate effect. In addition, Dr. Portier violated conventional statistical practice in his use of historical 28 controls and in combining or "pooling" data from across several sources - using experiments carried out 29 during different years and in different laboratories under different conditions – without appropriately 30 accounting for these studies' unique characteristics. In Section V we illustrate these flaws and their 31 impact on Dr. Portier's conclusions.

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33 II. <u>RESUME AND QUALIFICATIONS</u>

I am a professor of Statistics, and head of the Department of Mathematics and Statistics at Utah State

35 University (USU) in Logan, Utah. I joined the faculty as an Assistant Professor at USU in 1999, after

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 4 of 82

receiving a B.S. in Statistics from USU in 1995 and a doctorate in Biostatistics from Harvard University
in 1999. I was tenured and promoted to the rank of Associate Professor in 2005, and then promoted to the
rank of Professor in 2011.

4 My research interests as a biostatistician focus largely on statistical methods for categorical data 5 analysis, including the analysis of proportions and counts. My dissertation and much of my subsequent 6 work has focused particularly on so-called exact methods for categorical data, developing software tools 7 for researchers that allow them to analyze proportions and counts using exact tests for previously 8 unaddressed study designs, including settings in which data are clustered or correlated (e.g., gestational or 9 developmental toxicology studies using rats or mice), or for large-scale studies of genetics and disease. 10 Much of this work has been funded by the National Institutes of Health, and implemented in the software 11 packages StatXact and LogXact through Cytel Software Corporation (Cambridge, MA). These packages have long been considered the industry standard for exact statistical analysis. 12

13 I have also served as a senior biostatistician for a number of large interdisciplinary research projects 14 focused on the epidemiology and genetic causes of complex disease, including Alzheimer's disease, cognitive decline among the elderly, hip fracture, autism, birth defects, and cancer. I have advised 15 16 collaborators about study design, data management, and data analyses and the appropriate application of 17 statistical methods, and I have either led or assisted with numerous manuscripts and presentations to 18 disseminate research results. This work has likewise largely been funded by the NIH. In all, the collective 19 extramural funding for these efforts has exceeded \$25 million. 20 I have been asked examine data from the rodent glyphosate feeding experiments, and to assess any

20 I have been asked examine data from the rodent glyphosate feeding experiments, and to assess any
21 evidence of potential compound-related effects on the incidence of mouse and rat tumors, and have been
22 compensated for this work at a rate of \$250/hour. Unless otherwise stated, all of my opinions are
23 expressed to a reasonable degree of scientific certainty. I reserve the right to amend or supplement my
24 report in response to any rebuttal by plaintiffs' experts or as new information becomes available. I have
25 not testified as an expert witness over the past 4 years. My curriculum vita is included as an attachment to

26 27 this report.

28 III. <u>STATISTICAL BACKGROUND</u>

The fields of health and medicine abound with questions that likewise often appear straightforward: What is the best diet for a healthy heart? Are men or women at higher risk for a particular disease? Does a new drug lengthen life for cancer patients? In collaboration with other scientists, a biostatistician's role is to design experiments that address these questions, and to contribute to the analysis of the resulting experimental outcomes or data. Proper statistical methodology has assumed an increasingly important role in health and medicine as research has become more evidence-based. This is largely because (1) data

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 5 of 82

are generally full of uncertainty and variation, particularly when we study complex diseases or other
 phenomena in humans or animals; (2) many questions in health and medicine have strong statistical
 overtones (e.g., How common is a disease? Who is most likely to contract it?); and (3) the comparison of

different treatments or potential risks relies heavily on statistical concepts – especially probability – in
both designing and analyzing experiments.

6 As an example, suppose we pose the simple question: Does a flu vaccine work? This could be 7 answered in part by considering a study of people who are randomly assigned to two groups, one 8 receiving the treatment and the other some sort of placebo. At the study's end, the flu rates between the 9 groups would be compared to assess whether the treated subjects experienced less flu than those on placebo. To continue the illustration, suppose such a study was designed with 20 patients in treatment and 10 11 20 in control (i.e., given placebo). Suppose further that we subsequently observe 0 flu cases (a 0% flu 12 rate) among those who are treated and 20 cases (a 100% flu rate) among controls. With such a dramatic difference between the respective flu rates, common sense and intuition would strongly suggest that the 13 14 treatment prevents flu.

On the other hand, suppose that this experiment alternatively results in 5 flu cases within the 15 16 treatment group versus 10 in control (25% flu rate for treatment versus 50% for control). While the observed flu rate in this scenario is likewise lower within the treatment group, we are clearly *less* certain 17 about declaring that the treatment works more generally. Why? Because it is more difficult to discern 18 19 whether this result demonstrates an advantage for treatment, or if it could be simply due to chance 20 variation between the people participating in the study. In other words, assuming that the vaccine does not 21 work at all, we would expect that the observed flu rates within the two groups would differ by chance, 22 much as we would expect that the number of heads we observe with 20 flips of a coin would be different 23 than the number we observe if we flipped the same coin an additional 20 times.

24 How can we quantify the possibility that an experimental result is due simply to chance? The role of 25 probability and statistics is especially critical in providing insight into this question. Common scientific and statistical practice involves designing an experiment with two competing hypotheses in mind. For a 26 27 study comparing different treatments or groups, the primary hypothesis - generally referred to as the null hypothesis – is that there is no difference between the groups. The competing or alternative hypothesis is 28 29 that there is a difference between the groups. At the end of the experiment, a probability is computed that 30 measures the evidence against the null hypothesis. This probability, called a *p*-value, represents the 31 likelihood of having observed the experimental result or data given that the null hypothesis is true. A 32 relatively smaller p-value therefore indicates that there is evidence *against* the null hypothesis, since it tells us that the data are unlikely, assuming that the null is correct. On the other hand, a relatively larger p-33

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 6 of 82

value provides no evidence against the null. The process of determining hypotheses and computing and
 interpreting a p-value based on resulting data is called a *hypothesis test*.

3 Two generally crucial issues with regard to testing a given hypothesis are (1) how the p-value is 4 computed, and (2) how the p-value is used to make a decision about the null hypothesis. With regard to 5 (1), even for relatively straightforward experiments, such as our hypothetical flu vaccine trial, there may 6 be multiple approaches available for computing a p-value, each of which has certain advantages or 7 disadvantages – these characteristics often depend on a specific study setting, and a biostatistician's role 8 is to evaluate the strengths and weaknesses of competing methods for any given experiment to ensure that 9 the data analysis is as accurate and reliable as possible. With regard to (2), the primary question is: How 10 small does a p-value need to be in order to determine that there is sufficient evidence against a null 11 hypothesis? A decision rule generally provides a cutoff against which the p-value is compared. For a 12 single hypothesis test, the scientific community over time has settled on a threshold of 5%, meaning that a 13 p-value less than 5% indicates sufficient evidence against the null, whereas a p-value greater than 5% 14 provides insufficient evidence. This threshold is called a *significance level*, and p-values below this level are referred to as "statistically significant". Another important role of a biostatistician is to ensure for any 15 16 given data analysis that the significance level is preserved. Any violation or inflation of the significance 17 level can result in greater likelihood of spurious conclusions, especially in declaring "significant" 18 treatment effects based on experimental results that are only due to chance.

19 IV.A Interpreting p-values in the presence of many hypothesis tests

20 The "p-value < 0.05" decision rule is relatively straightforward for a single experiment. However, the 21 role of the p-value has become more complicated in today's data-driven world. The fathomless ocean of 22 available data – generated from billions of dollars spent annually on research in health and medicine, and 23 from the sheer volume of electronic transactions and online activity, among other sources – along with the 24 relative ease of computing software for generating statistical analyses, necessitate some additional 25 prudence in interpreting p-values. Nearly every day, online or other media news sources tout claims about 26 an association between an exposure and an outcome, often with some implication of dramatic or broad 27 consequences for the public. Many of these results often do not hold up under additional scrutiny or 28 attempts at replication. How do these kinds of findings so readily find their way into the scientific 29 literature and popular press? Explanations may sometimes include inadequate study design or poor data, 30 but in our "big data" era the culprit is most often the amount of data available from large studies, or from 31 a large number of smaller studies that are examined simultaneously. The tendency of researchers, along 32 with scientific journals and other media venues, is a bias toward "positive" findings. This has led in turn 33 to an overreliance on p-values and statistical significance, at the frequent expense of context, especially in 34 underreporting or ignoring the large number of additional tests performed resulting in "negative" findings.

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 7 of 82

1 This issue is relatively straightforward to illustrate, given the application of hypothesis tests and p-2 values just described. Researchers can easily draw incorrect conclusions from an analysis of a large data 3 set when many associations are examined across a large number of hypothesis tests that each look for a p-4 value that is less than the conventional 5% significance level. Simply put, when multiple tests are 5 performed, "p-value < 0.05" outcomes will occur quite often even when there are no real effects. Note 6 that the p-value < 0.05 rule was developed relative to a single test. However, this logic breaks down when 7 multiple comparisons or tests are performed within a single analysis. With a 1-in-20 chance of a false 8 positive for a single test, we would expect to see about one false positive for every 20 tests that we 9 compute. In fact, it is straightforward to show using basic probability that there is a 64% chance of at least 10 one false positive among 20 independent tests, and a 99.4% chance of at least one false positive among 11 100 tests.

12 This so-called multiple testing issue and the general overreliance on p-values has been discussed and studied extensively within the statistics and epidemiology professions. These issues have likewise been 13 14 paid some considerable attention over the past several years in the popular media, especially given the many highly publicized findings that create an initial sensation but then fail to hold up under additional 15 16 study and experimentation. (As just a small sampling of this coverage, within the scientific literature see "Why Most Published Research Findings Are False" by JPA Ioannidis in *PLoS One*, "Statistical Errors: P 17 18 values, the 'gold standard' of statistical validity, are not as reliable as many scientists assume" by R 19 Nuzzo in *Nature*, and "Evolution of Reporting *P* Values in the Biomedical Literature, 1990-2015" by D 20 Chavalarais, JD Wallach, AHT Li, and JPA Ioannidis in JAMA. In the popular press see "Trouble at the 21 lab", "How science goes wrong", and "Metaphysicians" in the Economist; "Science Isn't Broken: It's just a hell of a lot harder than we give it credit for" at 538.com; "Striking results, little reliability" in the Los 22 23 Angeles Times; and "New Truths Only One Can See" in the New York Times.) 24 Statisticians have long warned against the practice of computing a multitude of p-values – especially

25 when applying arbitrary criteria to examine the same data in various ways – in order to identify positive associations. More recently, in response to this growing problem and the attention paid to it, our largest 26 27 and oldest professional organization, the American Statistical Association (ASA), took the unusual step in 28 2015 of producing "The ASA's Statement on p-Values: Context, Process, and Purpose" (The American 29 Statistician), under the direction of a committee comprised of some of our most respected colleagues. 30 Several underlying principles regarding p-values are briefly emphasized in the document. In particular, 31 the committee crystallizes the ongoing issues with multiple testing by noting that 32 *P-values and related analyses should not be reported selectively. Conducting multiple analyses of*

33 the data and reporting only those with certain p-values (typically those passing a significance

55 the data and reporting only mose with certain p-values (typically mose passing a significance

34 threshold) renders the reported p-values essentially uninterpretable. Cherrypicking promising

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 8 of 82

1 findings, also known by such terms as data dredging, significance chasing, significance questing,

2 selective inference, and "p-hacking," leads to a spurious excess of statistically significant results

3 in the published literature and should be vigorously avoided. One need not formally carry out

4 *multiple statistical tests for this problem to arise: Whenever a researcher chooses what to present*

based on statistical results, valid interpretation of those results is severely compromised if the
 reader is not informed of the choice and its basis. Researchers should disclose the number of

i reader is not informed of the choice and its basis. Researchers should discuss the number of
 hypotheses explored during the study, all data collection decisions, all statistical analyses

and how those analyses (including *p*-values) were selected for reporting.

- 8 conducted, and all p-values computed. Valid scientific conclusions based on p-values and related
- 9

10 11

12 Of course, none of this means that all science is unreliable, or that we should give up on experimentation

statistics cannot be drawn without at least knowing how many and which analyses were conducted,

13 altogether. The problem is not with research, generally, but with the overuse and misapplication of p-

values. The good news is that the same statisticians and scientists who have identified potential problems

15 with p-values have often also developed or proposed constructive and accessible approaches for

16 increasing the reliability of research results. In addition to the basic suggestions about disclosure quoted

above from the ASA report, a couple of the most common among the recurring recommendations include

18 (1) the use of multiple test corrections or what we call "false discovery rates" to adjust for a large number

- 19 of hypothesis tests; and (2) the reporting of actual effect sizes (in addition to p-values), along with
- 20 measures of uncertainty about the effect size.

21 With regard to (1), how does a biostatistician make sure that p-values < 0.05 for an analysis involving 22 many tests are not merely due to chance? This is generally accomplished by first assessing the number of 23 tests that need to be carried out, and then by computing the individual p-values using a method that 24 accounts for the number of tests. This kind of multiple testing method will yield a set of p-values that can 25 then be individually compared to the 0.05 testing level to identify truly significant findings. Such multiple 26 testing methods are readily available in any one of the most widely-used statistical analysis software packages, and are illustrated in the large number of dedicated multiple testing textbooks and manuals. 27 28 These methods are taught as a matter of course within many university statistics curricula. In particular, so-called stepwise or closed testing procedures can be readily applied to a set of many p-values computed 29 30 in a given analysis, adjusting the p-values to preserve the false positive rate not only for the individual tests but for any combination or subset of null hypotheses under consideration. While several options are 31 32 available, the so-called False Discovery Rate (FDR) approach has been increasingly recommended and 33 used in statistical practice.

34 IV. ASSESSING THE GLYPHOSATE FEEDING EXPERIMENTS

35 Section III broadly outlined some of the crucial statistical issues that are highly relevant to the rodent

36 glyphosate feeding experiments and to the analysis provided in Dr. Portier's expert report. Most

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 9 of 82

importantly, given the dozens of tumor types evaluated for both male and female rodents across the
twelve studies we are considering, some sort of multiple comparison correction is imperative to avoid a
very serious problem with false positives. In this section, we consider these issues in analyzing the rodent
data, and summarize the results. In the next section we discuss these results in light of Dr. Portier's
conclusions.

6 The available data come from 12 different experiments (7 using rats and 5 using mice) in which
7 rodents were randomized – males and females, respectively – to increasing doses of glyphosate, then

8 examined after their natural lifespan or at a pre-specified limit and evaluated for the presence of many

			Glyphosate Doses (mg/kg bw/day)		# Typ ≥1 obs	es w/ served	# Typ ≥ obse	es w/ 3 rved
Study	Year	Strain	MALE (M)	FEMALE (F)	м	F	М	F
Lankas	1981	SD	0, 3, 10, 32	0, 3, 11, 34	51	68	19	28
Stout	1990	SD	0, 89, 362, 940	0, 113, 457, 1183	45	44	17	14
Atkinson	1993	SD	0, 11, 112, 320, 1147	0, 12, 109, 347, 1134	46	35	15	11
Enemoto	1997	SD	0, 104, 354, 1127	0, 115, 393, 1247	53	37	20	12
Suresh	1996	Wistar	0, 6, 59, 595	0, 9, 89, 886	50	41	15	11
Brammer	2001	Wistar	0, 121, 361, 1214	0, 145, 437, 1498	45	44	14	15
Wood	2009	Wistar	0, 86, 285, 1077	0, 105, 349, 1382	52	40	16	14

Table 1: Summary of 7 rat glyphosate feeding experiments.

	-		Glyphosate Doses (mg/kg bw/day)		# Typ ≥1 obs	es w/ erved	# Typ ≥ obse	es w/ 3 rved
Study	Year	Strain	MALE (M)	FEMALE (F)	М	F	М	F
Knezevich	1983	CD-1	0, 157, 814, 4841	0, 190, 955, 5874	57	98	16	32
Atkinson	1993	CD-1	0, 98, 297, 988	0, 102, 298, 1000	25	27	9	13
Sugimoto	1997	CD1	0, 165, 838, 4348	0, 153, 787, 4116	23	31	6	10
Kumar	2001	Swiss	0, 15, 150, 1453	0, 15, 151, 1467	19	30	8	10
Wood	2009	CD-1	0, 71, 234, 810	0, 98, 300, 1081	21	34	9	11

Table 2: Summary of 5 mouse glyphosate feeding experiments.

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 10 of 82

1 specific tumor types. These studies are summarized in Tables 1 and 2 (the totals given in these tables

2 exclude cases where proportionally few mice or rats were apparently evaluated for a given tumor type, as

3 the limited number of animals evaluated may reduce the interpretive value of the results to such a degree

4 as no conclusions may be drawn). There are two critical questions to address in evaluating the collective

5 evidence of a possible glyphosate effect on tumors among rodents. First, how do we evaluate the dose-

6 response effect of glyphosate on a single tumor type? Second, how do we account for many dose-

7 response analyses across multiple tumor types?

8 In answer to question 1, the most commonly used tool for assessing a dose-response effect is the 9 Cochran-Armitage trend test. In the context of the rodent feeding experiments, this approach provides a pvalue to test the null hypothesis of no dose effect on tumor rate versus the alternative hypothesis that the 10 11 tumor rate increases with increasing dose. This trend test is generally applicable to any experimental data 12 where subjects are randomized to increasing doses of some drug or other intervention, and then observed to experience (on average) an increasing or decreasing percentage of subjects who experience the 13 14 outcome of interest. As with much of the analysis provided by Dr. Portier, these results are based on a one-sided exact trend test - "one-sided" in that we are testing the trend in only one direction for a given 15 16 tumor, and "exact" in that we are using the actual probability distribution under the null hypothesis, 17 instead of a normal or bell-curve approximation (also called the "approximate" or "asymptotic" trend 18 test). The exact test is recommended when outcomes of interest are not common, which is often the case 19 across the glyphosate experiments.

20 What motivates this recommendation, and why does it matter whether we use the exact or 21 approximate p-value? While it may seem like a statistical technicality, the choice turns out to be germane 22 to the glyphosate rodent carcinogenicity question. The International Agency for Research on Cancer 23 (IARC) monograph on glyphosate used the approximate p-value to conclude that results from the 24 Knezevich experiment (included in Table 2) implicated glyphosate as a cause of kidney adenomas among 25 male mice, based on their reported approximate trend test p-value of 0.034 (without adjusting for multiple tests). However, the exact one-sided test – subsequently reported by Dr. Portier in other material and 26 27 ultimately his expert report – yields a p-value of 0.062 for these same data. The discrepancy between the approximate and exact p-values in this case illustrates why the former should be avoided when tumor 28 29 incidence is low. It turns out that the approximate p-value is an estimate of the actual or exact p-value, 30 and tends to be more accurate when the overall sample size is relatively larger and when relatively more 31 investigative events (in this case, tumors) are observed. In general, approximate p-values tend to 32 *underestimate* the exact p-values they are supposed to estimate. When sample sizes and numbers of observed outcomes (such as tumors) are relatively large, this underestimation may not be consequential. 33 34 However, in cases like the glyphosate feeding experiments – where tumors are relatively less common –

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 11 of 82

1 the inaccuracy of approximate p-values when they are used can lead to a significant increase in the

2 number of false positives. In other words, because the approximate test tends to underestimate the exact,

3 we will see more "p-value < 0.05" results with the approximate test when there is actually no dose-

4 response effect. This can lead to serious exaggeration of the evidence in favor of trend effects.

5 Given the large relative error of this normal approximation for the Knezevich data, one might wonder 6 why anyone would ever use it. Normal approximations in applied research had much greater utility before 7 the widespread availability of powerful computing tools. Without some sort of special calculator or 8 software, a normal probability is relatively much easier to compute than an exact probability. Even now, 9 some analyses of counts and proportions rely on more sophisticated statistical models for which the exact 10 distribution is prohibitively difficult to compute, and so some form of normal approximation can still be 11 useful. However, for many experiments – particularly controlled experiments such as the glyphosate 12 mouse studies – exact p-values can be computed instantaneously with a desktop computer, and no approximation is needed, even in cases where the sample sizes and counts are sufficiently large to justify 13 14 such an approximation.

Given appropriate computation of the trend test p-value, the second necessity is accounting for the 15 16 many dose-response analyses across multiple tumor types. As discussed earlier in Section III, the False 17 Discovery Rate (FDR) approach recommended by Ioannidis and others is particularly useful for these 18 data. It is a less conservative adjustment that is recommended in settings where there are hundreds or even 19 thousands of p-values under consideration. Of all multiple testing options available in this setting, the 20 FDR approach minimizes the chance that we would fail to detect an actual glyphosate-related effect. It 21 should be noted that an FDR adjustment could and should be used for any set of p-values computed to assess potential glyphosate effects on tumor incidence, including any pairwise comparisons made 22 23 between the tumor rates of two dose groups. Such two-group comparisons are not reported here as Dr. 24 Portier's conclusions do not appear to rely upon them, but the same multiple testing problem applies, and 25 even more so: in an experiment with four dose groups, respective comparisons of the three treatment groups to control can yield up to three p-values – as opposed to one trend test p-value – for each tumor 26 27 type.

