Yates and Contingency Tables: 75 Years Later

David B. Hitchcock

University of South Carolina^{*}

March 23, 2009

Abstract

Seventy-five years ago, Yates (1934) presented an article introducing his continuity correction to the χ^2 test for independence in contingency tables. The paper also was one of the first introductions to Fisher's exact test. We discuss the historical importance of Yates and his 1934 paper. The development of the exact test and continuity correction are studied in some detail. Subsequent disputes about the exact test and continuity correction are recounted. We examine the current relevance of these issues and the 1934 paper itself and attempt to ascertain its place in history.

KEY WORDS: Categorical data; computing; conditional tests; continuity correction; Fisher's exact test; history of statistics.

^{*}David B. Hitchcock is Assistant Professor, Department of Statistics, University of South Carolina, Columbia, SC 29208 (email: hitchcock@stat.sc.edu).

1 Introduction

The year 2009 marks the 75th anniversary of the publication of