Trend test results for the 7 rat studies are summarized by the tables shown in Appendix A, and results for the 5 mouse studies are similarly summarized in Appendix B. Each table contains exact one-sided pvalues for each study, reported by tumor type and sex, testing specifically for evidence of increasing tumor probability. In addition, for those p-values < 0.05 reported and highlighted in Appendix A and Appendix B, a multiple testing FDR adjustment is applied and reported in the table shown in Appendix C. As shown in Tables 1 and 2, of the hundreds of individual tumor types evaluated across all 12 experiments, 1,016 were observed in at least one mouse or rat. Among rats, there were 13 trend test p-

1 values < 0.05 when testing for increasing incidence of each tumor, without accounting for the false 2 discovery rate. Among mice, there were 7 such trend test p-values < 0.05 without accounting for the false 3 discovery rate. All of these are highlighted in blue for easy identification in the tables contained in 4 Appendices A and B. Note that – assuming no effect of glyphosate on tumor incidence – we would 5 conservatively expect about 5% of all individual trend tests to yield p-values < 0.05 only by chance. This 6 would represent about 51 p-values < 0.05 out of the 1,016 individual cancer types for which at least one 7 tumor was observed. However, it makes sense to consider those cancer types for which three tumors were 8 observed. Given the typical study design of four dose groups with approximately 50 animals per dose, 9 about 3 tumors in total are necessary for an exact one-sided p-value no greater than 0.05. Given 345 10 tumor types across the 12 rodent studies with at least 3 observed tumors (as summarized in Tables 1 and 11 2), assuming no compound effects we would expect roughly 17.3 p-values < 0.05. In other words, given 12 the 20 observed p-values < 0.05, the overall results are entirely consistent what we should observe given 13 no compound-related effect on tumor incidence. This is analogous to flipping a coin 345 times that has a 14 5% probability of heads, and observing 20 heads with an expected number of 17.3. This result is highly likely: there is actually about a 62.5% chance of observing this many independent p-values < 0.05 relative 15 16 to the expected proportion, given no compound-related effects.

In addition, when computing the trend test p-values to account for the false discovery rate, not one of the 1,016 tests is statistically significant. FDR-adjusted p-values for all tumor types with individual trend test p-values < 0.05 are summarized in Appendix C, and not one has a value even marginally close to 0.05. (Note that adjusting for multiple tests always increases the p-value, so that there is no need to report FDR adjustments for any individual trend test results with p-values > 0.05.) There is no statistical evidence whatsoever that glyphosate increases the risk of any of the tumors examined across these 12 studies.

24 I would emphasize that the results summarized above correspond to a one-sided test that only 25 evaluates the hypothesis that increased glyphosate exposure is associated with an increased rate of tumors - what we would refer to as a *positive* association. However, the data may also be analyzed to evaluate a 26 27 negative association - that is, a decreased tumor rate as glyphosate exposure increases. In fact, it turns out 28 that the one-sided p-values for testing negative effects can simply be computed as 1.0 minus the one-sided 29 p-values reported in Appendices A and B. In other words, any p-value reported in Appendices A and B 30 that is larger than 0.95 represents a p-value < 0.05 for testing for a negative association. There are 13 such 31 outcomes, as summarized in Appendix D (additionally adjusted for the false discovery rate). Again, as 32 with the tests for positive associations, we would expect 5% of all 345 tumor types with at least three observed tumors to likewise yield one-sided p-values < 0.05 when testing for *negative* associations. The 33 34 13 such results are again entirely consistent with this expected proportion: there is actually about a 24.5%

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 13 of 82

chance of observing this many independent p-values < 0.05 relative to the expected proportion, assuming
 no compound-related effect.

Finally, I have also been made aware of a statistical reanalysis carried out by Dr. Klaus Weber of data
from Kumar mouse study. I have evaluated the reported data used by Dr. Weber. Some of the reported
tumor counts differ slightly from the data reported in Greim. My own analysis indicates that utilizing the
data tables reported by Dr. Weber does not substantively change my conclusions. I have included my
results both based on the Kumar data as reported in Greim, et al, and the data reported by Dr. Weber (see
Appendix B, Tables B.5 and B.6).

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10 V. <u>RESULTS FROM DR. CHRIS PORTIER'S EXPERT REPORT</u>

11 Given that the 1,016 p-values computed across all 12 studies yield nothing more than the expected pattern 12 of false positives given no effect from glyphosate exposure, Dr. Portier nevertheless most recently asserts 13 that there is sufficient evidence glyphosate increases the risk for a handful of cancers, including liver 14 adenomas, thyroid C-cell adenomas and carcinomas, skin keratocanthomas, and kidney adenomas in male rats; mammary gland adenomas and adenocarcinomas in female rats; hemangiosarcomas, kidney tumors, 15 and lymphomas among male mice; and hemangiomas among female mice. His analysis unfortunately 16 17 would certainly not pass the scrutiny of any meaningful peer review, and could actually be used as an 18 excellent case study in any university statistics course to illustrate the misappropriation of p-values. Most 19 critically, virtually any experienced statistician reviewing Dr. Portier's work with the animal data would 20 see immediately that his approach has led to a very serious multiple testing problem. Dr. Portier's analysis 21 is entirely dependent on p-values, arising from three types of computations: those for individual tumor types by gender across each specific study (handpicked from among the more complete results contained 22 23 in Appendix A and Appendix B of this report), those that incorporate additional "historical control" data, 24 and those that "pool" data from across studies for a given tumor type. Dr. Portier provides a patchwork of 25 p-values from across these three sources, reporting significant findings (for increased risk, only) wherever and in whatever manner they are found in order to manufacture a pattern implicating glyphosate. 26 27 While the multiple testing problem overarches all of these p-values, there are additional chronic flaws 28 with his use of historical controls and pooling procedures that need to be illustrated separately. These 29 three issues – multiple testing, historical controls, and pooling of data sets – are correspondingly 30 addressed in Sections V.A-V.C. Section V.D subsequently summarizes how the conclusions in Dr. 31 Portier's report have evolved from his prior work.

32 (V.A) The Use and Interpretation of P-Values

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 14 of 82

1 Given the large number of animal tumors under investigation here, any analysis should consider the 2 concerns and recommendations of statisticians and researchers about the use and misuse of p-values, as 3 discussed in Section III. Unfortunately, Dr. Portier does not consider or apply even one of the common or 4 recommended remedies for this problem. In his tables summarizing results for individual rat and mouse 5 studies, he includes only what he terms as "Tumors of Interest", which appear to be selected primarily on 6 the basis of their statistical significance within at least one of the several studies. His report makes no 7 effort to directly adjust p-values for multiple comparisons, for example by using the false discovery rate 8 approach recommended by experts in the profession. This is in spite of Dr. Portier's brief comment on 9 page 40 of his expert report that "an adjustment for multiple comparisons is indeed warranted in 10 evaluating the outcomes of these studies."

11 The only other mention of the multiplicity problem is the inclusion of Table 15, which Dr. Portier 12 constructed in response to comments submitted last year to the EPA by Dr. Joseph Haseman. Dr. Portier 13 has used Haseman's tally of the expected number of false positives as a basis for demonstrating that there 14 are more significant results among male CD-1 mice than would be expected by chance, given no glyphosate effects. A couple of critical differences in Dr. Portier's approach account for his findings. 15 16 First, Haseman bases his own expected false positive number on the number of tumors for which there are 17 at least 3 observed cases (roughly the number required for a possibility of a p-value < 0.05). Haseman 18 confined his estimate to sites with three tumors based on the use of an exact one-sided p-value, given that 19 the study designs used for the glyphosate feeding experiments generally cannot yield a p-value < 0.0520 unless at least three rodents are observed with a given tumor type. However, Dr. Portier is including his 21 historical control test, which (while not validated, as illustrated in the following section) can yield pvalues < 0.05 for *observed* tables that contain only two tumors. For example, the Sugimoto 22 23 hemangiosarcoma figures in male mice (0/50, 0/50, 0/50, 2/50) generates an exact one-sided trend test p-24 value of 0.062, which is > 0.05. When reanalyzed by Dr. Portier using historical controls his resulting pvalue (what he refers to as " P_{Hist} ") is 0.004, which is < 0.05. In other words, when he incorporates 25 26 historical controls he is able to generate a p-value < 0.05 for smaller numbers of tumors in the observed 27 table. In addition, since he appears to be counting either trend test result with a p-value < 0.05, or a "P_{Hist}" 28 result < 0.05, as "positive," he is at least doubling the number of observed tests among those tumor types 29 for which historical control data are available. These uses of historical controls explain the disparity in Dr. 30 Portier's Table 15 between what is observed and what is expected relative to statistically significant findings among male CD-1 mice. 31

However, in addition to that, such a comparison of observed and expected – while interesting for
 exploratory purposes – does not directly address the more pressing question: is there evidence of a
 compound-related effect with respect to any *specific* cancer type? The answer in part requires multiple

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 15 of 82

testing adjustments to individual p-values, such as the false discovery rate approach we use for both the rat and mouse studies. As reviewed in Section III, other recommendations for balancing the overuse of pvalues include full disclosure of all tests performed, and the estimation of actual effect sizes along with measures of effect size variability (such as confidence intervals). Dr. Portier uses neither of these approaches.

6 (V.B) P-values Using Historical Controls

The quantitative use of historical controls for the sake of establishing treatment effects within a given 7 statistical analysis is not universally accepted in experimental research. Many researchers view historical 8 9 controls at best as a means of laboratory quality control (to check consistency of outcome rates) or as a 10 qualitative measure before reaching any determination of causation. However, even if the historical data are judged by study toxicologists to be comparable and potentially useful for inclusion with new 11 12 experimental data, any statistical analysis needs to be carefully planned and conducted to ensure that p-13 values are computed appropriately. Dr. Portier's expert report helps to illustrate why. He argues that we 14 can compare prior experimental results for unexposed rats or mice to what we observe among treated 15 rodents in a given experiment. Particularly for rare or uncommon events, such as the cancer types 16 investigated for the glyphosate experiments, it may appear compelling or interesting when the number of 17 tumors observed in a treatment group is markedly higher than what we would expect given the average 18 control rate in prior experiments. However, the approach not only is not helpful for this particular 19 analysis, but is fundamentally inaccurate and is moreover applied inconsistently by Dr. Portier. 20 Most critically, underlying response rates almost always vary across different experiments, even when 21 those experiments are studying the same outcomes but using different samples at different times and in 22 different settings or laboratories. Even for the best or most consistently controlled studies, there are 23 underlying factors inherent in the sampling, the methods, the environment, and so forth, that can 24 significantly affect the likelihood of response. This is why, for example, statisticians account for study 25 differences or heterogeneity when combining data from different experiments or study sites (as discussed 26 more extensively in the following section – Section V.C – in the context of Dr. Portier's "pooled" 27 analyses).

Dr. Portier illustrates this with an example on page 28 of his report. In this case, he uses historical controls to assess hepatocellular adenoma in the Wistar rats studied by Brammer, and cites results from l6 historical control groups with an underlying range in adenoma rates of 0% to nearly 18%. This relatively wide range in adenoma rates, across studies using the same genetic strain of rat, is a perfect example of how significantly these outcome rates can vary between experiments. However, Dr. Portier's solution is simply to apply the average rate of 4.3% across the 16 studies to the results of the Brammer

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 16 of 82

experiment, which yielded 0/53, 2/53, 0/52, and 5/52 male rats with liver adenomas across the four
respective dose groups. Although Portier appears to dismiss the possibility, it is entirely possible that the
Brammer sample actually *did* have an underlying liver adenoma rate nearer to 18% than to 0%. In that
case, observing 7 liver adenomas out of 210 mice would not be at all remarkable. Because Dr. Portier
failed to formally account for the potential range of historical control tumor rates when generating his test
statistic, his resulting p-value is flawed.

7 Even assuming justification for including historical controls in his analysis (i.e., the historical controls are sufficiently consistent with the given feeding experiment data), Dr. Portier's approach is deeply 8 9 flawed, and alarmingly inconsistent even with the recommended statistical methods cited within his own 10 sources. He appeals on page 21 of his expert report to four references as "guidelines" (numbers 30, 33, 11 34, and 66 in his citation list). The first three provide an exceptionally thin foundation for such a key 12 aspect of Dr. Portier's analysis: the first is somewhat of a self-reference (the preamble to the IARC 13 glyphosate monograph, written by a group chaired by Dr. Portier), and the second and third are regulatory 14 references specific to the EPA and the European Chemicals Agency. The fourth is an expository article authored by Dr. Joseph Haseman in an environmental health journal – the only one of the four references 15 16 that outlines specific statistical methodology for incorporating historical controls. The Haseman paper describes the heterogeneity problem described above – the tendency of different study samples to have 17 18 significantly different tumor rates – and proposes a sensible modeling method that accounts for these 19 differences. Dr. Portier offers no explanation for why he fails to use this approach, in spite of his citing 20 the paper in which it was suggested. Moreover, there are other references in the statistical literature that 21 specifically address the problem of incorporating historical controls. For example, Fung et al (*Canadian* Journal of Statistics, 1996), Greim et al (Human & Experimental Toxicology, 2003), and Peddada et al 22 23 (Journal of the American Statistical Association, 2007), among others, all offer overviews and options for 24 a proper analysis using historical controls – none of them mentioned or utilized by Dr. Portier, in spite of 25 his citing these articles in a recently published commentary (Portier and Clausing, 2017). The common principle underlying all of these methods is the need to account for differences in underlying tumor rates 26 27 for controls drawn from a variety of experiments. As explained more fully in the following section, the 28 general consequence of not properly adjusting for such differences is underestimation of p-values, which 29 leads to inflation of p-values < 0.05 and "statistically significant" findings due to nothing more than 30 chance. Given the hundreds of tumor types under consideration across the glyphosate rodent experiments, 31 this is a problem that should be meticulously avoided. 32 Aside from his completely incorrect analysis, the p-values computed by Dr. Portier using historical

Aside from his completely incorrect analysis, the p-values computed by Dr. Portier using historical
 controls do not change any of the substantive conclusions of the analysis, since Dr. Portier neglected to
 account for the enormous multiple testing problem. Even when the corresponding trend test p-values in

Tables A1–A7 and B1–B5 of this report were replaced by Dr. Portier's historical control-based results
and then adjusted with respect to the false discovery rate, none of them was significant. In addition, Dr.
Portier neglects to explain why he selectively highlights tests using historical data – there were apparently
many other tumor types for which historical control data were available but not used. It appears that such
results were reported by Dr. Portier primarily if they resulted in a p-value < 0.05.

6 (V.C) P-values From "Pooled" Analyses and Interpretation of Results Across Studies

7 Given the multiple testing problem and the relative rarity of most all of the cancer types, there would seem to be some impetus to attempt combining data from across studies. Aggregating the sample size and 8 9 tumor counts could potentially increase the likelihood of observing a compound-related effect, if any such 10 an effect exists. Dr. Portier's attempts to accomplish this through his "pooled" analyses are nevertheless completely unreliable. His analysis and comparative interpretations across the various experiments 11 12 disregard conventional statistical practice in several fundamental and egregious respects, and his approach 13 is ad hoc and inconsistently applied, without any kind of systematic analysis plan across the available 14 studies or tumor types.

First and most critically, Dr. Portier's "pooled" procedures flout statistical standards by making no adjustments at all for differences between experiments or for the similarities among mice within each study. Dr. Portier simply aggregates data across various subsets of rat and mouse studies, treating rodents born and raised in different environments, fed from different sources, measured using different tools by different researchers over a 30-year span as though they were all included within a single experiment at the same time. This is an astonishing violation of accepted practice that would serve as an example in any relevant college class of how not to combine data from different sources.

22 Generally speaking, any combining of data across experiments such as those considered here requires 23 that (1) the experiments are comparable enough in terms of their measurements and conditions to justify 24 their inclusion in a combined analysis; and (2) if the studies are sufficiently comparable, some adjustment 25 is made for similarities or correlation of subjects within each study, as well as for differences in treatment 26 effects that are often observed. Addressing (1) is a primarily qualitative first step that usually relies on 27 some consensus among collaborating investigators with complementary expertise, who assess the 28 admissibility of available studies in terms of their comparability (e.g., that they consistently measured 29 outcomes and administered treatment doses). Without such strong justification, any attempt to 30 quantitatively combine the data from the individual studies can be unreliable. Dr. Portier has provided 31 very little information in his report about how he conducted such a review – for example, describing 32 consultations with other collaborators or sources about whether pathologies were examined consistently 33 for the handful of tumors types that he selected for his pooled analyses.

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 18 of 82

1 Putting aside the lack of a qualitative review, the "pooling" approach used by Dr. Portier to simply 2 combine data from different studies – as though they arose from the same experiment – is completely 3 inappropriate and incorrect. The underlying principle in any analysis that combines data from independent 4 studies is that the studies themselves – carried out at different times and in different settings – may be 5 distinct in ways that may or may not be measurable. These differences, often referred to in experimental 6 research as sample or study *heterogeneity*, need to be considered within the statistical analysis in order to 7 avoid bias when computing p-values. Why is this so crucial? There are two reasons to account for study 8 differences. First, ignoring them often leads to an increased chance of a false positive result. To illustrate, 9 consider an example where we have access to data for a flu vaccine that was administered to 10 large 10 nuclear families, with 5 family members in each home. For the sake of illustration, suppose that the 11 members within each of these families – for one reason or another – have the exact same response to the 12 vaccine. In other words, if one member of a given family responds to the vaccine, then *all* family members respond. If one does not respond, then neither to any of the other family members. Although 13 14 there are 50 total individuals enrolled in this study, our *effective* sample size is only 10. In other words, 15 one family member from each home is sufficient. The other 4 give us no additional information about the 16 treatment effect, and are statistically redundant. From a statistical standpoint, naively assuming that all 50 individuals are somehow independent could lead to significant underestimation of the p-value testing the 17 18 vaccine effect, making a false positive much more likely.

19 This example is obviously extreme. In practice, we would seldom (if ever) observe that kind of perfect 20 correlation among data from a given study site or experimental source. However, in any analysis of data 21 from multiple sites or experiments, some appreciable correlation within each will exist due to variations 22 in the different sampling populations or experimental conditions. This heterogeneity will result in at least 23 some effective reduction of the sample size, in proportion to the strength of the correlation between 24 subjects within each study. Suppose that we ignore those study differences by simply aggregating the data and analyzing them as though they all came from the same experiment, as Dr. Portier has done. Then p-25 26 values computed to test overall treatment effects will be inaccurate. Generally speaking, they will be too 27 small, leading researchers to overstate any evidence of a treatment effect.

The second reason to assess and account for study differences is that the treatment effect often differs between the individual studies, both with respect to the size and even the direction of the effect (e.g., increasing or decreasing trend). Another crucial step in combining datasets is to compare the effects across studies, to understand how they are either alike or different with respect both to their direction and magnitude. This typically involves some estimation of effect sizes, along with additional formal statistical comparisons to ensure that the effects are consistent before any data from across the various studies are pooled. Treatment effects in dose-response experiments are often summarized using an odds ratio or

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 19 of 82

1 relative risk, which in the case of the glyphosate experiments would estimate the relative increase or 2 decrease in the odds or risk of tumor for some given increase in glyphosate dose. For example, the so-3 called logistic regression model that is used extensively by researchers across numerous fields 4 (particularly in biomedicine) allows researchers to estimate such odds ratios in ways that can examine 5 whether the estimated odds ratios are consistent across experiments. A logistic regression can help an 6 investigator to make a reasonable judgment about whether the observed results – expressed as odds ratios 7 relative to glyphosate dose – in two or more different experiments are significantly different. This is a 8 crucial assessment in any combined analysis that statisticians use to decide whether they are justified in 9 estimating a "common" or averaged effect across all of the studies. The important point is that such 10 methods are generally applied as a matter of course in this kind of analysis, although they are not used at 11 all by Dr. Portier.

12 In short, Dr. Portier has apparently made no reasonable effort to address study heterogeneity, either 13 with respect to the correlation of rodents within study or to differences in dose-response effects across 14 studies. The seriousness of this flaw cannot be overstated. In addition to his failure to account for the way that mice and rats are correlated within the individual studies, Dr. Portier has combined data from 15 16 different sources without regard for the magnitude or direction of observed effects within groups. At a 17 minimum, by failing to account for within-study correlation, Dr. Portier has underestimated the actual p-18 values – hence overstating the evidence (and increasing the chance for a false positive result) – for those 19 tumor types that he has selected for "pooled" analyses. Moreover, relying only on p-values for these 20 "pooled" analyses, even if they correctly account for study heterogeneity, masks study differences in 21 ways that can seriously undermine any possible understanding of potential compound-related effects. I know of no available applied statistical text or handbook that touches on this topic that even entertains the 22 23 possibility that an analyst would simply combine data from various experiments as Dr. Portier has done, 24 without carefully examining and accounting for study differences. His approach can only be described as 25 naïve at best, and deliberately misleading at worst.

Interestingly, Dr. Portier provides two citations (numbers 92 and 93 in his report) that he uses to 26 27 justify his combined analyses, and that provide some guidance about how he should conduct them. They are expository articles from epidemiological journals, and – while not statistical sources, strictly speaking 28 29 - both provide general information about how to analyze data from different sources, consistent with the principles summarized above. Both emphasize the importance of evaluating and accounting for study 30 31 heterogeneity to avoid bias in statistical inference, and both recommend the use of logistic regression 32 models to estimate treatment effects between studies and to assess whether those effects differ significantly. Neither of these sources mention the option of aggregating data in the way that Dr. Portier 33 34 has done. On the contrary, one of them suggests that study heterogeneity should conservatively be

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 20 of 82

1 assumed even if there is statistical evidence that it does not exist. Dr. Portier astonishingly and

2 inexplicably ignores all of this information within his own sources.

3 How does this enormous oversight specifically compromise Dr. Portier's conclusions? As just one 4 example among his several pooled analyses, consider Dr. Portier's assessment of liver adenomas among 5 rats. Relying only on his personal qualitative judgment, and without any formal statistical justification, 6 Dr. Portier chose to focus only on studies using Wistar rats (including the Brammer, Suresh, and Wood 7 studies in Table 2), and to ignore female rats altogether. (If a logistic regression model was used, the 8 analysis could readily include the other four rat studies as well as all female rats, easily accounting for 9 any possible differences between the genetic strains and genders.) The Brammer study observed counts of 10 0/53, 2/53, 0/53, 5/52, with a trend test p-value of 0.008 and an FDR-adjusted trend p-value of 0.370. 11 Note that the Suresh study resulted in 24/50, 22/50, 10/48, and 21/50 liver adenomas across the male dose 12 groups, an increasing trend that was not statistically significant (trend p-value = 0.391; FDR-adjusted 13 trend p-value = 0.715). The Wood study resulted in 0/50, 2/51, 1/51, and 1/51 liver adenomas across the 14 male dose groups, a weak increasing trend that was also not statistically significant (trend p-value = 0.418; FDR-adjusted trend p-value = 0.839). Even after excluding the other rat studies, along with any 15 16 results for females, in an argument spanning pages 32 and 33 of his report, Dr. Portier first suggests 17 pooling the Brammer, Wood, and Suresh liver adenoma data for male rats, and then arbitrarily excludes 18 the Suresh study because of its higher overall rate of liver adenomas (based again only on personal 19 judgment, without any formal statistical analysis). Dr. Portier then combines the data from Brammer and 20 Wood into a single table to produce a single trend test p-value, that he concludes demonstrates evidence 21 that glyphosate increases incidence of liver adenomas. Dr. Portier takes the same approach with 22 mammary tumors, combining only the data from Brammer and Wood, in order to generate a p-value < 23 0.05. However, he then elects to combine data from all three studies in order to obtain a p-value < 0.0524 with respect to skin keratocanthomas. Notably, he reports that using only Brammer and Wood for skin 25 keratocanthoma does not generate a "statistically significant" p-value. This appears to be a straightforward case of the "p-hacking" phenomenon discussed earlier in Section III, as he offers no 26 27 empirical justification for how he chooses to include or exclude the Suresh study from these additional 28 analyses. 29 Unfortunately, Dr. Portier's arbitrary and incorrect analysis renders his resulting "pooled" p-value 30 entirely meaningless. Accounting for heterogeneity and estimating study-specific effects, as 31 recommended by Dr. Portier's own sources, my own analysis of the liver adenoma data first demonstrated 32 definitively that there is highly significant correlation among rats within each study (using an exact test for correlation in the StatXact software package). In addition, using a logistic regression model to 33 34 estimate observed effects, I found that the Brammer study indicates an odds ratio (OR) of 1.21 with

1 respect to an increased dose of 100 mg/kg (meaning a 21% increase in odds of liver adenoma for every 2 additional 100 mg/kg bw/day). The Wood study resulted in an estimated OR of 1.01 (only a 1% increase 3 in the odds of liver adenoma for an increased dose of 100 mg/kg), and the Suresh study also resulted in an 4 estimated OR of 1.01. Moreover, the logistic regression revealed that there is a highly statistically 5 significant difference in observed effects between the three studies – specifically, the effect observed in Brammer is higher than the effects observed in the Wood and Suresh data. In other words, Dr. Portier 6 7 included two of the three studies in his "pooled" analysis that actually are demonstrably different with 8 respect to glyphosate. This further invalidates Dr. Portier's "pooled" p-value for evaluating a common 9 potential effect across studies, which he computed using the Brammer and Wood data. Nevertheless, 10 aggregating the two datasets, without accounting for these potentially serious differences between the 11 underlying adenoma findings, Dr. Portier reports a significant "pooled" finding that is entirely driven by 12 the Brammer data. He implies that this somehow makes the result more convincing, which is a logical leap equivalent to combining a gallon of paint with a gallon of paint thinner, and then selling the product 13 14 as two gallons of paint. In addition to this conspicuous and fatal problem, Dr. Portier takes a highly inconsistent approach with 15 16 his "pooled" analyses that appears to focus primarily on achieving statistical significance. He "pools" and 17 "re-pools" rat and mouse data (always ignoring study heterogeneity), using different combinations of 18 studies without any predefined strategy or logical criteria. Dr. Portier's "Joint Analysis" of the mouse 19 studies on pages 45-47 of his expert report is a particularly confusing and ad hoc jumble. To summarize 20 the arbitrary and incongruous nature of his approach: 21 Dr. Portier proposes that the only neoplasms that he needs to examine for combined or "pooled" 22 analyses are the five for which at least one of the four CD-1 studies resulted in a statistically 23 significant finding. Why the dozens of others should be ignored is not explained. At the very least, 24 Dr. Portier is compounding the grievous multiple testing problem discussed earlier, since the

significance of the "pooled" trend test p-values that he reports are driven entirely by the five 25 26 individual statistically significant results. A more systematic analysis would combine data from 27 across studies for each tumor type (assuming that the tumor types are consistent, and appropriately accounting for study heterogeneity); estimate a common observed effect for each tumor type, along 28 29 with measures of statistical significance (including p-values and confidence intervals), assuming that the effect is consistent across studies; and finally account for multiple comparisons (e.g., adjust for 30 31 the false discovery rate) among the set of resulting p-values. However, conducting such a systematic 32 analysis would still need to be preceded by a sound qualitative toxicological analysis to ensure that 33 the studies are comparable, as discussed at the beginning of Section V.C.

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 22 of 82

1 After confining himself to the CD-1 studies, Dr. Portier alternatively combines the two 18-month 2 studies, the two 24-month studies, and then all four studies together, and then for each tumor type 3 simply bases his conclusions on the one of those three that results in statistical significance. For 4 example, in the summary of his findings, he claims there is evidence that glyphosate "causes" kidney 5 tumors, after pooling all four CD-1 studies. However, he also claims there is evidence that glyphosate 6 "causes" malignant lymphomas, conveniently based on the result from "pooling" only the two 18-7 month studies, even though there is no statistically significant effect when all four CD-1 studies are 8 used. This is internally inconsistent and another example of "p-hacking."

Dr. Portier's analysis of hemangiosarcomas in males is especially troubling. After first "pooling" the
two 18-month studies (significant result), and then the two 24-month studies (no significant result), *he proposes simply removing the 0/50 count observed in the highest dose group of the Knezevich study.*

By excluding the mice in this high dose group – none of whom were observed with any
hemangiosarcomas, which would suggest no effect of the test compound – Dr. Portier is then able to
manufacture a statistically significant p-value when he pools the 24-month studies, as well as a
significant p-value when pooling all four CD-1 studies. This is a breathtaking manipulation that can
only be charitably described as statistical malpractice.

17 Dr. Portier's summaries of the results for each of the five tumors introduce logical circularities and 18 other redundancies that artificially boost the impact of his findings. For example, consider his 19 discussion of kidney tumors. After alternately pooling the 18-month, 24-month, and all CD-1 studies, 20 Dr. Portier then compares the observed adenoma rates to historical controls. (As an aside, historical controls are not considered by most statisticians or statistical sources as a valid means of establishing 21 22 causation, as discussed earlier. However, even using Dr. Portier's criterion on page 21 of his report, it 23 is unclear why he uses historical controls in his analysis of the mouse studies that were not "from 24 untreated control groups from studies in the same laboratory within two to three years of the study 25 being evaluated.") His conclusion is that, given historical control rates, the two adenomas observed in 26 each of the highest dose groups of the 24-month studies is highly improbable, and strengthens the 27 evidence of a compound-related effect. However, as discussed earlier in Section III in the context of 28 multiple hypothesis tests, this is self-evident when we are evaluating hundreds of tumor types across 29 12 studies: while such a result may be improbable for a single analysis, it is nearly certain that we 30 would observe such results for many tumors when we are computing hundreds of p-values. Dr. 31 Portier is merely providing another outstanding explanation for how a false positive arises when we 32 carry out a large number of statistical tests.

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 23 of 82

Dr. Portier declares that all five mouse studies, including the four CD-1 studies and the Swiss Albino
 study, are "useful", but then confines his analysis to the CD-1 studies. No explanation is given for the
 omission of the Kumar study.

Dr. Portier's joint analysis of the rat studies (under "Summary – Rats" on pages 32-35 in his expert
report) is similarly uneven, suffering from inconsistencies similar to his mouse analyses. To highlight:
As with the mouse studies, for his "pooled" analyses of rats Dr. Portier selects only those tumor types
with statistically significant individual p-values (unadjusted for false discovery rates). There is no
systematic approach applied to the dozens of other tumor types that were evaluated, and no attempt to
make an adjustment for multiple comparisons.

10 • Dr. Portier carried out "pooled" analyses of both liver adenomas, mammary gland tumors, and skin 11 keratocanthomas among the three studies that used Wistar rats (Brammer, Suresh, and Wood in Table 2). As discussed previously, for his analysis of liver adenomas Dr. Portier eliminated the Suresh study, 12 13 without any formal statistical justification, based only on his personal judgment that the studies cannot 14 be combined because of differences in underlying tumor rates. He likewise excluded the Suresh study 15 from his "pooled" analysis of mammary gland adenomas, but then included Suresh for testing skin 16 keratocanthomas. For all three tumor types, Dr. Portier's arbitrary exclusion or inclusion resulted in a 17 "pooled" p-value < 0.05. Again, as noted before, an averaged or pooled effect can be estimated even if 18 the underlying average tumor rates differ, provided that the observed effects across the studies are 19 consistent. Dr. Portier made no attempt to evaluate the latter issue, which invalidates his results.

20

21 (V.D) Evolution of Dr. Portier's Analyses of Animal Carcinogenicity Studies

In addition to the flaws in Dr. Portier's expert report, there are other serious questions about the consistency of his approach, particularly in light of how his work has evolved. He at times appears to selectively rely on analytic strategies motivated primarily by arbitrarily seeking for "statistical significance" (i.e., computing more p-values < 0.05). A few illustrations:</p>

26 The IARC Glyphosate monograph – for which Dr. Portier served as an invited specialist – used 27 approximate trend test p-values to assess potential glyphosate effects for the Knezevich data. As 28 discussed in Section IV, approximate p-values tend to underestimate the corresponding actual p-29 values, and thus increase the potential for "statistically significant" results that are only due to chance. 30 As outlined in the supplementary material of Dr. Portier's expert report, criticism of the approximate trend test by Dr. Joseph Haseman and others prompted Dr. Portier to rely solely on the exact test in his 31 32 subsequent work. However, he has resorted again to approximate p-values for some of the p-values he 33 computes using historical controls, arguing that the sample sizes justify their use. Since exact p-values 34 can be computed instantaneously using modern software, there is no good reason to use approximate

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 24 of 82

tests, particularly when their substantive results disagree with the exact p-values that they are merely
 estimating.

It is particularly puzzling that Dr. Portier has previously dismissed the rat feeding studies, declaring
that they provide no collective evidence that glyphosate increases cancer risk (for example, on page 11
of Document 9 in the supplementary material of his expert report). He offers no explanation regarding
why he has now decided that the statistical evidence supports such an association.

Dr. Portier reports only results that demonstrate increasing tumor incidence for increasing glyphosate
dose, but mentions nothing about tumors that demonstrate decreasing risk of tumor across the
treatment groups. When computing one-sided p-values in the absence of any strong prior evidence in
favor of either a positive or negative effect, statistical convention dictates that we maintain equipoise
about what is observed, even if the result is counterintuitive or in a direction opposite of what we
would either hope for or expect.

Dr. Portier also appears to be inconsistent in his standard for statistical significance. After quoting
 EPA guidelines on page 20 of his expert report, establishing a significance threshold of 5%, he later
 (on page 25) fudges somewhat to suggest that we should also consider p-values between 5% and 10%.
 This is borne out in Tables 8 and 14, where he implies "statistical significance" by highlighting p values > 0.05 for multiple tumor sites. This further elevates the likelihood of observing false positive
 results, even assuming his other strategies (i.e., historical controls and "pooled" analyses) were
 actually valid.

20

21 VI. <u>Conclusion</u>

22 As discussed in Sections III and IV, in the context of the hundreds of tumors evaluated across all 12 23 rodent glyphosate feeding experiments, it is clear that the individual statistically significant findings 24 closely follow the pattern we would expect given that glyphosate does not increase the risk of cancer. Dr. 25 Portier's own analysis of the rodent feeding studies violates several major foundational principles of 26 statistical practice. His entire approach is based on p-values, which he has selectively reported and used to 27 highlight those findings that are statistically significant, without applying any commonly recommended methods to account for the hundreds of individual tumor types evaluated across the 12 experiments. Dr. 28 29 Portier has further employed other flawed strategies, including the use of historical controls and the 30 "pooling" of subsets of the data to generate additional p-values, which he has computed using inconsistent 31 and arbitrary standards. Dr. Portier's "pooled" analyses are deeply defective, lacking any accounting for 32 study heterogeneity or differences in observed effects as recommended by Dr. Portier's own cited 33 sources. His simple aggregating of data – as though data from disparate studies arose from the same 34 experiment – is completely inappropriate and unsupported by any credible statistical text or manual

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 25 of 82

1 regarding methods for analyzing data from multiple sources. Dr. Portier's analytic strategy seriously

- 2 violates our own profession's "Statement on p-Values: Context, Process, and Purpose" (The American
- 3 *Statistician*), referenced in Section III, which notes in part: "*P-values and related analyses should not be*
- 4 reported selectively. Conducting multiple analyses of the data and reporting only those with certain p-
- 5 values (typically those passing a significance threshold) renders the reported p-values essentially
- 6 *uninterpretable. Cherry-picking promising findings, also known by such terms as data dredging,*
- 7 significance chasing, significance questing, selective inference, and 'p-hacking,' leads to a spurious

8 excess of statistically significant results...and should be vigorously avoided."

9

Calorcian

July 31, 2017

Christopher D. Corcoran

Date

1

APPENDIX A – RESULTS FOR RAT FEEDING STUDIES

2 3

TABLE A.1 – Lankas Rat Results, by Tumor Type and Adjusted for Multiple Tests.

MALES		FEMALES	
TUMOR SITE AND TYPE	р	TUMOR SITE AND TYPE	р
pituitary adenoma	0.394	pituitary adenoma	0.938
pituitary carcinoma	0.785	pituitary carcinoma	0.084
brain glioma	0.703	brain carcinoma	0.189
heart sarcoma	0.253	brain lymphoma	0.251
lung met undiff sarcoma	0.250	brain glioma	0.251
lung cell carcoma	0.514	spinal cord	0.250
lung lymphoma	0.750	heart lymphoma	0.250
lung met ost sarcoma	0.750	heart sarcoma	0.750
lung met mixed tumor	0.500	trachea fibrosarcoma	0.751
liver cell sarcoma	0.440	esophagus fibrosarcoma	0.636
liver lymphoma	0.626	lung cell carcoma	0.282
liver met undiff sarcoma	0.750	lung lymphoma	0.317
liver neo nodule	0.474	lung mamm adenocarcinoma	0.253
liver hep carcinoma	0.061	lung adrenal carcinoma	0.253
mes lymph angioma	0.547	lung met fibrosarcoma	0.753
mes lymph lymphoma	0.623	liver cell sarcoma	0.490
mes lymph cell sarcoma	0.454	liver lymphoma	0.062
pancreas islet cell adenoma	0.509	liver met fibrosarcoma	0.750
pancreas islet cell carcinoma	0.251	liver hep carcinoma	0.156
pancreas acinar cell adenoma	0.251	liver neo nodule	0.732
pancreas lymphoma	0.749	mes lymph lymphoma	0.267
pancreas cell sarcoma	0.644	mes lymph cell sarcoma	0.070
salivary cell sarcoma	0.250	pancreas islet cell adenoma	0.874
med lymph fibrosarcoma	0.241	pancreas islet cell carcinoma	0.292
med lymph cell sarcoma	0.593	salivary fibrosarcoma	0.250
spleen angiosarcoma	0.750	thymus lymphoma	0.224
spleen lymphoma	0.626	thymus thymoma	0.266
spleen cell sarcoma	0.201	med lymph fibrosarcoma	0.744
stomach cell sarcoma	0.250	med lymph cell sarcoma	0.094
jejunum cell sarcoma	0.255	med lymph lymphoma	0.058
kidney adenoma	0.813	spleen lymphoma	0.062
kidney lymphoma	0.750	spleen sarcoma	0.062
kidney cell sarcoma	0.735	stomach lymphoma	0.250
kidney lipoma	0.735	stomach cell sarcoma	0.750
testis cell tumor	0.009	stomach fibrosarcoma	0.750
prostate cell sarcoma	0.251	jejunum leiomyosarcoma	0.500
bladder papilloma	0.494	ileum cell sarcoma	0.249

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 27 of 82

thyroid ccell adenoma	0.738
thyroid carcinoma	0.253
thyroid foll adenoma	0.123
parathyroid adenoma	0.743
adrenal cell sarcoma	0.250
adrenal chromocytoma	0.158
adrenal cort adenoma	0.844
adrenal lymphoma	0.750
skin cell tumor	0.251
skin adenoma	0.251
muscle cell sarcoma	0.747
harderian lymphoma	0.759
marrow lymphoma	0.646
marrow sarcoma	0.597

colon cell sarcoma	0.244
kidney lymphoma	0.250
kidney ret cell sarcoma	0.108
kidney trans cell sarcoma	0.250
bladder trans cell carcinoma	0.232
ovary gran cell tumor	0.657
ovary theca cell tumor	0.234
uterus cell carcinoma	0.247
uterus endo sarcoma	0.247
uterus adenoma	0.197
uterus polyp	0.605
uterus ret cell sarcoma	0.809
thyroid ccell adenoma	0.671
thyroid ccell carcinoma	0.003
thyroid foll adenoma	0.964
thyroid fbirosarcoma	0.244
parathyroid adenoma	0.240
adrenal cell sarcoma	0.109
adrenal chromocytoma	0.351
adrenal cortical adenoma	0.850
adrenal cortical carcinoma	0.386
adrenal lymphoma	0.246
mammary adenoma	0.497
mammary fibroadenoma	0.804
mammary adenocarcinoma	0.457
mammary ret cell sarcoma	0.746
eye fibrosarcoma	0.242
harderian lymphoma	0.240
harderian fibrosarcoma	0.240
marrow lymphoma	0.188
marrow sarcoma	0.062

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TABLE A.2 – Stout Rat Results, by Tumor Type and Adjusted for Multiple Tests.

MALES		FEMALES	
TUMOR SITE AND TYPE	р	TUMOR SITE AND TYPE	р
adrenal adenoma	0.063	adrenal adenoma	0.664
adrenal chromocytoma B	0.248	adrenal chromocytoma b	0.268
adrenal chromocytoma M	0.585	adrenal chromocytoma m	0.250
adrenal ganglione	0.504	adrenal carcinoma	0.015
brain astrocytoma	0.297	brain cell tumor	0.500
bone sarcoma	0.245	cecum sarcoma	0.507
cervical astrocytoma	0.496	kidney lipoma	0.500
cervical glioma	0.747	kidney carcinoma	0.500
duodenum carcinoma	0.749	kidney hemangioma	0.750
eyes sarcoma	0.250	liver adenoma	0.922
kidney lipoma	0.938	liver carcinoma	0.167
kidney liposarcoma	0.500	liver sarcoma	0.500
kidney mesenchymal	0.500	liver giosarcoma	0.500
kidney adenoma	0.751	liver cholangioma	0.750
liver adenoma	0.016	lung adenoma	0.750
liver carcinoma	0.610	mammary gland adenoma	0.252
liver sarcoma	0.313	mammary gland carcinoma	0.770
liver neoplasm	0.500	mammary gland carcinosarcoma	0.438
mammary gland adenoma	0.282	nose carcinoma	0.500
mammary gland carcinoma	0.717	ovary granulosa	0.684
mammary gland canthoma	0.243	ovary theca	0.749
lymph node gioma	0.250	pancreas adenoma	0.962
nose adenoma	0.245	pituitary adenoma	0.996
pancreas adenoma	0.147	pituitary carcinoma	0.434
pancreas carcinoma	0.752	parathyroid adenoma	0.859
pituitary distalis	0.665	skin carcinoma	0.248
pituitary intermedia	0.251	skin zymbal's cell adenoma	0.500
prostate carcinoma	0.750	skin basal cell	0.748
parathyroid adenoma	0.243	skin clitoral gland adenoma	0.748
skin canthoma	0.077	spleen lymphoma	0.250
skin carcinoma	0.546	spleen hemangioma	0.250
skin adenocarcinoma	0.752	spleen sarcoma	0.750
skin cytoma	0.500	thyroid adenoma	0.050
skin zymbal's gland adenoma	0.498	thyroid carcinoma	0.500
skin basal cell	0.248	thyroid cystadenoma	0.438
skin papilloma	0.735	thyroid foll cell carcinoma	0.250
skin sebaceous gland adenoma	0.312	thymus lymphoma	0.937
skin fibroma	0.752	urinary papilloma	0.500
sp cord thoracic cytoma	0.500	uterus polyp	0.355
testies interstitial	0.297	uterus hamartoma	0.498

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 29 of 82

thyroid adenoma	0.067
thyroid c cell carcinoma	0.441
thyroid cystadenoma	0.407
thyroid follicular cell carcinoma	0.254
thymus lymphoma	0.479

uterus sarcoma	0.498
uterus adenoma	0.749
uterus leiomyoma	0.749
uterus fibroma	0.749

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TABLE A.3(i) – Atkinson Male Rat Results, by Tumor Type and Adjusted for Multiple Tests.

MALES		FEMALES	
TUMOR SITE AND TYPE	р	TUMOR SITE AND TYPE	р
adrenals cortical adenoma	0.909	adrenals cortical carcinoma	0.269
adrenals uni phaeochromocytoma (M)	0.517	adrenals uni phaeochromocytoma (B)	0.975
adrenals uni phaeochromocytoma (B)	0.134	adrenals bi phaeochromocytoma (B)	0.736
adrenals bi phaeochromocytoma (B)	0.517	brain glioma	0.586
brain granular cell tumor	0.307	duodenum carcinoma	0.263
brain glioma	0.685	kidneys mesenchymal tumor	0.798
kidneys tubular adenoma	0.800	liver adenoma	0.235
kidneys urothelial carcinoma	0.400	lungs alveolar/bronchiolar carcinoma	0.400
liver carcinoma	0.681	lungs sarcoma	0.800
liver adenoma	0.322	mammary glands fibroadenoma	0.334
lungs squamous cell carcinoma	0.403	mammary glands met carcinoma	0.267
lungs alveolar/bronchiolar adenoma	0.763	mammary glands carcinoma	0.259
mammary glands fibroadenoma	0.303	mammary glands adenoma	0.450
mammary glands carcinoma	0.548	ovaries granulosa cell tumor	0.425
mesenteric lymph nodes haemangioma	0.819	pancreas exocrine carcinoma	0.732
pancreas exocrine adenoma	0.945	pancreas islet adenoma	0.733
pancreas islet adenoma	0.973	parathyroids adenoma	0.448
parathyroids adenoma	0.699	pituitary carcinoma	0.384
pituitary carcinoma	0.750	pituitary adenoma	0.525
pituitary adenoma	0.981	salivary glands mandibular fibroma	0.395
prostate carcinoma	0.307	skin basal cell tumor	0.428
prostate adenoma	0.307	skin sebaceous carcinoma	0.733
salivary glands parotid fibroma	0.796	skin zymbal's carcinoma	0.744
skin trichoepithelioma	0.331	skin squamous-cell carcinoma	0.583
skin basal cell tumor	0.697	skin sarcoma	0.733
skin zymbal's carcinoma	0.697	skin fibroma	0.505
skin squamous-cell carcinoma	0.303	skin lipoma	0.070
skin sarcoma	0.690	skin epithelioma	0.733
skin schwannoma	0.545	thyroids uni c-cell adenoma	0.108
skin papilloma	0.303	thyroids bi c-cell adenoma	0.927
skin fibrosarcoma	0.296	uterus stromal sarcoma	0.265
skin fibroma	0.489	uterus met endometrial carcinoma	0.584
skin dermal fibroma	0.561	uterus endometrial carcinoma	0.461
skin lipoma	0.725	uterus endometrial adenoma	0.735
skin epithelioma	0.047	uterus polyp	0.367
testes uni interstitial-cell adenoma	0.976		
testes bi interstitial-cell adenoma	0.303		
testes interstitial-cell adenoma	0.303		
thymus thymoma	0.684		
thyroids follicular carcinoma	0.310		

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 31 of 82

thyroids follicular adenoma	0.067
thyroids uni c-cell carcinoma	0.310
thyroids bi met c-cell carcinoma	0.310
thyroids uni c-cell adenoma	0.400
thyroids bi c-cell adenoma	0.310
thyroids uni adenoma	0.310

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TABLE A.4 – Brammer Rat Results, by Tumor Type and Adjusted for Multiple Tests.

MALES		FEMALES	
TUMOR SITE AND TYPE	р	TUMOR SITE AND TYPE	р
adrenal phaeochromoytoma b	0.806	adrenal ganglioneuroma	0.498
adrenal adenoma	0.313	adrenal phaeochromocytoma	0.890
adrenal phaeochromocytoma m	0.313	brain astrocytoma	0.202
brain astrocytoma	0.438	brain meningioma	0.250
brain meningioma	0.313	brain pineal gland tumour	0.250
brain ependymoma	0.250	cervix stromal cell polyp	0.250
epididymis mesothelioma b	0.316	cervix adenocarcinoma	0.438
epididymis mesothelioma m	0.502	cervix sarcoma	0.062
heart schwannoma	0.750	cervix haemangiosarcoma	0.250
kidney haemangioma	0.250	duodenum adenocarcinoma	0.506
kidney mesenchymal tumour	0.250	duodenum leiomyoma	0.506
lacrimal gland neurofibrosarcoma	0.750	harderian gland anaplastic sarcoma	0.502
liver adenoma	0.008	ileum leiomyosarcoma	0.519
liver liposarcoma	0.250	kidney liposarcoma	0.250
lung adenocarcinoma	0.500	liver adenoma	0.250
lymph node-m haemangioma	0.687	lymph node-m haemangioma	0.762
lymph node-m haemangiosarcoma	0.814	lymph node-m haemangiosarcoma	0.432
nasal cavity fibrosarcoma	0.250	mammary gland adenocarcinoma	0.264
nasal cavity papilloma	0.250	mammary gland adenoma	0.894
nasal cavity ameloblastoma	0.500	mammary gland cystadenoma	0.519
pancreas exocrine adenoma	0.095	mammary gland fibroadenoma	0.377
pancreas exocrine adenocarcioma	0.500	nasal cavity papilloma	0.187
pancreas islet cell adenoma	0.576	nasal cavity adenoma	0.500
parathyroid gland adenoma	0.500	pancreas adenocarcinoma	0.252
pharynx carcinoma	0.753	pancreas islet cell adenoma	0.252
pituitary gland adenoma pars distalis	0.386	pituitary gland adenoma pars distalis	0.280
pituitary gland adenoma pars intermedia	0.387	salivary gland adenoma	0.751
salivary gland neurofibrosarcoma	0.254	skin squamous carcinoma	0.313
skin papilloma	0.247	skin basal cell tumour	0.250
skin basal cell tumour	0.387	skin pilomatrixoma	0.438
skin basal cell carcinoma	0.247	spleen haemangiosarcoma	0.502
skin pilomatrixoma	0.430	stomach squamous papilloma	0.251
skin xeratoacanthoma	0.387	thymus thymoma b	0.629
skin adenoma	0.496	thymus thymoma m	0.626
skin trichofolliculoma	0.498	thymus not otherwise specified sarcoma	0.252
skin sarcoma	0.749	thyroid gland follicular cell adenoma	0.833
spleen not otherwise specified sarcoma	0.500	thyroid gland parafollicular cell adenoma	0.499
spleen not otherwise specified sarcoma	0.500	thyroid gland parafollicular cell carcinoma	0.252
testis leydig cell tumor	0.791	uterus stromal cell polyp	0.950
testis mesothelioma b	0.502	uterus adenocarcinoma	0.816

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 33 of 82

testis mesothelioma m	0.502
thymus benign thymoma	0.112
thyroid gland follicular cell adenoma	0.072
thyroid gland parafollicular cell adenoma b	0.882
thyroid gland parafollicular cell adenoma m	0.502
voluntary muscle haemangioma	0.251

uterus leiomyoma	0.438
uterus carcinoma	0.297
uterus haemangiosarcoma	0.625
uterus haemangioma	0.250

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TABLE A.5 – Suresh Rat Results, by Tumor Type and Adjusted for Multiple Tests.

MALES	FEMALES		
TUMOR SITE AND TYPE	р	TUMOR SITE AND TYPE	р
salivary gland duct palpinoma	0.691	stomach papilloma-forestomach	0.355
stomach adenocarcinoma	0.307	pancreas islet cell adenoma	0.355
stomach papilloma-forestomach	0.503	pancreas cholangio-carcinoma	0.638
pancreas islet cell adenoma	0.742	pancreas histiocytic sarcoma	0.638
pancreas carcinoma	0.509	liver cholangiocarcinoma	0.746
pancreas sarcoma	0.308	liver adenoma	0.922
pancreas lymphosarcoma	0.698	liver carcinoma	0.869
liver cholangiocarcinoma	0.263	liver b.d. adenoma	0.503
liver hepatocellular adenoma	0.391	liver histiocytic sarcoma	0.711
liver carcinoma	0.418	lungs bronchio alveolar adenoma	0.434
liver b.d. adenoma	0.937	lungs histiocytic sarcoma-metastatic	0.667
liver histiocytic sarcoma	0.624	lungs adenoma	0.633
liver tumour emboli	0.370	lungs fibroma	0.480
liver fibrosarcoma	0.495	lungs round cell sarcoma	0.333
liver lymphosarcoma	0.747	lungs histiocytic sarcoma	0.633
liver benign b.d. adenoma	0.253	trachea sarcoma	0.472
lungs histiocytic sarcoma	0.433	heart histiocytic sarcoma	0.594
lungs cholangiocarcinoma	0.503	heart round cell sarcoma	0.350
lungs adenocarcinoma	0.296	mediastinal lymph node histiocytic sarcoma-m	0.650
lungs hepatocellular carcinoma	0.322	mediastinal lymph node cholangiocarcinoma	0.650
lungs squamous cell carcinoma	0.704	mediastinal lymph node histiocytic sarcoma	0.482
lungs giant cell tumour	0.296	kidney lymphosarcoma	0.352
heart histiocytic sarcoma	0.445	urinary bladder carcinoma	0.350
spleen cholangiocarcinoma	0.515	uterus adenoma	0.289
mesentric lymph nodes sarcoma	0.695	uterus adenocarcinoma	0.643
mediastinal lymph node sarcoma - metastatic	0.634	uterus carcinoma	0.514
mediastinal lymph node cholangiocarcinoma	0.494	uterus leiomyosarcoma	0.289
mediastinal lymph node hepatocellular carcinoma	0.494	uterus adenoma papillary	0.514
mediastinal lymph node giant cell tumour	0.306	uterus hemangioma	0.289
mediastinal lymph node sarcoma	0.306	thyroids c cell adenoma	0.537
mandibular lymph node lymphoma	0.087	pituitary adenocarcinoma	0.684
kidneys carcinoma	0.503	pituitary adenoma	0.967
kidneys histiosarcoma	0.299	adrenals cortical cell adenoma	0.400
testes leydig cell tumor	0.182	adrenals pheochromocytoma	0.133
testes seminoma	0.296	thymus thymoma	0.755
epididymes sarcoma	0.250	mammary gland adenoma	0.538
brain squamous cell carcinoma	0.309	mammary gland adenocarcinoma	0.982
thyroids c cell adenoma	0.595	tumour/mass histiocytic sarcoma	0.658
pituitary adenocarcinoma	0.503	tumour/mass cholangiocarcinoma	0.635
pituitary adenoma	0.376	tumour/mass fibroma	0.635

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 35 of 82

adrenals cortical cell adenoma	0.922
adrenals pheochromocytoma	0.066
adrenals m. pheochromocytoma	0.213
tumour/mass squamous cell carcinoma	0.301
tumour/mass histiocytic sarcoma	0.123
tumour/mass cholangiocarcinoma	0.659
tumour/mass giant cell tumour	0.123
tumour/mass fibroma	0.315
bone sarcoma	0.694
sternum sarcoma	0.690

tumour/mass undifferentiated sarcoma	0.635

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TABLE A.6 – Enemoto Rat P-Values, by Tumor Type and Adjusted for Multiple Tests.

MALES		FEMALES	
TUMOR SITE AND TYPE	p	TUMOR SITE AND TYPE	P
heart schwannoma	0.297	heart schwannoma	0.250
hematopoietic and lymphatic myelogenic leukemia	0.750	hematopoietic/lymphatic lymphoma	0.259
hematopoietic and lymphatic malignant lymphoma	0.813	small intestine leiomyoma	0.250
hematopoietic and lymphatic cell leukemia	0.813	large intestine histioctytoma	0.750
spleen histiocytic sarcoma	0.500	liver hepatocellular adenoma	0.813
lung adenoma	0.146	pancreas islet cell adenoma	0.812
lung squamous cell carcinoma	0.250	pancreas islet cell carcinoma	0.500
lung adenocarcinoma	0.250	kidney lipoma	0.500
stomach leiomyosarcoma	0.250	kidney trans cell carcinoma	0.750
small intestine leiomyoma	0.250	bladder papilloma	0.500
small intestine adenocarcinoma	0.250	ovary granulosa cell tumor	0.750
small intestine malignant schwannoma	0.500	ovary luteoma	0.250
liver adenoma	0.250	uterus stromal polyp	0.656
liver carcinoma	0.323	uterus grnaular cell tumor	0.750
pancreas acinar cell adenoma	0.120	uterus adenocarcinoma	0.750
pancreas islet cell adenoma	0.846	uterus schwannoma	0.250
pancreas islet cell carcinoma	0.250	uterus (mass not in section)	0.750
kidney adenoma	0.004	vagina polyp	0.750
kidney lipoma	0.250	vagina leiomysarcoma	0.250
testis cell tumor	0.576	pituitary anterior adenoma	0.819
coagulating gland adenoma	0.250	pituitary anterior adenocarcinoma	0.750
pituitary anterior adenoma	0.132	thyroid follicular adenoma	0.688
pituitary adenoma (intermediate part)	0.500	thyroid c-cell adenoma	0.908
pituitary (mass not in section)	0.250	adrenal cortical adenoma	0.500
thyroid follicullar adenoma	0.947	adrenal ganglioneuroma	0.500
thyroid c-cell adenoma	0.623	adrenal pheochromocytoma	0.500
thyroid follicullar adenocarcinoma	0.750	cerebrum meningioma	0.500
thyroid c-cell carcinoma	0.514	cerebrum reticulosis	0.813
adrenal cortical adenoma	0.620	bone (vertebra) chordoma	0.750
adrenal pheochromromocytoma	0.892	skin papilloma	0.500
adrenal cortical adenocarcinoma	0.250	skin keratoacanthoma	0.250
cerebrum glioma	0.392	skin fibroma	0.400
cerebrum malignant reticulosis	0.750	skin lipoma	0.932
cerebellum cell tumor	0.250	skin (mass not in section)	0.580
bone (femur) osteochondroma	0.250	mammary gland adenoma	0.813
bone (other) osteosarcoma	0.250	mammary gland fibroadenoma	0.106
eye shwannoma	0.750	mammary gland adenocarcinoma	0.595
skin papilloma	0.946		
skin keratoacanthoma	0.029		
skin trichoepithelioma	0.500		
Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 37 of 82

skin sabaceous gland adenoma	0.500
skin basal cell adenoma	0.015
skin fibroma	0.262
skin lipoma	0.873
skin squamous cell carcinoma	0.187
skin basal cell carcinoma	0.250
skin fibrosacoma	0.500
skin liposarcoma	0.750
skin hemangiosarcoma	0.250
skin hemangiopericytoma	0.250
skin osteosarcoma	0.313
skin schwannoma	0.250
skin histiocytic sarcoma	0.250

Image:	
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TABLE A.7 – Wood Rat Results, by Tumor Type and Adjusted for Multiple Tests.

MALES		FEMALES	
TUMOR SITE AND TYPE	р	TUMOR SITE AND TYPE	р
adrenal cortical adenoma	0.813	adrenal cortical adenoma	0.813
adrenal cortical carcinoma	0.750	adrenal ganglioneuroma	0.250
adrenal phaeochromocytoma b	0.062	brain/spinal cord oligodendroglioma	0.750
adrenal phaeochromocytoma m	0.805	brain/spinal cord ependymoma	0.813
bone osteoma	0.250	heart schwannoma	0.938
brain/spinal cord astrocytoma	0.250	kidney clear cell carcinoma	0.250
brain/spinal cord granular cell tumour b	0.813	liver adenoma	0.392
brain/spinal cord granular cell tumour m	0.250	liver carcinoma	0.250
intestinal tract leiomyoma	0.250	liver cholangioma	0.750
intestinal trace leiomsarcoma	0.250	lymph node angioma	0.748
epididymis mesothelioma b	0.750	mammary gland fibroadenoma	0.824
epididymis mesothelioma m	0.751	mammary gland adenoma	0.062
heart schwannoma	0.500	mammary gland adenocarcinoma	0.042
kidney lipoma	0.250	ovary granulosa cell tumour	0.928
kidney tubular carcinoma	0.750	ovary granulosa-theca cell tumour	0.943
liver hepatocellular adenoma	0.418	ovary sarcoma	0.750
liver hepatocellular carcinoma	0.750	pancreas adenocarcinoma	0.250
lymph node angioma	0.357	pharynx papilloma	0.250
lymph node angiosarcoma	0.945	pituitary adenoma	0.014
nasal cavities adenoma	0.938	pituitary adenocarcinoma	0.500
pancreas islet cell adenoma	0.827	skin - subcutaneous fibroma	0.250
parathyroid adenoma	0.750	skin - subcutaneous lipoma	0.313
pituitary adenoma	0.045	skin - subcutaneous angioma	0.062
pituitary adenocarcinoma	0.750	skin - cutaneous basal cell tumour	0.750
skin - subcutaneous fibroma	0.595	skin - cutaneous carcinoma	0.250
skin - subcutaneous fibrosarcoma	0.903	skin - cutaneous papilloma	0.500
skin - subcutaneous histiocytic sarcoma	0.500	stomach papilloma	0.500
skin - subcutaneous lipoma	0.250	thymus thymoma b	0.765
skin - leiomyosarcoma	0.250	thymus carcinoma	0.250
skin - cutaneous basal cell tumor	0.750	thyroid follicular adenoma	0.372
skin- cutaneous carcinoma	0.675	thyroid follicular adenocarcinoma	0.813
skin - cutaneous keratoacanthoma	0.030	thyroid parafollicular adenoma	0.997
skin - cutaneous adenoma	0.500	thyroid parafollicular adenocarcinoma	0.500
skin - cutaneous adenocarcinoma	0.500	tongue granular cell tumor	0.250
skin - cutaneous trichoepithelioma	0.250	uterus polyp	0.221
skin - cutaneous papilloma	0.250	uterus adenocarcinoma	0.602
skin - cutaneous s.s. carcinoma	0.500	uterus sarcoma	0.438
spleen angioma	0.250	uterus leiomyoma	0.514
spleen angiosarcoma	0.750	uterus angiosarcoma	0.500
stomach papilloma	0.370	lymhoid/haemopoietic lymphoma	0.830

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 39 of 82

testis interstitial cell tumour	0.778
thymus thymoma b	0.187
thymus thymoma m	0.313
thyroid adenoma	0.066
thyroid adenocarcinoma	0.250
thyroid parafollicular adenoma	0.823
thyroid parafollicular adenocarcinoma	0.938
thyroid hibernoma	0.250
urinary bladder papilloma	0.500
abdominal adenocarcinoma	0.500
abdominal carcinoma	0.250
lymphoid/haemopoietic lymphoma	0.500

APPENDIX B – RESULTS FOR MOUSE FEEDING STUDIES

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TABLE B.1 – Knezevich Mouse P-Values, by Tumor Type and Adjusted for Multiple Tests.

MALES		
TUMOR SITE AND TYPE		
brain lymphoblastic lymphosarcoma w/leuk	0.251	
heart lymphoblastic lymphosarcoma w/leuk	0.337	
lung adenoma	0.294	
lung adenocarcinoma	0.906	
lung lymphoblastic lymphosarcoma w/leuk	0.772	
lung lymphoblastic lymphosarcoma	0.505	
liver adenocarcinoma	0.717	
liver adenoma	0.251	
liver carcinoma	0.062	
liver sarcoma	0.503	
liver liposarcoma	0.189	
liver composite lymphosarcoma	0.754	
liver lymphoblastic lymphosarcoma	0.539	
mesenteric sarcoma	0.492	
mesenteric lymphosarcoma	0.624	
mesenteric lymphoblastic lymphosarcoma (S)	0.827	
mesenteric lymphoblastic lymphosarcoma (M)	0.061	
mesenteric lymphoblastic lymphosarcoma w/leuk	0.492	
mediastinal sarcoma	0.489	
mediastinal lymphosarcoma	0.631	
mediastinal lymphoblastic lymphosarcoma w/leuk (S)	0.373	
mediastinal lymphoblastic lymphosarcoma w/leuk (M)	0.463	
salivary glands lymphoblastic lymphosarcoma w/leuk	0.628	
spleen hemangioendothelioma	0.250	
spleen sarcoma	0.505	
spleen composite lymphosarcoma	0.631	
spleen lymphoblastic lymphosarcoma w/leuk (S)	0.827	
spleen lymphoblastic lymphosarcoma w/leuk (M)	0.442	
stomach lymphoblastic lymphosarcoma w/leuk	0.746	
pancreas sarcoma	0.508	
pancreas lymphoblastic lymphosarcoma w/leuk	0.256	
ileum composite lymphosarcoma	0.733	
ileum lymphoblastic lymphosarcoma w/leuk	0.733	
cecum lymphoblastic lymphosarcoma w/leuk	0.753	
colon composite lymphosarcoma	0.755	
kidney adenoma (using EPA reeval)	0.442	
kidney carcinoma (using EPA reeval)	0.063	
kidney sarcoma	0.505	

FEMALES		
TUMOR SITE AND TYPE	р	
brain lymphoblastic lymphosarcoma w/leuk	0.251	
heart lymphoblastic lymphosarcoma w/leuk	0.433	
lung adenoma	0.999	
lung adenocarcinoma	0.183	
lung granulosa cell tumor	0.500	
lung leiomyosarcoma	0.500	
lung liposarcoma	0.753	
lung composite lymphosarcoma	0.442	
lung lymphoblastic lymphosarcoma w/leuk	0.717	
lung lymphoblastic lymphosarcoma	0.253	
liver adenocarcinoma	0.828	
liver adenoma	0.497	
liver hemangioendothelioma (M)	0.249	
liver leiomyosarcoma	0.497	
liver granulocytic leukemia	0.875	
liver hemangioendothelioma (S)	0.437	
liver composite lymphosarcoma	0.064	
liver lymphoblastic lymphosarcoma w/leuk	0.787	
liver lymphoblastic lymphosarcoma	0.061	
mesenteric leiomyosarcoma	0.495	
mesenteric granulocytic leukemia	0.495	
mesenteric adenocarcinoma	0.747	
mesenteric composite lymphosarcoma	0.141	
mesenteric lymphoblastic lymphosarcoma w/leuk (M)	0.522	
mesenteric lymphoblastic lymphosarcoma w/leuk (S)	0.782	
mesenteric composite lymphosarcoma	0.141	
mesenteric lymphoblastic lymphosarcoma (M)	0.060	
mesenteric lymphoblastic lymphosarcoma (S)	0.247	
mesenteric hemangioendothelioma	0.247	
mediastinal leiomyosarcoma	0.489	
mediastinal granulocytic leukemia	0.489	
mediastinal liposarcoma	0.761	
mediastina composite lymphosarcoma	0.266	
mediastinal lymphoblastic lymphosarcoma w/leuk (S)	0.717	
mediastinal lymphoblastic lymphosarcoma w/leuk (M)	0.760	
mediastinal lymphoblastic lymphosarc (M)	0.489	
mediastinal lymphoblastic lymphosarc (S)	0.267	
salivary glands leiomyosarcoma	0.239	

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 41 of 82

kidney composite lymphosarcoma	0.753
kidney lymphoblastic lymphosarcoma w/leuk	0.463
testes cell tumor	0.649
testes lymphoblastic lymphosarcoma w/leuk (S)	0.508
testes lymphoblastic lymphosarcoma w/leuk (M)	0.254
epididymides leiomysarcoma	0.317
bladder histiocyticsarcoma	0.500
bladder lymphoblastic lymphosarcoma w/leuk	0.810
renal gland adenoma	0.574
renal gland lymphoblastic lymphosarcoma w/leuk (U)	0.503
renal gland lymphoblastic lymphosarcoma w/leuk (B)	0.246
skin/ears fibrosarcoma	0.245
skin/ears liposarcoma	0.245
skin/ears composite lymphosarcoma	0.745
skin/ears lymphoblastic lymphosarcoma w/leuk	0.245
eyes lymphoblastic lymphosarcoma w/leuk	0.643
harderian gland adenoma	0.750
harderian gland liposarcoma	0.255
marrow lymphoblastic lymphosarcoma w/leuk	0.566

salivary lymphoblastic lymphosarcoma w/leuk	0.485
spleen hemangioendothelioma (M)	0.370
spleen hemangioma	0.250
spleen granulocytic leukemia	0.877
spleen adenocarcinoma	0.745
spleen hemangioendothelioma (S)	0.250
spleen composite lymphosarcoma (S)	0.580
spleen lymphoblastic lymphosarcoma w/leuk (S)	0.824
spleen lymphoblastic lymphosarcoma w/leuk (M)	0.438
spleen composite lymphosarcoma (M)	0.016
spleen lymphoblastic lymphosarcoma (M)	0.250
spleen lymphoblastic lymphosarcoma (S)	0.250
stomach leiomyosarcoma	0.254
stomach adenocarcinoma	0.254
duodenum composite lymphosarcoma	0.770
pancreas granulocytic leukemia	0.508
pancreas composite lymphosarcoma	0.638
pancreas lymphoblastic lymphosarcoma w/leuk	0.746
jejunum composite lymphosarcoma	0.761
ileum composite lymphosarcoma	0.758
cecum composite lymphosarcoma	0.766
colon composite lymphosarcoma	0.743
colon lymphoblastic lymphosarcoma w/leuk	0.743
kidney leiomyosarcoma	0.500
kidney granulocytic leukemia	0.500
kidney composite lymphosarcoma	0.395
kidney lymphoblastic lymphosarcoma w/leuk	0.597
kidney lymphoblastic lymphosarcoma	0.250
bladder granulocytic leukemia	0.519
bladder composite lymphosarcoma	0.822
bladder lymphoblastic lymphosarcoma w/leuk	0.838
ovaries luteoma	0.246
ovaries teratoma	0.508
ovaries cell tumor	0.508
ovaries leiomyosarcoma	0.508
ovaries adenocarcinoma	0.754
ovaries lymphoblastic lymphosarcoma w/leuk (U)	0.508
ovaries lymphoblastic lymphosarcoma w/leuk (B)	0.641
ovaries composite lymphosarcoma	0.246
uterus leiomyoma	0.619
uterus leiomyosarcoma	0.385
uterus sarcoma	0.505
uterus hemangioma	0.505

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 42 of 82

uterus adenocarcinoma	0.939
uterus hemangioendothelioma	0.255
uterus lymphoblastic lymphosarcoma w/leuk	0.821
thyroid adenoma	0.271
skin/ears fibrosarcoma	0.516
skin/ears liposarcoma	0.759
skin/ears rhabdomyosarcoma	0.759
skin/ears lymphoblastic lymphosarcoma w/leuk	0.592
mammary adenocarcinoma	0.842
mammary lymphoblastic lymphosarcoma w/leuk	0.250
muscle liposarcoma	0.749
muscle lymphoblastic lymphosarcoma w/leuk	0.623
harderian gland adenoma	0.830
harderian lymphoblastic lymphosarcoma w/leuk	0.250
marrow lymphoblastic lymphosarcoma w/leuk	0.385
marrow lymphoblastic lymphosarcoma	0.065
marrow composite lymphosarcoma	0.257

TABLE B.2 – Atkinson Mice Results, by Tumor Type and Adjusted for Multiple Tests.

MALES		FEMALES	
TUMOR SITE AND TYPE	р	TUMOR SITE AND TYPE	р
adrenals phaeochromocytoma (M)	0.486	adrenals carcinoma	0.500
adrenals carcinoma	0.486	adrenals subcap adenoma	0.750
adrenals phaeochromocytoma (B)	0.338	liver carcinoma	0.750
adrenals adenoma	0.648	liver adenoma	0.642
adrenals subcap adenoma	0.716	lungs carcinoma	0.105
brain meningioma	0.347	lungs adenoma	0.358
kidneys carcinoma	0.813	lungs (assoc) adenoma	0.072
kidneys adenoma	0.813	lungs secondary tumor	0.201
liver carcinoma	0.450	lymphoreticular sarcoma	0.575
liver adenoma	0.583	lymphoreticular lymphoma	0.475
liver (assoc) adenoma	0.077	mammary glands carcinoma	0.845
lungs carcinoma	0.456	mammary glands adenocarcinoma	0.250
lungs adenoma	0.339	ovaries granulosa cell tumor	0.750
lungs (assoc) adenoma	0.217	ovaries luteal cell tumor	0.250
pancreas adenoma	0.340	ovaries adenoma	0.062
pituitary intermediate adenoma	0.326	pancreas adenoma	0.500
prostate sarcoma	0.350	pituitary anterior adenoma	0.155
skin carcinoma	0.655	pituitary intermediate adenoma	0.250
skin sarcoma	0.641	skin carcinoma	0.187
skin papilloma	0.345	skin sarcoma	0.392
skin lipoma	0.345	skin papilloma	0.750
spinal cord ganglioneuroma	0.655	spleen sarcoma	0.250
stomach carcinoma	0.340	thyroids adenoma	0.250
testes adenoma	0.520	uterus sarcoma	0.299
vascular haemangiosarcoma (using IARC)	0.004	uterus stromal tumor	0.250
		uterus polyps	0.433
		uterus leiomyoma	0.108

TABLE B.3 – Wood Mice Results, by Tumor Type and Adjusted for Multiple Tests.

MALES		FEMALES	
TUMOR SITE AND TYPE	р	TUMOR SITE AND TYPE	р
adrenal adenoma	0.172	bone osteoma	0.750
adrenal carcinoma	0.754	bone marrow sarcoma	0.250
bone marrow lipoma	0.750	brain oligodendroglioma	0.750
brain sarcoma	0.251	harderian adenoma	0.155
brain oligodendroglioma	0.754	harderian adenocarcinoma	0.938
harderian adenoma	0.502	intestinal adenoma	0.750
kidney haemangiosarcoma	0.250	liver carcinoma	0.500
liver adenoma	0.335	liver haemangioma	0.500
liver carcinoma	0.921	liver haemangiosarcoma	0.250
liver haemangiosarcoma	0.615	lung adenoma	0.637
lung adenoma	0.926	lung adenocarcinoma	0.591
lung adenocarcinoma	0.030	mammary adenocarcinoma	0.391
seminal adenoma	0.938	mammary carcinoma	0.500
seminal leiomyosarcoma	0.250	mesenteric sarcoma	0.534
skin fibrosarcoma	0.542	ovary luteoma	0.514
spleen haemangioma	0.750	ovary haemangioma	0.250
testis cell tumor	0.938	ovary cell tumor	0.250
abdominal mesothelioma	0.250	ovary cystadenoma	0.062
abdominal sarcoma	0.250	ovary sarcoma	0.500
lymphoid/haemopoietic myeloid leukaemia	0.500	pancreas adenocarcinoma	0.750
lymphoid/haemopoietic lymphoma	0.007	pituitary adenoma	0.108
		skin haemangiosarcoma	0.500
		spleen haemangiosarcoma	0.438
		thymus sarcoma	0.250
		uterus polyp	0.170
		uterus haemangioma	0.500
		uterus leiomyoma	0.250
		uterus carcinoma	0.750
		uterus sarcoma	0.719
		uterus leiomyosarcoma	0.750
		abdominal lipoma	0.750
		lymphoid/haemopoietic myeloid leukaemia	0.250
		lymphoid/haemopoietic lymphoma	0.353
		lymphoid/haemopoietic sarcoma	0.482

TABLE B.4 – Sugimoto Mice Results, by Tumor Type and Adjusted for Multiple Tests.

MALES		FEMALES		
TUMOR SITE AND TYPE	р	TUMOR SITE AND TYPE		
hematopoietic & lymphatic system lymphoma	0.016	hematopoietic & lymphatic system leukemia	0.250	
lymph nodes lymphoma	0.500	hematopoietic & lymphatic system lymphoma	0.307	
spleen sarcoma	0.750	thymus lymphoma	0.250	
lung adenoma	0.512	spleen hemangioma	0.250	
lung adenocarcinoma	0.148	spleen hemangiosarcoma	0.250	
intestine adenoma	0.500	spleen sarcoma	0.250	
intestine adenocarcinoma	0.250	lung adenoma	0.800	
liver adenoma	0.984	lung adenocarcinoma	0.597	
liver hemangioma	0.750	small intestine adenoma	0.250	
liver sarcoma	0.750	liver adenoma	0.735	
liver carcinoma	0.391	liver hemangioma	0.250	
kidney adenoma	0.062	urinary bladder leiomyoma	0.187	
urinary bladder papilloma	0.751	ovary hemangioma	0.250	
testis cell tumor	0.500	uterus polyp	0.751	
testis hemangioma	0.750	uterus hemangioma	0.062	
thyroid adenoma	0.751	uterus leiomyoma	0.370	
adrenal b cell tumor	0.500	uterus sarcoma	0.500	
cerebrum lipoma	0.500	uterus leiomyosarcoma	0.624	
ilarderian gland adenoma	0.515	pituitary adenoma	0.500	
skin papilloma	0.813	thyroid adenoma	0.751	
skin hemangiosarcoma	0.062	adrenal a cell tumor	0.595	
skin leiomysarcoma	0.187	adrenal pheochromocytoma	0.751	
skin osteosarcoma	0.250	bone osteoma	0.250	
		harderian gland adenoma	0.040	
		skin papilloma	0.750	
		skin lipoma	0.626	
		skin carcinoma	0.500	
		skin liposarcoma	0.250	
		skin hemangiosarcoma	0.250	
		mammary gland adenoma	0.500	
		mammary gland adenocarcinoma	0.814	
		thoracic cavity osteosarcoma	0.400	
		abdominal cavity hemangioma	0.257	
		abdominal cavity osteosarcoma	0.257	

TABLE B.5 – Kumar Mice Results, by Tumor Type and Adjusted for Multiple Tests.

MALES		FEMALES	
TUMOR SITE AND TYPE	р	TUMOR SITE AND TYPE	р
cecum adenoma	0.648	stomach sarcoma	0.515
liver hemangiosarcoma	0.327	pancreas sarcoma	0.515
liver adenoma	0.846	liver sarcoma	0.769
liver carcinoma	0.249	liver adenoma	0.515
lungs squamous cell carcinoma	0.500	lungs endometrial stromal sarcoma	0.365
lungs broncheo-alveolar adenoma	0.463	lungs broncheo-alveolar adenoma	0.165
lungs broncheo-alveolar carcinoma	0.347	lungs broncheo-alveolar carcinoma	0.750
mesenteric hemangioma	0.431	mesenteric hemangioma	0.016
mesenteric hemangiosarcoma	0.245	mesenteric sarcoma	0.500
kidneys adenoma	0.090	kidneys sarcoma	0.511
kidneys hibernoma	0.671	bladder sarcoma	0.368
testes tumor	0.345	ovaries hemangioma	0.304
epididymes leiomyoma	0.503	ovaries sarcoma	0.735
skin carcinoma	0.791	ovaries tumor	0.304
tumor/mass hemangioma	0.304	ovaries luteoma	0.304
bone osteoma	0.582	uterus leiomyosarcoma	0.311
lymphoreticular sarcoma	0.624	uterus sarcoma	0.793
lymphoreticular lymphoma	0.064	uterus leiomyoma	
lymphoreticular leukemia	0.744	4 pituitary adenoma	
		adrenals sarcoma	0.511
		adrenals adenoma	0.363
		adrenals pheochromocytoma	0.363
		skin carcinoma	0.588
		thymus lymphoma	0.629
		mammary adenocarcinoma	0.598
		tumor/mass hemangiosarcoma	0.562
		femur osteoma	0.297
		lymph node sarcoma (M)	0.189
		lymph node sarcoma (I)	0.189
		hemolymphoreticular sarcoma	0.199
		hemolymphoreticular lymphoma	0.070
		hemolymphoreticular leukemia	0.602

3

TABLE B.6 – Kumar Mice Results Using Data from Weber Reanalysis, by Tumor Type and Adjusted for Multiple Tests.

MALES			FEMALES	
TUMOR SITE AND TYPE p			TUMOR SITE AND TYPE	р
cecum adenoma	0.750		stomach sarcoma	0.500
liver adenoma	0.846		pancreas sarcoma	0.500
liver carcinoma	0.155		liver sarcoma	0.688
lungs squamous cell carcinoma	0.500		liver adenoma	0.395
lungs broncheo-alveolar adenoma	0.438		lungs endometrial stromal sarcoma	0.250
lungs broncheo-alveolar carcinoma	0.250		lungs broncheo-alveolar adenoma	0.069
kidneys adenoma	0.250		lungs broncheo-alveolar carcinoma	0.750
kidneys hibernoma	0.750		mesenteric sarcoma	0.500
testes tumor	0.237		kidneys sarcoma	0.500
epididymes leiomyoma	0.500		bladder sarcoma	0.250
skin carcinoma	0.813		ovaries sarcoma	0.495
lymphoreticular sarcoma	0.534		ovaries tumor	0.250
lymphoreticular lymphoma	0.141	uterus leiomyosarcoma 0		0.250
lymphoreticular leukemia	0.830	uterus sarcoma		0.704
femur osteoma	0.750	uterus leiomyoma 0		0.830
hemangioma	0.261	pituitary adenoma 0.		0.250
hemangiosarcoma	0.438		adrenals sarcoma	0.500
			adrenals adenoma	0.250
			adrenals pheochromocytoma	0.250
			skin carcinoma	0.500
			mammary adenocarcinoma	0.438
			femur osteoma	0.113
			hemolymphoreticular sarcoma	0.199
			hemolymphoreticular lymphoma	0.085
		[hemolymphoreticular leukemia	0.602
			hemangioma	0.014
			hemangiosarcoma	0.750

APPENDIX C – MULTIPLE TESTING ADJUSTMENTS

2 3

TABLE C.1 – Summary of findings with individual p-values < 0.05 for exact one-sided trend tests</th>

- 4 for increasing tumor incidence with increased dose, computed across 1,016 total tumor types, with
- 5 multiple testing adjustment for the false discovery rate.

			Exact Trend	P-Value Adjusted for
Study	Rodent/Strain/Sex	Tumor Type	P-Value	False Discovery Rate
Lankas	Rat/SD/Male	Testis Cell Tumor	0.009	0.473
	Rat/SD/Female	Thyroid Cell Carcinoma	0.003	0.175
Stout	Rat/SD/Male	Liver Adenoma	0.016	0.703
	Rat/SD/Female	Adrenal Carcinoma	0.015	0.662
Atkinson	Rat/SD/Male	Skin Epithelioma	0.047	0.801
Brammer	Rat/Wistar/Male	Liver Adenoma	0.008	0.370
Enemoto	Rat/SD/Male	Kidney Adenoma	0.004	0.189
	Rat/SD/Male	Skin Keratoacanthoma	0.029	0.510
	Rat/SD/Male	Skin Basal Cell Adenoma	0.015	0.395
Wood	Rat/Wistar/Male	Pituitary Adenoma	0.045	0.684
	Rat/Wistar/Male	Skin Cutaneous Keratoacanthoma	0.030	0.684
	Rat/Wistar/Female	Mammary Gland Adenocarcinoma	0.042	0.616
	Rat/Wistar/Female	Pituitary Adenoma	0.014	0.557
Knezevich	Mouse/CD-1/Female	Spleen Composite Lymphosarcoma (M)	0.016	0.858
Atkinson	Mouse/CD-1/Male	Vascular Haemangiosarcoma	0.004	0.089
Wood	Mouse/CD-1/Male	Lung Adenocarcinoma	0.030	0.312
	Mouse/CD-1/Male	Lymphoid/Haemopoietic Lymphoma	0.007	0.139
Sugimoto	Mouse/CD-1/Male	Hematopoietic & Lymphatic System Lymphoma	0.016	0.373
	Mouse/CD-1/Female	Harderian Gland Adenoma	0.040	0.554
Kumar	Mouse/Swiss/Female	Mesenteric Hemangioma	0.016	0.468

APPENDIX D – MULTIPLE TESTING ADJUSTMENTS

2

3 TABLE D.1 – Summary of findings with individual p-values < 0.05 for exact one-sided trend tests

4 for decreasing tumor incidence with increased dose, computed across 1,016 total tumor types, with

5 multiple testing adjustment for the false discovery rate.

			Exact Trend	P-Value Adjusted for
Study	Rodent/Strain/Sex	Tumor Type	P-Value	False Discovery Rate
Lankas	Rat/SD/Female	Thyroid Follicular Adenoma	0.036	0.956
Stout	Rat/SD/Female	Pancreas Adenoma	0.038	0.693
	Rat/SD/Female	Pituitary Adenoma	0.004	0.166
Atkinson	Rat/SD/Male	Pancreas Islet Adenoma	0.027	0.410
	Rat/SD/Male	Pituitary Adenoma	0.019	0.410
	Rat/SD/Male	Testes Uni Interstitial-Cell Adenoma	0.024	0.410
	Rat/SD/Female	Adrenals Uni Phaeochromocytoma (B)	0.025	0.781
Brammer	Rat/Wistar/Female	Uterus Stromal Cell Polyp	0.050	0.805
Suresh	Rat/Wistar	Pituitary Adenoma	0.033	0.671
	Rat/Wistar	Mammary Gland Adenocarcinoma	0.018	0.671
Wood	Rat/Wistar/Female	Thyroid Parafollicular Adenoma	0.003	0.120
Knezevich	Mouse/CD-1/Female	Lung Adenoma	0.001	0.056
Sugimoto	Mouse/CD-1/Male	Liver Adenoma	0.016	0.378

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- Letter from Thomas F. Armstrong, Registration Manager, Monsanto Co. on Roundup® Herbicide EPA Reg. Nos. 524-308, 524-330, 524-332, 524-339, 524-343, 524-351 Addendum to Chronic Mouse Study with Glyphosate: Additional Evaluations to the Director, Registration Division, Office of Pesticide Programs, U.S. EPA (Oct. 28, 1985).
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- 54. Portier, C. et al., *Differences in the carcinogenic evaluation of glyphosate between the International Agency for Research on Cancer (IARC) and the European Food Safety Authority (EFSA)*, 70 J Epidemiology Community Health 741 (2016).
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- 58. Portier, C., *Response to comments prepared by Robert E. Tarone (dated October 27, 2016)*, Regulations.gov (Nov. 28, 2016).
- 59. Problems with scientific research: How science goes wrong, The Economist (Oct. 21, 2013).
- 60. Son, W. and C. Gopinath, *Early occurrence of spontaneous tumors in CD-1 mice and Sprague-Dawley rats*, 32 Toxicologic Pathology 371 (2004).

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- 63. Uno, H., et al., A versatile test for equality of two survival functions based on weighted differences of Kaplan-Meier curves, 34 Statistics Med. 3680 (2015).
- 64. Unreliable research: Trouble at the lab, The Economist (Oct. 18, 2013).
- 65. Wasserstein, R. & N. Lazar, *The ASA's Statement on p-Values: Context, Process, and Purpose*, 70 The American Statistician 129 (2016).
- 66. Weber, K., Statistical Evaluation of Pre-Neoplastic and Neoplastic Lesions from Study: Study No. TOXI: 1559.CARCI-M Carcinogenicity Study with Glyphosate Technical in Swiss Albino Mice (Jan. 23, 2017).

Christopher D. Corcoran

Utah State University

Education

ScD, Harvard University, 1999. Major: Biostatistics Supporting Areas of Emphasis: Genetic Epidemiology

BS, Utah State University, 1995. Major: Statistics Supporting Areas of Emphasis: Computer Science

Professional Positions

Professor, Utah State University. (July 2011 - Present).

Associate Professor, Utah State University. (July 2005 - July 2011).

Assistant Professor, Utah State University. (August 1999 - July 2005).

Professional

- Department Head, Department of Mathematics and Statistics, Utah State University. (2016 Present)
- Associate Department Head, Department of Mathematics and Statistics, Utah State University. (2014 2016)
- Director of Graduate Studies, Department of Mathematics and Statistics, Utah State University. (2013 2016)
- Director, Data Management and Statistics Core, Center for Epidemiologic Studies, Utah State University. (2004 Present).

Research Fellow, Cytel Software Corporation. (2009 - 2010).

Teaching Assistant, Harvard University, Department of Biostatistics. (1995 - 1999).

Research Assistant, Dana Farber Cancer Institute, Department of Biostatistics. (1996).

Awards and Honors

Researcher of the Year, College of Science, Utah State University. (April 2012).

Researcher of the Year, Department of Mathematics and Statistics, Utah State University. (April 2012).

Teacher of the Year, Department of Mathematics and Statistics, Utah State University. (2006).

Researcher of the Year, Department of Mathematics and Statistics, Utah State University. (2005).

Top Professor, Mortar Board Honor Society, Utah State University Chapter. (2002).

Teaching Fellow, Department of Biostatistics, Harvard School of Public Health. (1996).

Academic Achievement Award, Utah State University. (1995).

NIH Cancer Research Training Grant Recipient. (1995).

Mortar Board, Utah State University. (1994).

Golden Key National Honor Society Peat Marwick Scholarship. (1993).

ACADEMIC INSTRUCTION

Teaching Experience

Utah State University

MATH 2260, Internship and Cooperative Studies, 1 course. MATH 4910, Directed Reading and Conference, 2 courses. MATH 5910, Directed Reading and Conference, 4 courses. MATH 6250, Graduate Internship/Cooperative Studies, 5 courses. MATH 6910, Directed Reading and Conference, 6 courses. MATH 7810, Topics in Mathematics (Topic), 2 courses. MATH 7910, College Teaching Internship, 2 courses. MATH 7990, Continuing Graduate Advisement, 8 courses. STAT 3000, Statistics for Scientists, 5 courses. STAT 4250, Advanced Internship/Co-op, 1 course. STAT 5100, Linear Regression and Time Series, 3 courses. STAT 5120, Categorical Data Analysis, 6 courses. STAT 5810, Topics in Statistics, 4 courses. STAT 5820, Topics in Statistics, 1 course. STAT 5820, 6910, Topics in Statistics, 1 course. STAT 5970, Seminar, 3 courses. STAT 6250, Graduate Internship/Co-op, 1 course. STAT 6550, Statistical Computing, 1 course. STAT 6810, Topics in Statistics (Topic), 1 course. STAT 6820, Topics in Statistics (Topic), 1 course. STAT 6910, Seminar in Statistics, 14 courses. STAT 6950, Directed Reading and Conference, 1 course. STAT 6990, Continuing Graduate Advisement, 2 courses. STAT 7810, Topics in Statistics (Topic), 1 course. STAT 7990, Continuing Graduate Advisement, 1 course.

Directed Student Learning

Dissertation Committee Chair, "Network Meta-Analysis," Mathematics & Statistics. (September 1, 2014 - Present). Advised: Brinley Zabriskie

Master's Committee Chair, "Statistical Strategies for Public Database Access and Analysis," Mathematics & Statistics. (September 1, 2014 - Present). Advised: Christina Stevens

- Dissertation Committee Chair, Mathematics & Statistics. (August 2013 Present). Advised: Divya Nair
- Dissertation Committee Chair, Mathematics & Statistics. (August 2013 Present). Advised: Sarah Schwartz
- Master's Committee Chair, Mathematics & Statistics. (August 2013 Present). Advised: Michael Steelman
- Master's Committee Chair, Mathematics & Statistics. (August 2012 Present). Advised: Jenny Clements
- Dissertation Committee Member, Nutrition, Dietetics and Food Sciences. (August 2010 -Present). Advised: Meo La
- Dissertation Committee Chair, "Computational methods for family-based association tests." (August 2008 - May 2012). Advised: William Welbourn
- Master's Committee Chair, "Serum cytokine levels and risk of dementia." (2011). Advised: Austin Bowles
- Master's Committee Chair, "TBD." (2011). Advised: Elizabeth Giles
- Master's Committee Chair, "Patterns of stressful life events and Alzheimer's disease risk." (2011). Advised: Megan Platt
- Supervised Research/URF, "Effectiveness of surgical strategies for hysterectomy," Biology. (2010). Advised: Erica Huelsmann
- Master's Committee Chair, "Comparing methods for family-based association tests." (2009). Advised: Abbie Lundgreen
- Master's Committee Chair, "Heritability of cognitive change." (2009). Advised: Colette Childs
- Dissertation Committee Chair, "Small-sample inference for correlated categorical data." (2008). Advised: Larry Cook
- Master's Committee Chair, "Heritability of cognitive traits using complex pedigrees and sibships." (2008). Advised: Cassidy Allen
- Master's Committee Chair, "Multivariate analysis of longitudinal neuropsychological measures in the Cache County Memory Study." (2006). Advised: Sarah Schwartz
- Master's Committee Chair, "Computational efficiency of exact family-based association tests." (2006). Advised: Yanwei Ouyan

Case 3:16-md-02741-VC Document 655-12 Filed 10/28/17 Page 58 of 82

- Supervised Research/URF, "Nutritional risk factors for cognitive decline among the elderly," Biology. (2006). Advised: Angela Dunn
- Dissertation Committee Chair, "Exact family based association tests." (2004). Advised: Kady Schneiter
- Supervised Research/URF, "Cognitive decline and antioxidant, Vitamin C, and Vitamin E intake among the elderly," Biology. (2003 2004). Advised: Leila King
- Supervised Research/URF, "Haplotypes of candidate genes as predictors of hip fracture in the elderly," Biology. (2003 2004). Advised: Sara Anderson
- Master's Committee Chair, "Use of classification methods for dementia screening." (2003). Advised: Leslie Toone
- Supervised Research/URF, "Using patient characteristics of the demented to classify dementia type," Mathematics & Statistics. (2003). Advised: Kimberly Peterson
- Supervised Research/URF, "Persistence of behavioral disturbances among the demented," Mathematics & Statistics. (2002 - 2003). Advised: Craig Huber
- Master's Committee Chair, "Correcting for left truncation bias when evaluating survival among the elderly with dementia." (2002). Advised: Jennifer Harrick
- Supervised Research/URF, "General advising for submitting abstract regarding NIH internship project to CUR Posters on the Hill," Mathematics & Statistics. (2002). Advised: Randy Johnson
- Supervised Research/URF, "Genetic factors in shortening time-to-onset of Alzheimer's disease," Mathematics & Statistics. (2002). Advised: Sunni Mumford
- Master's Committee Chair, "Operating characteristics of exact methods for corelated categorical data." (2001). Advised: Shea Watrin

RESEARCH & OTHER CREATIVE ACTIVITIES

Published Intellectual Contributions

Book Chapters

Book, Chapter in Scholarly Book (Published)
Corcoran, C. D., Senchaudhuri, P., Mehta, C., Patel, N. (2010). Exact Methods for Categorical Data Analysis. In BS Everitt, CR Palmer (Ed.), *Encyclopaedic Companion to Medical Statistics*. London: Hodder Arnold.

Book, Chapter in Non-Scholarly Book (Published)

Corcoran, C. D. (2009). Analysis of Correlated Data. *StatXact Version 8.0 User Manual* (pp. 895-935).

Book, Chapter in Scholarly Book (Published)

Cutler, A., Corcoran, C. D., Toone, L. (2005). Bagging. *Encyclopedia of Statistics in Behavioral Science*. New York: Wiley & Sons.

Book, Chapter in Scholarly Book (Published)

Corcoran, C. D., Ryan, L. M. (2002). Exact Dose-Response Inference. In M Aerts, H Geys, G Molenberghs, and LM Ryan (Ed.), *Topics in Modelling of Clustered Data* (pp. 195-206). New York: Chapman and Hall.

Book, Chapter in Scholarly Book (Published)

Corcoran, C. D. (2002). Trend tests for binary data. In AH EI-Shaarawi and WW Piegorsch (Ed.), *Encyclopedia of Environments* (vol. 4, pp. 2260-2264). Chichester: John Wiley & Sons.

Book, Chapter in Non-Scholarly Book (Published)

Corcoran, C. D., Kannappan, A. R., Senchaudhuri, P., Coull, B. (1999). *Egret User Manual*. Cytel Software Corporation.

Refereed Journal Articles

Journal Article, Professional Journal (Accepted)

Rattinger, G. B., Fauth, E. B., Behrens, S., Sanders, C., Schwartz, S., Norton, M. C., Corcoran, C. D., Mullins, C. D., Lyketsos, C. G., Tschanz, J. T. (in press). Closer caregiver and care recipient relationships predict lower informal costs of dementia care. *Alzheimer's & Dementia*.

Journal Article, Professional Journal (Accepted)

Matyi, J. A., Tschanz, J. T., Rattinger, G. B., Sanders, C., Vernon, E. K., Corcoran, C. D., Kauwe, J. S., Buhusi, M. C. (in press). Sex differences in risk for Alzheimer's Disease related to neurotrophin gene polymorphisms: the Cache County Memory Study. *Journal of Gerontology: Biological Sciences*.

Journal Article, Professional Journal (Published)

Sanders, C., Behrens, S., Schwartz, S., Wengreen, H., Corcoran, C. D., Lyketos, C. G., Tschanz, J. T. (2016). Nutritional status is associated with faster cognitive decline and worse functional impairment in the progression of dementia: The Cache County Dementia Progression Study. *Journal of Alzheimer's Disease.*

Journal Article, Professional Journal (Published)

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Journal Article, Professional Journal (Published)

Hippen, A. A., Ebbert, M. t., Norton, M. C., Tschanz, J. T., Munger, R. G., Corcoran, C. D., Kauwe, J. S. (2016). Presenilin E318G variant and Alzheiemr's disease risk: The Cache County Study. *BMC Genomics*, *17*(Suppl 3), 438.

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 Dementia severity and the longitudinal costs of informal care in the Cache County population. *Alzheimer's & Dementia*, *11*, 946-954.

Journal Article, Academic Journal (Published)

Snyder, C. M., Fauth, E. B., Wanzek, J., Piercy, K. W., Norton, M. C., Corcoran, C. D., Rabins, P. V., Lyketsos, C. G., Tschanz, J. T. (2015). Dementia caregivers' coping strategies and their relationship to health and well-being: The Cache County Study. *Aging & Mental Health*, *19*(5), 390-399.

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Lythgoe, C., Perkes, A., Peterson, M., Schmutz, C., Leary, M., Ebbert, E. T. W., Ridge, P. G., M., J., Munger, R. G., Corcoran, C. D., Kauwe, J. S. K. (2015). Population-based analysis of cholesteryl ester transfer protein identifies association between I405V and cognitive decline: the Cache County Study. *Neurobiology of Aging*, *36*(547), e1-3.

Journal Article, Academic Journal (Published)

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Journal Article, Professional Journal (Published)

Chuang, Y.-f., Breitner, J. C., Chiu, Y. L., Khachaturian, A., Hayden, K., Corcoran, C. D., Tschanz, J. T., Norton, M. C., Munger, R. G., Welsh-Bohmer, K. A., Zandi, P., For the Cache County Investigators (2014). Use of diuretics is associated with reduced risk of Alzheimer's disease: The Cache County Study. *Neurobiology of Aging*, *35*(11), 2429-35.

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Gilbert, M., Snyder, C., Corcoran, C. D., Norton, M. C., Lyketsos, C. G., Tschanz, J. T. (2014). The association of traumatic brain injury with rate of progression of cognitive and functional impairment in a population-based cohort of Alzheimer's disease: The Cache County Dementia Progression Study. *International Psychogeriatrics, 26*(10), 1593-1601.

Journal Article, Professional Journal (Published)

Snyder, C. M., Fauth, E., Wanzek, J., Piercy, K. W., Norton, M. C., Corcoran, C. D., Rabins, P.
 V., Lyketsos, C. G., Tschanz, J. T. (2014). Dementia caregivers' coping strategies and their relationship to health and well-being: The Cache County Study. *Aging Mental Health*, *5*, 1-10.

Journal Article, Public or Trade Journal (Published)

Ridge, P. G., Maxwell, T. J., Foutz, S. J., Bailey, M. H., Corcoran, C. D., Tschanz, J. T., Norton, M. C., Munger, R. G., O'Brien, E., Kerber, R. A., Cawthon, R. M., Kauwe, J. S. (2014).
 Mitochondrial genomic variation associated with higher mitochondrial copy number: The Cache County Study on Memory Health and Aging. *BMC Bioinformatics*, *15*(7), S6.

Journal Article, Public or Trade Journal (Published)

Sharp, A. R., Ridge, P. G., Bailey, M. H., Boehme, K. L., Norton, M. C., Tschanz, J. T., Munger, R. G., Corcoran, C. D., Kauwe, J. S., Alzheimer's Disease Neuroimaging Initiative (2014).

Population substructure in Cache County, Utah: The Cache County study. *BMC Bioinformatics*, *15*(7), S8.

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Ebbert, M. T., Ridge, P. G., Wilson, A. R., Sharp, A. R., Bailey, M., Norton, M. C., Tschanz, J. T., Munger, R. G., Corcoran, C. D., Kauwe, J. S. (2014). Population-based analysis of Alzheimer's disease risk alleles implicates genetic interactions. *Biological Psychiatry*, 75(9), 732-737.

Journal Article, Professional Journal (Published)

Peterson, D., Munger, C., Crowley, J., Corcoran, C. D., Cruchaga, C., Goate, A. M., Norton, M. C., Green, R. C., Munger, R. G., Breitner, J. C., Welsh-Bohmer, K. A., Lyketsos, C. G., Tschanz, J. T., Kauwe, J. S. (2014). Variants in PPP3R1 and MAPT are associated with more rapid functional decline in Alzheimer's disease: The Cache County Dementia Progression Study. *Alzheimer's and Dementia*, *10*(3), 366-371.

Journal Article, Professional Journal (Published)

Steinberg, M., Hess, K., Corcoran, C. D., Mielke, M. M., Norton, M. C., Breitner, J., Green, R., Leoutsakos, J.-M., Welsh-Bohmer, K., Lyketsos, C., Tschanz, J. T. (2014). Vascular risk factors and neuropsychiatric symptoms in Alzheiemr's disease: The Cache County Study. *International Journal of Geriatric Psychiatry*, 29(2), 153-159.

Journal Article, Professional Journal (Published)

Cruchaga, C., Karch, C. M., Jin, S. C., Benitez, B. A., Cai, Y., Guerreiro, R., Harari, O., Norton, J., Budde, J., Bertelsen, S., Jeng, A. T., Cooper, B., Skorupa, T., Carrell, D., Levitch, D., Hsu, S., Choi, J., Ryten, M., UK Brain Expression Consortium, Hardy, J., Ryten, M., Trabzuni, D., Weale, M. E., Ramasamy, A., Smith, C., Sassi, C., Bras, J., Gibbs, J. R., Hernandez, D. G., Lupton, M. K., Powell, J., Forabosco, P., Ridge, P. G., Corcoran, C. D., Tschanz, J. T., Norton, M. C., Munger, R. G., Schmutz, C., Leary, M., Demirci, F. Y., Bamne, M. N., Lopez, O. L., Ganguli, M., Medway, C., Turton, J., Lord, J., Braae, A., Barber, I., Brown, K., Alzheimer's Research UK Consortium, Passmore, P., Craig, D., Johnston, J., McGuinness, B., Todd, S., Heun, T., Kölsch, H., Kehoe, P. G., Hooper, N. M., Vardy, E. R., Mann, D. M., Pickering-Brown, S., Brown, K., Kalsheker, K., Lowe, J., Morgan, K., David Smith, A., Wilcock, G., Warden, D., Holmes, C., Pastor, P., Lorenzo-Betancor, O., Brkanac, Z., Scott, E., Topol, E., Morgan, K., Rogaeva, E., Singleton, A. B., Hardy, J., Kamboh, M. I., St. George-Hyslop, P., Cairns, N., Morris, J. C., Kauwe, J. S., Goate, A. M. (2014). Rare coding variants in the phospholipase D3 gene confer risk for Alzheimer's disease. *Nature*, *505*(7484), 550-554.

Journal Article, Professional Journal (Published)

Gonzalez Murcia, J. D., Schmutz, C., Munger, C., Perkes, A., Gustin, A., Peterson, M., Ebbert, M. T. W., Norton, M. C., Tschanz, J. T., Munger, R. G., Corcoran, C. D., Kauwe, J. S. K. (2013). Assessment of TREM2 rs75932628 association with Alzheimer's disease in a population-based sample: The Cache County Study. *Neurobiology of Aging, 34*(12), 2889:e11-e13.

Journal Article, Professional Journal (Published)

Wengreen, H., Munger, R. G., Nelson, C., Corcoran, C. D., Tschanz, J. T., Norton, M. C., Welsh-Bohmer, K. A. (2013). Prospective Study of DASH- and Mediterranean-style Dietary Patterns and Age-related Cognitive Change. 98(5), 1263-71.

Journal Article, Academic Journal (Published)

Wengreen, H., Munger, R. G., Cutler, A., Quach, A., Bowles, A., Corcoran, C. D., Tschanz, J. T., Norton, M. C., Welsh-Bohmer, K. (2013). Prospective study of dietary approaches to stop hypertension- and mediterranean-style dietary patterns and age-related cognitive change: The Cache County Study on Memory, Health and Aging. *American Journal of Clinical Nutrition*, *98*(5), 1263-1271.

Journal Article, Professional Journal (Published)

Piercy, K. W., Fauth, E. B., Norton, M. C., Pfister, R., Corcoran, C. D., Rabins, P. V., Lyketsos, C., Tschanz, J. T. (2013). Predictors of dementia caregiver depressive symptoms in a population: The Cache County Dementia Progression Study. *Journal of Gerontology: Psychological Sciences, 68*(6), 921-926.

Journal Article, Professional Journal (Published)

Norton, M. C., Clark, C., Fauth, E. B., Piercy, K. W., Pfister, R., Green, R. C., Corcoran, C. D., Rabins, P. V., Lyketsos, C. G., Tschanz, J. T. (2013). Caregiver personality predicts rate of cognitive decline in a community sample of persons with Alzheimer's Disease. The Dementia Progression Study. *International Psychogeriatrics*, 25(10), 1629-1637.

Journal Article, Academic Journal (Published)

Norton, M. C., Clark, C., Fauth, E. B., Piercy, K. W., Pfister, R., Green, R. C., Corcoran, C. D., Rabins, P. V., Lyketsos, C. G., Tschanz, J. T. (2013). Caregiver personality predicts rate of cognitive decline in a community sample of persons with Alzheimer's disease: The Cache County Dementia Progression Study. *International Psychogeriatrics*, 25, 1629-1637.

Journal Article, Professional Journal (Published)

Tschanz, J., Pfister, R., Steffens, D., Corcoran, C. D., Smith, K., Østbye, T., Schwartz, S.,
 Welsh-Bohmer, K., Norton, M. C. (2013). Stressful events in late-life: Effects on cognitive decline: The Cache County Study. *International Journal of Geriatric Psychiatry*, 28, 821-830.

Journal Article, Academic Journal (Published)

Greene, D., Tschanz, J. T., Smith, K. R., Ostbye, T., Corcoran, C. D., Welsh-Bohmer, K. A., Norton, M. C. (2013). Impact of Offspring Death on Cognitive Health in Late Life: The Cache County Study. *The American journal of geriatric psychiatry : official journal of the American Association for Geriatric Psychiatry*.

Journal Article, Academic Journal (Published)

Tschanz, J. T., Pfister, R., Wanzek, J., Corcoran, C. D., Smith, K., Tschanz, B. T., Steffens, D. C., Østbye, T., Welsh-Bohmer, K. A., Norton, M. C. (2013). Stressful life events and cognitive decline in late life: moderation by education and age. The Cache County Study. *International journal of geriatric psychiatry*, 28(8), 821-30.

Journal Article, Academic Journal (Published)

Fauth, E. B., Schwartz, S., Tschanz, J. T., Ostbye, T., Corcoran, C. D., Norton, M. C. (2013). Baseline disability in activities of daily living predicts dementia risk even after controlling for global cognitive ability and depressive symptoms. *International Journal of Geriatric Psychiatry*, 28(6), 597-606.

Journal Article, Professional Journal (Published)

Peterson, D., Crowley, J., Munger, C., Corcoran, C. D., Cruchaga, C., Goate, A., Norton, M. C., Green, R., Munger, R. G., Breitner, J. C., Welsh-Bohmer, K., Lyketsos, C., Kauwe, J. S. (2013). Variants in PPP3R1 and MAPT are associated with more rapid functional decline in Alzheimer's disease: The Cache County Dementia Progression Study. *Alzheimer's and Dementia*.

Journal Article, Academic Journal (Published)

Rabins, P. V., Schwartz, S., Black, B. S., Corcoran, C. D., Fauth, E. B., Mielke, M., Christensen, J., Lyketsos, C., Tschanz, J. T. (2013). Predictors of progression to severe Alzheimer Disease in an incidence sample. *Alzheimer's and Dementia*, 9(2), 204-207.

Journal Article, Professional Journal (Published)

Piercy, K. W., Corcoran, C. D., Fauth, E. B., Norton, M. C., Rabins, P. V., Tschanz, B. T., Deberard, M. S., Snyder, C., Smith, C., Lee, L., Lyketsos, C. G. (2013). Caregiver coping strategies predict rate of cognitive and functional decline in dementia: The Cache County Dementia Progression Study. *American Journal of Geriatric Psychiatry*, 21(1), 57-66.

Journal Article, Academic Journal (Published)

Tschanz, J. T., Piercy, K. W., Corcoran, C. D., Fauth, E. B., Norton, M. C., Rabins, P. V., Tschanz, B. T., Deberard, M. S., Snyder, C., Smith, C., Lee, L., Lyketsos, C. G. (2013). Caregiver coping strategies predict cognitive and functional decline in dementia: The Cache County Dementia Progression Study. *The American journal of geriatric psychiatry : official journal of the American Association for Geriatric Psychiatry, 21*(1), 57-66.

Journal Article, Professional Journal (Published)

Ridge, P., Maxwell, T. J., Corcoran, C. D., Norton, M. C., Tschanz, J. T., O'Brien, E., Kerber, R. A., Cawthon, R. M., Munger, R. G., Kauwe, J. S. (2012). Mitochondrial genomic analysis of late onset Alzheimer's disease reveals protective haplogroups H6A1A/H6A1B. *PLoS*, 7(9), e45134.

Journal Article, Professional Journal (Published)

Leoutsakos, J. M., Han, D., Mielke, M., Forrester, S. N., Tschanz, J. T., Corcoran, C. D., Green, R., Norton, M. C., Welsh-Bohmer, K., Lyketsos, C. (2012). Effects of General Medical Health on Alzheimer Progression: the Cache County Dementia Progression Study. *International Journal of Psychogeriatrics*, 24(10), 1561-70.

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Presentations Given

- Tschanz, J. T., Rattinger, G., Matyi, J., Sanders, C., Vernon, E. K., Corcoran, C. D., Kauwe, J. K., Buhusi, M. C., Gerontological Society of America Annual Meeting, "Sex differences in Neurotrophin Genes in the risk for Alzheimer's Disease," Gerontological Society of America. (2015).
- Rattinger, G. B., Matyi, J., Kauwe, J., Sanders, C., Corcoran, C. D., Norton, M. C., Munger, R. G., Buhusi, M. C., Tschanz, J. T., Alzheimer's Association International Conference, "Do medications that affect brain derived neurotrophic factor (BDNF) modify the associations between BDNF genotypes and cognitive functioning in older adults? The Cache County Study," Alzheimer's Association, Washington, D.C. (July 18, 2015 - July 23, 2015).
- Rattinger, G. B., Behrens, S., Schwartz, S., Corcoran, C. D., Piercy, K. W., Norton, M. C., Fauth, E. B., Lyketsos, C., Tschanz, J. T., Alzheimer's Association International Conference, "How do neuropsychiatric symptoms in persons with Dementia affect caregiver physical and mental health over time? The Cache County Dementia Progression Study," Alzheimer's Association, Washington, D.C. (July 18, 2015 - July 23, 2015).
- Matyi, J., Kauwe, J., Sanders, C., Rattinger, G. B., Corcoran, C. D., Norton, M. C., Munger, R. G., Buhusi, M. C., Tschanz, J. T., Alzheimer's Association International Conference, "Neurotrophin single nucleotide polymorphisms and cognitive functioning in older adults: The Cache County Study," Alzheimer's Association, Washington, DC. (July 18, 2015 - July 23, 2015).
- Tschanz, J. T., Sanders, C. J., Wengreen, H., Schwartz, S., Behrens, S., Corcoran, C. D., Lyketsos, C., Alzheimer's Association International Conference, "Nutritional status and Neuropsychiatric symptoms in Dementia: The Cache County Dementia Study," Alzheimer's Association, Washington, D.C. (July 18, 2015 - July 23, 2015).
- Sanders, C. J., Wengreen, H., Schwartz, S., Behrens, S., Corcoran, C. D., Lyketsos, C., Tschanz, J. T., Alzheimer's Association International Conference, "Nutritional status and severe Dementia, institutionalization and mortality: The Cache County Dementia Progression Study," Alzheimer's Association, Washington, D.C. (July 18, 2015 - July 23, 2015).
- Sanders, C., Wengreen, H., Schwartz, S., Behrens, S., Corcoran, C. D., Lyketsos, C. G., Tschanz, J. T., Neuropsychological Society Meeting, "Nutritional status and neuropsychological functioning in persons with dementi: The Cache County Dementia Progression Study," Neuropsychological Society, Denver, CO. (February 2015).
- Tschanz, J. T., Sanders, C., Wengreen, H., Schwartz, S., Behrens, S., Corcoran, C. D., Lyketsos, C., Annual Meeting of the Gerontological Society of America, "Nutritional status and neuropsychiatric symptoms in dementia: The Cache County Dementia Study," Gerontological Society of America, Washington DC. (November 2014 - 2014).
- Milman, L., Faroqi-Shah, Y., Corcoran, C. D., Clinical Aphasiology Conference, "Normative data for the WAB-R: A comparison of monolingual English speakers, Asian Indian-English bilinguals, and Spanish-English bilinguals.," St. Simons Island, GA. (May 29, 2014).
- Corcoran, C. D. (Invited Lecture), International Webinar, "Exact Nonparamatric Inference for Correlated Categorical Data," Cytel Software Corporation. (April 7, 2014).
- Corcoran, C. D., Annual Meeting of the Utah Chapter of the American Statistical Association, "The Perils of P-Values: A Case Study in Statistical Genetics," American Statistical Association, Utah Chapter, Salt Lake City, UT. (March 25, 2014).

- Corcoran, C. D. (Presenter & Author), Boston University Department of Biostatistics Seminar, "Permutation-Based Tests and Rare Variants in Genetic Association Studies," Department of Biostatics, Boston University, Boston University, Boston, MA. (March 20, 2014).
- Corcoran, C. D. (Presenter & Author), Brigham Young University Department of Statistics Seminar, "Doctoral Research Programs in Statistics at Utah State University," Brigham Young University, Brigham Young University, Provo, UT. (February 2014).
- Rattinger, G. B., Schwartz, S., Sanders, C., Corcoran, C. D., Fauth, E. B., Norton, M. C., Lyketsos, C. G., Tschanz, J. T., Annual Conference for the Gerontological Society of America, "Effect of caregiver relationship closeness and coping strategies on costs of care in the Cache County Dementia Progression Study Cohort," Gerontological Society of America, New Orleans, LA. (November 2013).
- Corcoran, C. D. (Presenter & Author), Food and Drug Administration Workshop, "StatXact Training Course," Food and Drug Administration, Chevy Chase, MD. (September 19, 2013).
- Corcoran, C. D. (Presenter & Author), Joint Statistical Meetings, "New StatXact Toolkit for Correlated Categorical Data," American Statistical Association and International Biometric Society, Montreal, Quebec, Canada. (July 2013 - August 2013).
- Rattinger, G. (Presenter & Author), Schwartz, S. (Author Only), Corcoran, C. D. (Author Only), Zuckerman, I. (Author Only), Mullins, D. (Author Only), Norton, M. C. (Author Only), Fauth, E. B. (Author Only), Leoutsakos, J. (Author Only), Lyketsos, C. (Author Only), (Author Only), Alzheimer's Association International Conference, "How does dementia severity affect the costs of dementia care? Effect of dementia severity on costs of care in the Cache County Dementia Progression Study Cohort," Alzheimer's Association, Boston, MA. (July 2013).
- Rattinger, G. B., Schwartz, S., Corcoran, C. D., Zuckerman, I. H., Mullins, C. D., Norton, M. C., Fauth, E. B., Leoutsakos, J. M., Lyketsos, C. G., Tschanz, J. T., Alzheimer's Association International Conference on Alzheimer's Disease, "Effect of dementia severity on costs of care in the Cache County Dementia Progression Study Cohort," Alzheimer's Association, Boston, MA. (July 2013).
- Ebbert, M. T. W., Ridge, P. G., Wilson, A. R., Sharp, A. R., Bailey, M., Norton, M. C., Tschanz, J. T., Munger, R. G., Corcoran, C. D., Kauwe, J. S. K., Alzheimer's Association International Conference on Alzheimer's Disease, "Late-onset Alzheimer's disease risk alleles provide evidence of important gene-gene interactions," Alzheimer's Association, Boston, MA. (July 2013).
- Norton, M. C., Munger, R. G., Tschanz, J. T., Corcoran, C. D., Smith, K. R., Alzheimer's Association International Conference on Alzheimer's Disease, "Multiple deaths of first-degree relatives during childhood predicts inflammation in late-life," Alzheimer's Association, Boston, MA. (July 2013).
- Sanders, C., Wengreen, H., Corcoran, C. D., Schwartz, S., Norton, M. C., Lyketsos, C. G., Tschanz, J. T., Alzheimer's Association International Conference on Alzheimer's Disease, "Nutritional status and progression of dementia: The Cache County Dementia Progression Study," Alzheimer's Association, Boston, MA. (July 2013).
- Tschanz, J. T., Schwartz, S., Gilbert, M., Wanzek, J., Sanders, C., Mielke, M., Corcoran, C. D., Norton, M. C., Lyketsos, C. G., Alzheimer's Association International Conference on Alzheimer's Disease, "Vascular factors as predictors of severe dementia and mortality in Alzheimer's disease," Alzheimer's Association, Boston, MA. (July 2013).
- Corcoran, C. D. (Presenter & Author), Seventh International Workshop on Simulation, "Monte Carlo Sampling Using Parallel Processing for Multiple Testing in Genetic Association Studies," University of Bologna and University of Padova, Rimini, Italy. (May 22, 2013).
- Fauth, E. B. (Presenter & Author), Schwartz, S. (Author Only), Norton, M. C. (Author Only), Corcoran, C. D. (Author Only), Piercy, K. W. (Author Only), Lyketsos, C. (Author Only), Tschanz, J. T. (Author Only), Gerontological Society of America Annual meeting, "Care Dyad Relationship Closeness Predicts Fewer Increases in Neuropsychiatric Symptoms over Time in Persons with Dementia," Gerontological Society of America, San Diego, CA. (November 17, 2012).
- Corcoran, C. D. (Presenter & Author), Joint Statistical Meetings, "Twenty-Five Years of Cytel and StatXact: Where We've Been and Where We're Going," American Statistical Association and International Biometric Society, San Diego, CA. (July 2012 - August 2012).
- Corcoran, C. D. (Presenter & Author), University of Utah Department of Family and Preventive Medicine Seminar, "Exact Tests for Correlated Data," University of Utah College of Family and Preventive Medicine, University of Utah, Salt Lake City, UT. (May 2012).
- Corcoran, C. D. (Presenter & Author), University of Utah Department of Family and Preventive Medicine Seminar, "Exact Methods in Data Analysis," University of Utah Department of Family and Preventive Medicine, University of Utah, Salt Lake City, UT. (April 2012).
- Norton, M. C., Hess, K., Corcoran, C. D., Piercy, K. W., Fauth, E. B., Rabins, P., Green, R., Lyketsos, C., Tschanz, J. T., International Conference on Alzheimer's Disease, "Caregiver Agreeableness, Neuroticism, Openness and Extraversion Associated with Rate of Cognitive Decline in Persons with Alzheimer's Disease.," Paris, France. (July 2011).
- Tschanz, J. T., Corcoran, C. D. (Author Only), Norton, M. C., Piercy, K., Rabins, P. V., Fauth, E., DeBerard, M. S., Snyder, C., Smith, C., Lee, S., Morrison, A., Lyketsos, C. G., International Conference on Alzheimer's Disease and Other Disorders, "Caregiver Coping Strategies Predict Cognitive Decline in Dementia: The Cache County Dementia Progression Study," Honolulu, HI. (July 2010).
- Treiber, K. A., Carlson, M., Corcoran, C. D. (Author Only), Foley, B., Stein, D., DeBerard, M. S., Norton, M., Piercy, K., Welsh-Bohmer, K. A., Breitner, J. S., Lyketsos, C. G., Tschanz, J., International Conference on Alzheimer's Disease and Other Disorders, "Cognitive Activity and Decline in Alzheimer's Disease: The Cache County Study," Honolulu, HI. (July 2010).
- Norton, M. C., Fauth, E., Piercy, K., Corcoran, C. D. (Author Only), Hess, K., Morrison, A., Rabins, P. V., Lyketsos, C. G., Tschanz, J., International Conference on Alzheimer's Disease and Other Disorders, "Higher caregiver agreeableness predicts slower cognitive decline in persons with Alzheimer's Disease: the Dementia Progression Study," Honolulu, HI. (July 2010).
- Munger, R. G., Cawthon, R. M., Corcoran, C. D. (Author Only), Tschanz, J., Norton, M. C., Smith, K., Zandi, P., Welsh-Bohmer, K., International Conference on Alzheimer's Disease and Other Disorders, "Prospective study of mitochondrial DNA copy number and incident dementia in Cach County, UTah," Honolulu, HI. (July 2010).
- Corcoran, C. D., Pieper, C., Zandi, Z., Norton, M. N., Welsh-Bohmer, K., Breitner, J. S., Lyketsos, C. G., Tschanz, J. T., International Congress on Alzheimer's Disease, "A joint analysis of cognitive, functional, and neuropsychiatric symptom change in the Cache County Dementia Progression Study.," Honolulu, HI. (July 2010).

- Corcoran, C. D. (Presenter & Author), Pieper, C., Zandi, Z., Norton, M. N., Welsh-Bohmer, K., Breitner, J. S., Lyketsos, C. G., Tschanz, J. T., International Congress on Alzheimer's Disease, "Predictors of decline in Alzheimer's: A joint analysis of cognitive, functional, and neuropsychiatric symptom change in the Cache County Dementia Progression Study," Honolulu, HI. (July 2010).
- Corcoran, C. D. (Invited Lecture), Senchaudhuri, P., Mehta, C., Invited Seminar, University of Utah Medical School, "Using the StatXact Correlated Data Module for Exact Tests with Clustered Data," Salt Lake City, UT. (February 2010).
- Corcoran, C. D. (Presenter & Author), Senchaundhuri, P., Mehta, C., Conference of the International Indian Statistical Association, "New Software Tools for Exact Tests with Correlated Data," Visakhapatnam, India. (January 2010).
- Corcoran, C. D. (Invited Lecture), Senchaudhuri, P., Invited Seminar, Brigham Young University, "Exact Tests for Contingency Tables with Correlated Data," Department of Statistics, Provo, UT. (December 2009).
- Norton, M. C., Smith, K. R., Ostbye, T., Tschanz, J. T., Corcoran, C. D. (Presenter Only), Schwartz, S., Piercy, K. W., Rabins, P. V., Steffens, D. C., Breitner, J. C., Welsh-Bohmer, K. A., International Conference on Alzheimer's Disease, "Spousal dementia caregiving as a risk factor for incident dementia," Vienna, Austria. (2009).
- Tschanz, J. T., Corcoran, C. D., Green, R. C., Munger, R. G., Mielke, M. M., Norton, M. C., Rabins, P. V., Welsh-Bohmer, K. A., Buckley, T., Breitner, J. C., Lyketsos, C. G., International Conference on Alzheimer's Disease, "Interaction between C-Reactive Protein level and APOE genotype in predicting rate of progression in Alzheimer's disease," The Cache County Dementia Progression Study, Vienna, Austria. (2009).
- Corcoran, C. D. (Invited Lecture), Munger, R. G., Cawthon, R., Invited Seminar, Harvard University, "Alzheimer's Disease Risk, Cognitive Decline, and Mitochondrial Function," Department of Biostatistics, Cambridge, MA. (October 2009).
- Norton, M. C., Smith, K. R., Ostbye, T., Tschanz, J. T., Corcoran, C. D., Schwartz, S., Piercy, K. W., Rabins, P. V., Steffens, D. C., Breitner, J. C. S., Welsh-Bohmer, K. A., International Conference on Alzheimer's Disease, "Spousal dementia caregiving as a risk factor for incident dementia: The Cache County Study.," Vienna, Austria. (July 2009).
- Corcoran, C. D. (Invited Lecture), Pieper, C., Tschanz, J., Invited Seminar, Brigham Young University, "Dynamical Correlations for Analyzing Multivariate Rates of Change, with Application to the Cache County Memory Study," Department of Statistics, Provo, UT. (January 2009).
- Tschanz, J. T., Cook, L., Corcoran, C. D., Norton, M. C., Mielke, M., Rabins, P., Welsh-Bohmer, K. A., Treiber, K., Buckley, T., Breitner, J. C., Lyketsos, C., 36th Annual Meeting of the International Neuropsychological Society, "Gender Differences in the Trajectory of Cognitive Decline in Alzheimer's Disease in the Cache County Population," Waikola Hawaii. (2008).
- Tschanz, J., Corcoran, C. D. (Author Only), Shao, H., Zandi, P., Norton, M., Mielke, M., Green, R., Rabins, P., Steinberg, M., Welsh-Bohmer, K., Breitner, J., Lyketsos, C., International Conference on Alzheimer's Disease, "Neuropsychiatric Symptoms and Mortality in a Populationbased Sample of Incident Alzheimer's Disease and other Dementias: The Cache County Dementia Progression Study," Chicago, IL. (2008).
- Treiber, K., Shao, H., Zandi, P., Steinberg, M., Corcoran, C. D. (Author Only), Cook, L., Norton, M., Green, R., Piercy, K., Rabins, P., Breitner, J., Welsh-Bohmer, K., Lyketsos, C., Tschanz,

J., International Conference on Alzheimer's Disease, "Neuropsychiatric Syndromes in Alzheimer's disease: Relationship to Cognitive and Functional Progression: The Cache County Dementia Progression Study," Chicago, IL. (2008).

- Treiber, K., Shao, H., Zandi, P., Steinberg, M., Corcoran, C. D., Cook, L., Norton, M. C., Green, R., Piercy, K. W., Rabins, P., Breitner, J. C. S., Welsh-Bohmer, K. A., Lyketsos, C., Tschanz, J. T., International Conference on Alzheimer's Disease, "Neuropsychiatric syndromes in Alzheimer's disease: Relationship to Cognitive and Functional Progression: The Cache County Dementia Progression Study.," The Cache County Dementia Progression Study, Chicago, IL. (2008).
- Corcoran, C. D., Pieper, C., Zandi, p., Norton, M. C., Welsh-Bohmer, K., Breitner, J., Lyketsos, C., Tschanz, J. T., International Conference on Alzheimer's Disease, "Modeling dementia trajectories: An application of dynamical correlations to age-related traits: The Cache County Dementia Progression Study," The Cache County Dementia Progression Study, Chicago, IL. (2008).
- Tschanz, J. T., Corcoran, C. D., Shao, H., Zandi, P., Norton, M. C., Mielke, M., Green, R., Rabins, P., Steinberg, M., Welsh-Bohmer, K., Breitner, J., Lyketsos, C., International Conference on Alzheimer's Disease, "Neuropsychiatric Symptoms and Mortality in a Population-based Sample of Incident Alzheimer's Disease and other Dementias: The Cache County Dementia Progression Study," The Cache County Dementia Progression Study., Chicago, IL. (2008).
- Corcoran, C. D., Senchaudhuri, P., Joint Statistical Meetings, "Exact Trend Tests for Clustered 2 X C Tables," Denver, CO. (August 2008).
- Corcoran, C. D. (Presenter & Author), Pieper, C., Zandi, P., Norton, M., Welsh-Bohmer, K., Breitner, J., Lyketsos, C., Tschanz, J., International Congress on Alzheimer's Disease, "Modeling dementia trajectories: An application of dynamical correlations to age-related traits in the Cache County Dementia Progression Study," Chicago, IL. (July 2008).
- Corcoran, C. D. (Invited Lecture), Zandi, P., Pieper, C., Tschanz, J., Invited Seminar, Harvard University, "Assessing Multiple Trajectories of Dementia Symptoms: The Cache County Dementia Progression Study," Department of Biostatistics, Cambridge, MA. (May 2008).
- Tschanz, J., Cook, L., Corcoran, C. D. (Author Only), Norton, M., Mielke, M., Rabins, P., Welsh-Bohmer, K. A., Trieber, K., Buckley, T., Breitner, J. S., Lyketsos, C., 36th Annual Meeting of the International Neuropsychological Society, "Gender Differences in the Trajectory of Cognitive Decline in Alzheimer's Disease in the Cache County Population," Waikola, Hawaii. (February 2008).
- Breitner, J. C., Khachaturian, A., Zandi, P., Hayden, K., Skoog, I., Tschanz, J. T., Norton, M. C., Munger, R. G., Welsh-Bohmer, K., Rosenberg, P., Mielke, M., Corcoran, C. D., Lyketsos, C., Rabins, P., Green, R., 11th International Congress of the International Federation of Psychiatric Epidemiology, "Cardiovascular risk factors for incidence and/or progression of Alzheimer's disease: The Cache County Studies," The Cache County Studies, Göteborg, Sweden. (2007).
- Mielke, M. M., Tschanz, J. T., Hayden, K. M., Rosenberg, P. B., Corcoran, C. D., Norton, M. C., Rabins, P. V., Green, R. C., Welsh-Bohmer, K. A., Breitner, J. C., Munger, R. G., Lyketsos, C. G., 2007 Vascular, Behavioural and Cognition (VAS-COG) Conference, "Interaction Between APOE ε4 and Vascular Factors Predict Rate of Cognitive and Functional Decline in Alzheimer's Disease," San Antonio, TX. (2007).

- Mielke, M. M., Tschanz, J. T., Norton, M. C., Corcoran, C. D., Rabins, P., Steinberg, M., Carlson, M., Green, R., Breitner, J. C., Welsh-Bohmer, K., Lyketsos, C. G., Alzheimer Prevention Conference, "Use of acetylcholinesterase inhibitors and memantine in a population-based study of incident AD cases: Prevalence of use, characteristics, and relation to mortality," Washington, D.C. (2007).
- Mielke, M. M., Tschanz, J., Norton, M., Corcoran, C. D. (Author Only), Rabins, P., Steinberg, M., Carlson, M., Green, R., Breitner, J. S., Welsh-Bohmer, K., Lyketsos, C. G., Alzheimer Prevention Conference, "Use of acetylcholinesterase inhibitors and memantine in a population-based study of incident AD cases: Prevalence of use, characteristics, and relation to mortality.," Washington D.C. (2007).
- Mielke, M. M., Tschanz, J., Hayden, K. M., Rosenberg, P. B., Corcoran, C. D. (Author Only), Norton, M., Rabins, P. V., Green, R. C., Welsh-Bohmer, K. A., Breitner, J. S., Munger, R. G., Lyketsos, C. G., Vascular, Behavioural and Cognition Conference, "Interaction Between APOE epison4 and Vascular Factors Predict Rate of Cognitive and Functional Decline in Alzheimer's Disease," VAS-COG, San Antonio, TX. (2007).
- Tschanz, J., Shao, H., Zandi, P., Steinberg, M., Corcoran, C. D. (Author Only), Norton, M., Green, R., Piercy, K., Rabins, P., Cook, L., Lyketsos, C., 60th Annual Scientific Meeting of the Gerontological Society of America, "Neuropsychiatric syndromes in Alzheimer's disease: Association with Rate of Cognitive Progression. The Cache County Study," San Francisco, CA. (November 2007).
- Treiber, K., Tschanz, J., Corcoran, C. D. (Author Only), Stein, D., Steinberg, M., Norton, M., Green, R., Rabins, P., Piercy, K., Welsh-Bohmer, K., Lyketsos, C., 60th Annual Scientific Meeting of the Gerontological Society of America, "Point prevalence of neuropsychiatric symptoms in Alzheimer's disease and vascular dementia: The Cache County Study," San Francisco, CA. (November 2007).
- Norton, M., Tschanz, J., Ostbye, T., Corcoran, C. D. (Author Only), Cook, L., Breitner, J., Welsh-Bohmer, K. A., 60th Annual Scientific Meeting of the Gerontological Society of America, "Stressful life events and cognitive decline - The Cache County Study," San Francisco, CA. (November 2007).
- Norton, M. C., Tschanz, J. T., Ostbye, T., Corcoran, C. D., Cook, L., Breitner, J., Welsh-Bohmer, K., 60th Annual Scientific Meeting of the Gerontological Society of America, "Stressful life events and cognitive decline – The Cache County Study," The Cache County Study, San Francisco, CA. (November 2007).
- Norton, M. C., Tschanz, J. T., Ostbye, T., Corcoran, C. D. (Author Only), Breitner, J. S., Welsh-Bohmer, K. A., World Conference of Stress, "Widow(er)hood increases risk for subsequent dementia, especially for women. The Cache County Study," Budapest, Hungary. (August 2007).
- Norton, M. C., Tschanz, J. T., Ostbye, T., Corcoran, C. D., Zandi, P. P., Breitner, J. C., Welsh-Bohmer, K. A., World Conference of Stress, "Widow(er)hood increases risk for subsequent dementia, especially for women. The Cache County Study," The Cache County Study, Budapest, Hungary. (August 2007).
- Corcoran, C. D. (Presenter & Author), Pieper, C., Zandi, P., Tschanz, J., Joint Statistical Meetings, "Invited Presentation," Salt Lake City, UT. (July 2007).
- Breitner, J. S., Khachaturian, A., Zandi, P., Hayden, K., Skoog, I., Tschanz, J., Norton, M., Munger, R. G., Welsh-Bohmer, K., Rosenberg, P., Mielke, M., Corcoran, C. D. (Author Only), Lyketsos, C., Rabins, P., Green, R., 11th International Congress of the International

Federation of Psychiatric Epidemiology, "Cardiovascular risk factors for incidence and/or progression of Alzheimer's disease: The Cache County Studies," Goteborg, Sweden. (May 3, 2007 - May 6, 2007).

- Buckley, T., Tschanz, J., Norton, M., Corcoran, C. D. (Author Only), Welsh-Bohmer, K. A., Breitner, J., International Neuropsychological Society Conference, "Metacognitive judgments and change in cognitive and functional abilities in a population of elderly individuals. The Cache County Study," Portland, OR. (February 2007).
- Buckley, T., Tschanz, J. T., Norton, M. C., Corcoran, C. D., Welsh-Bohmer, K., Breitner, J., International Neuropsychological Society Conference, "Metacognitive judgments and change in cognitive and functional abilities in a population of elderly individuals. The Cache County Study," The Cache County Study, Portland OR. (February 2007).
- Tschanz, J., Corcoran, C. D. (Author Only), Norton, M., Mielke, M., Rabins, P., Treiber, K., Welsh-Bohmer, K. A., Breitner, J., Lyketsos, C., International Neuropsychological Society Conference, "Rate of cognitive and functional decline in Alzheimer's disease in the Cache County Population," Portland, OR. (February 2007).
- Tschanz, J. T., Corcoran, C. D., Norton, M. C., Mielke, M., Rabins, P., Treiber, K., Welsh-Bohmer, K. A., Breitner, J., Lyketsos, C., the International Neuropsychological Society Conference, "Rate of cognitive and functional decline in Alzheimer's disease in the Cache County Population," Portland OR. (February 2007).
- Corcoran, C. D. (Invited Lecture), Invited Seminar, Harvard University, "Family-based Association Studies: The Cache County Study on Memory Health and Aging, and the Utah Population Database," Department of Biostatistics. (October 2006).
- Corcoran, C. D. (Presenter & Author), Senchaudhuri, P., Coull, B., Joint Statistical Meetings, "Exact Inference for Correlated Categorical Data," Seattle, WA. (August 2006).
- Corcoran, C. D. (Presenter & Author), Tschanz, J., Steinberg, M., Schwartz, S., Norton, M., Welsh-Bohmer, K., Breitner, J., Lyketsos, C., 10th International Conference on Alzheimer's Disease and Related Disorders, "Longitudinal Course of Neuropsychiatric Symptoms in Dementia. The Cache County Study," Madrid, Spain. (July 2006).
- Corcoran, C. D., Tschanz, J. T., Steinberg, M., Schwartz, S., Norton, M. C., Welsh-Bohmer, K., Breitner, J., Lyketsos, C., 10th International Conference on Alzheimer's Disease and Related Disorders, "Longitudinal Course of Neuropsychiatric Symptoms in Dementia. The Cache County Study," The Cache County Study. (July 2006).
- Tschanz, J. T., Cook, L., Corcoran, C. D., Norton, M. C., Mielke, M., Rosenberg, P., Buckley, T., Clay, C., Welsh-Bohmer, K., Breitner, J., C. L., 10th International Conference on Alzheimer's Disease and Related Disorders, "Vascular factors and the Rate of Cognitive Decline in Dementia. The Cache County Study.," The Cache County Study. (July 2006).
- Mielke, M. M., Rosenberg, P., Tschanz, J. T., Cook, L., Corcoran, C. D., Norton, M. C., Welsh-Bohmer, K. A., Breitner, J. C., Lyketsos, C., 10th International Conference on Alzheimer's Disease and Related Disorders, "Vascular Risk Factors and Functional Decline in Dementia," the Cache County Study. (July 2006).
- Tschanz, J. T., Cook, L., Corcoran, C. D. (Author Only), Norton, M., Mielke, M., Rosenburg, P., Buckley, T., Clay, C., Welsh-Bohmer, K., Breitner, J., Lyketsos, C., International Conference on Alzheimer's Disease and Related Disorders, "Vascular factors and the Rate of Cognitive Decline in Dementia. The Cache County Study," Madrid, Spain. (July 2006).

- Treiber, K., Tschanz, J., Corcoran, C. D. (Author Only), Stein, D., Steinberg, M., Norton, M., Welsh-Bohmer, K., Breitner, J., Lyketsos, C., International Conference on Alzheimer's Disease and Related Disorders, "Vascular Factors are Associated with Increased Risk of Neuropsychiatric Symptoms in Alzheimer's Disease. The Cache County Study," Madrid, Spain. (July 2006).
- Mielke, M. M., Rosenburg, P., Tschanz, J., Cook, L., Corcoran, C. D. (Author Only), Norton, M., Welsh-Bohmer, K. A., Breitner, J. C., Lyketsos, C., International Conference on Alzheimer's Disease and Related Disorders, "Vascular Risk Factors and Functional Decline in Dementia," Madrid, Spain. (July 2006).
- Corcoran, C. D. (Invited Lecture), Invited Seminar, University of Pennsylvania, "Family-based Association Studies: The Cache County Study on Memory Health and Aging, and the Utah Population Database," Department of Biostatistics. (March 2006).
- Corcoran, C. D. (Invited Lecture), Invited Seminar, Cytel Software Corporation, "The Exact Family Based Association Test," Cambridge, MA. (February 2006).
- Charoonruk, G., Munger, R. G., Wengreen, H., Corcoran, C. D., Hayden, K., Bastian, L., Tschanz, J. T., Norton, M. C., Welsh-Bohmer, K., Alzheiemr's Association International conference on Prevention of Dementia: Early diagnosis and intervention, "Diabetes Mellitus and risk of Alzheimer's disease in the Cache County Study on Memory, Health and Aging," the Cache County Study on Memory, Health and Aging, Washington, D.C. (2005).
- Charoonruk, G., Munger, R. G., Wengreen, H., Corcoran, C. D. (Author Only), Hayden, K., Bastian, L., Tschanz, J., Norton, M., Welsch-Bohmer, K., Alzheimer's Association International conference on Prevention of Dementia: Early diagnosis and intervention, "Diabetes Mellitus and risk of Alzheimer's disease in the Cache County Study on Memory, Health and Aging," Washinton, D.C. (2005).
- Wengreen, H. J., Munger, R. G., Corcoran, C. D. (Author Only), Zandi, P., Tschanz, J., Norton, M., Welsh-Bohmer, K., Alzheimer's Association International Conference on Prevention of Dementia: Early diagnosis and intervention, "Fruit and vegetable intake and cognitive function in the elderly: The Cache County Study on Memory, Health and Aging," Washington, D.C. (2005).
- Corcoran, C. D. (Author Only), Alzheimer's Association International Conference on Prevention of Dementia: Early diganosis and intervention, "Does Vitamine E use protect against dementia or increase the risk of mortality," Washington, D.C. (2005).
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- Wengreen, H., Munger, R. G., Corcoran, C. D., Zandi, P., Tschanz, J. T., Norton, M. C., Welsh-Bohmer, K., the Alzheiemr's Association International conference on Prevention of Dementia: Early diagnosis and intervention, "Fruit and vegetable intake and cognitive function in the elderly: The Cache County Study on Memory, Health and Aging," The Cache County Study on Memory, Health and Aging, Washington, D.C. (2005).

- Schneiter, K., Corcoran, C. D., Laird, N., The Western North American Region of The International Biometric Soceity, "Exact Family Based-Association Tests for Multiallelic Data," International Biometric Soceity, Fairbanks, AK. (2005).
- Corcoran, C. D., Canadian Society of Epidemiology and Biostatistics Annual Meeting, "Exact inference for epidemiology and statistics," Toronto, ON. (July 2005).
- Norton, M., Steffens, D., Toone, L., Tschanz, J., Hayden, K., Corcoran, C. D. (Author Only), Klein, L., Zandi, P., Breitner, J. S., Welsh-Bohmer, K., Annual Meeting of the Gerontological Society of America, "Late-life Depression, Mild Cognitive Impairment, APOE and their Interactive Effects on 3-Year Conversion to Dementia.," Washington D.C. (November 2004).
- Benson-Lensegrav, T., Tschanz, J., Masters, K. S., Carlson, M. C., Corcoran, C. D. (Author Only), Lykestos, C., Heath, E., Leslie, C., Munger, R. G., Ostbye, T., Welsh-Bohmer, K., Norton, M., Hayden, L., Annual Meeting of the American Psychological Association, "Sedentary Lifestyle Increases Dementia Risk: The Cache County Study.," Honolulu, HI. (July 2004).
- Steinberg, M., Corcoran, C. D. (Author Only), Huber, C., Welsh-Bohmer, K., Zandi, P., Breitner, J. S., Tschanz, J., Lyketsos, C., International Conference on Alzheimer's Disease and Related Disorders, "A Longitudinal Model for Neuropsychiatric Symptoms in Dementia: The Cache County Study," Philadelphia, PA. (July 2004).
- Toone, L., Tschanz, J., Rabins, P. V., Steinberg, M., Onyike, C., Corcoran, C. D. (Author Only), Norton, M., Welsh-Bohmer, K., Breitner, J., Zandi, P., Lykestos, C. G., International Conference on Alzheimer's Disease and Related Disorders, "A Population Based Study of Medical Co-Morbidity in Early Dementia and Mild Cognitive Syndrome: Association with Functional and Cognitive Impairment," Philadelphia, PA. (July 2004).
- Wengreen, H., Munger, R. G., Corcoran, C. D. (Author Only), Zandi, P., Tschanz, J., Norton, M., Welsh-Bohmer, K., Skoog, I., Breitner, J., International Conference on Alzheimer's Disease and Related Disorders, "Antioxidant Intake and Cognitive Function of Elderly Participants in The Cache County, Utah Study on Memory, Health and Aging.," Philadelphia, PA. (July 2004).
- Charoonruk, G., Munger, R. G., Wengreen, H., Corcoran, C. D. (Author Only), Tschanz, J., Norton, M., Bastian, L., Welsh-Bohmer, K., International Conference on Alzheimer's Disease and Related Disorders, "Diabetes Mellitus and Cognitive Decline in the Cache County Study on Memory, Helath and Aging," Philadelphia, PA. (July 2004).
- Norton, M. C., Steffens, D. C., Toone, L., Tschanz, J. T., Hayden, K., Corcoran, C. D. (Author Only), Klein, L., Zandi, P., Breitner, J. S., Welsh-Bohmer, K. A., International Conference on Alzheimer's Disease and Related Disorders, "Late-life Depression, Mild Cognitive Impairment, APOE and their Interactive Effects on 3-Year Conversion to Dementia," Philadelphia, PA. (July 2004).
- Tschanz, J., Klein, E., Trieber, K., Corcoran, C. D. (Author Only), Norton, M., Toone, L., Welsh-Bohmer, K., Steinberg, M., Munger, R. G., Pieper, C., Breitner, J., Zandi, P., Lyketsos, C., International Conference on Alzheimer's Disease and Related Disorders, "Neuropsychiatric Symptoms in Mild Cognitive Impairment and Dementia: Prevalence and Relationship to Cognitive and Functional Impairment," Philadelphia, PA. (July 2004).
- Klein, E., Corcoran, C. D., Tschanz, J., Norton, M., Welsh-Bohmer, K., Breitner, J., Zandi, P., Lyketsos, C., International Conference on Alzheimer's Disease and Related Disorders, "Survival from Memory Symptom Onset: A Comparison of Individuals with Dementia and Cognitive Impairment. The Cache County Study," Philadelphia, PA. (July 2004).

- Klein, E., Tschanz, J., Corcoran, C. D. (Author Only), Norton, M., Welsh-Bohmer, K., Breitner, J., Zandi, P., Lyketsos, C., Society of Epidemiological Research, "Estimating Survival Duration from Memory Symptom Onset: A Comparison of Methods. The Cache County Study," Salt Lake City, UT. (June 2004).
- Norton, M., Skoog, I., Toone, L., Tschanz, J., Corcoran, C. D. (Author Only), Zandi, P., Hart, A., Breitner, J., Welsh-Bohmer, K., Steffens, D., Society of Epidemiological Research, "Improving Assessment of Incidence of First-Onset Geriatric Depression in Population-Based Studies," Salt Lake City, UT. (June 2004).
- Lensegrav-Benson, T., Lisota, R., Tschanz, J., Masters, K., Norton, M., Carlson, M., Corcoran, C. D. (Author Only), Lyketsos, C., Heath, E., Leslie, C., Munger, R. G., Ostybe, T., Welsh-Bohmer, K., Annual Meeting of the Western Psychological Association, "Physical Activity is Associated with Better Cognitive Performance," Phoenix, AZ. (April 2004).
- Corcoran, C. D. (Invited Lecture), Schneiter, K., Laird, N., Invited Seminar, University of Colorado Health Sciences Center, "Implementing an exact family based association test in the presence of two alleles," Denver, CO. (April 2004).
- Lisota, R., Steffens, D., Toone, L., Tschanz, J. T., Norton, M., Corcoran, C. D. (Author Only), Welsh-Bohmer, K. A., Breitner, J. S., Annual AAGP Meeting, "Vascular Risk Factors Predict Chronicity of Depression in the Elderly," Baltimore, MD. (February 2004).
- Schneiter, K., Corcoran, C. D., The Western North American Region of The International Biometric Soceity, "An Exact Approach to Family Based Association Tests Using a Network Algorithm.," The International Biometric Society, Golden, CO. (2003).
- Corcoran, C. D. (Invited Lecture), Invited Seminar, Brigham Young University, "A network algorithm for exact family based association tests," Provo, UT. (September 2003).
- Corcoran, C. D. (Author Only), Schneiter, K., Spring Meeting of the Western North America Region of the International Biometrics Society, "A Network Algorithm for Exact-Based Association Tests," Denver, CO. (June 2003).
- Corcoran, C. D. (Presenter & Author), Senchaudhuri, P., Spring Meeting, Western North America Region, "Exact Dose-Response Estimation for Clustered Binary Data," International Biometrics Society, Denver, CO. (June 2003).
- Huber, C., Steinberg, M., Tschanz, J., Corcoran, C. D. (Author Only), Posters on the Hill, "A Longitudinal Model for Behavioral Disturbances among the Elderly with Dementia: The Cache County Memory Study," Washington D.C. (April 2003).
- Norton, M. C., Steffens, D. C., Skoog, I., Corcoran, C. D. (Author Only), Welsh-Bohmer, K. A., Breitner, J. S., American Association for Geriatric Psychiatry, "Prior Minor Depression Is More Predictive of Future Episodes of Depression in the Elderly than Gender, Age, or APOE status. The Cache County Study," Honolulu, HI. (March 2003).
- Tschanz, J., Welsh-Bohmer, K., Norton, M., Corcoran, C. D. (Author Only), Breitner, J., International Neuropsychological Society 31st Annual Meeting, "Progression to Dementia in Diverse Types of Mild Cognitive Impairments of Aging," Honolulu, HI. (February 2003).
- Corcoran, C. D. (Presenter & Author), Senchaudhuri, P., Mehta, C., Joint Statistical Meeting, "Order-restricted inference for several binomials," NYC, NY. (August 2002).

- Norton, M., Tschanz, J., Corcoran, C. D., Mumford, S., Welsh-Bohmer, K., Breitner, J., International Conference on Alzheimer's Disease and Related Disorders, "Apolipoprotein E4 interacts with mild cognitive deficit to shorten time to dementia onset," Stockholm, Sweden. (July 2002).
- Tschanz, J., Norton, M., Corcoran, C. D., LaCaille, R., Welsh-Bohmer, K., Breitner, J., International Conference on Alzheimer's Disease and Related Disorders, "Cognitive screening and self-perception of memory problems predict mild cognitive impairment and dementia," Stockholm, Sweden. (July 2002).
- Corcoran, C. D. (Author Only), International Conference on Alzheimer's Disease and Related Disorders, "Differential impact of genetic and demographic variables on clinical course of dementia and Alzheimer's disease," Stockholm, Sweden. (July 2002).
- Hayden, K., Khachaturian, A., Breitner, J., Tschanz, J., Corcoran, C. D. (Author Only), Norton, M., International Conference on Alzheimer's Disease and Related Disorders, "Evaluation of performance of a two-stage screen for incident dementia," Stockholm, Sweden. (July 2002).
- Wengreen, H. J., Munger, R. G., West, N., Cutler, D., Corcoran, C. D., Zhang, J., Sassano, N. E., International Conference on Nutrition and Aging, "Protein Intake and Risk of Osteoporotic Hip Fracture in Elderly Utah Residents," Paris, France. (July 2001).
- Corcoran, C. D. (Presenter & Author), WHO Meeting for the Prevention of Craniofacial Anomalies, "Deisgn consideration for dose-response studies.," Park City, UT. (May 2001).
- West, N., Tschanz, J., Welsh-Bohmer, K., Corcoran, C. D., Wyse, B., Weight, C., Breitner, J., Annual Meeting of the International Neuropsychological Society, "Genetic and nongenetic risk factors for cognitive decline in the normal elderly," Chicago, IL. (February 2001).

Contracts, Grants and Sponsored Research

Contract

Kauwe (Brigham Young University), Keone (Principal), Munger, Ronald G. (Supporting), Corcoran, Christopher D (Supporting), "Alzheimer's disease candidate gene genotyping: The Cache County Study," Sponsored by USTAR, State, \$42,000.00. (February 1, 2011 - May 30, 2011).

Grant

- Tschanz, Joann T (Principal), Corcoran, Christopher D (Supporting), Munger, Ronald G. (Supporting), Lefevre, Michael (Supporting), "Epidemiology of Alzheimer's Disease resilience and risk pedigrees," Sponsored by NIH, Federal, \$1,067,869.00. (September 1, 2016 -August 31, 2021).
- Corcoran, Christopher D (Supporting), Stevens, John R. (Supporting), "miRNA and colorectal cancer: Associations with tumor phenotype and survival," Sponsored by National Institutes of Health, Federal, \$1,250,000.00. (July 2012 June 2017).
- Corcoran, Christopher D (Supporting), "Pleiotropic and interaction effects on Alzheimer's disease risk and progression," Sponsored by National Institutes of Health, Federal, \$1,250,000.00. (July 2012 June 2017).
- Corcoran, Christopher D (Supporting), "Prenatal and Neonatal Biologic Markers for Autism," Federal, \$576,008.00. (July 2010 - June 2015).

Intellectual Contributions in Submission

Refereed Journal Articles

Milman, L., Faroqi-Shah, Y., Corcoran, C. D., Damele, D. Interpreting MMSE scores in highly proficient bilingual Asian Indian-English and Spanish-English speakers: Demographic adjustments, item analyses, and supplemental measures.

SERVICE

General Service

Department

Chairperson, Graduate Committee, August 2012 - Present.

Undergraduate Statistics Advisor, 1999 - Present.

Committee Member, Undergraduate Curriculum Committee, 2003 - 2005.

Committee Member, Graduate Committee, 2002 - 2003.

Committee Member, Undergraduate Committee, 2001 - 2002.

Other

Committee Chair, Computing Committee, 2005 - 2009.

Professional/Public

Officer, Secretary, American Statistical Association, Utah Chapter. 2002 - 2006.

Member, Sunrise Elementary School Community Council. 2002 - 2006.

Committee Member, Cache School District Building Task Force. 2003 - 2004.

Program Organizer, Bioinformatics Working Group. 2002 - 2003.

Contribuing Author of User Manuals. 1999 - 2003.

Program Organizer, Statistics Brown Bag Seminar Series. 2000 - 2001.

Utah State University

Committee Member, Promotion and Tenure Central Committee, September 2014 - Present.

Committee Member, Utah State University Faculty Senate, 2007 - Present.

Committee Chair, Utah State University Faculty Senate Committee on Committees, 2008 - 2009.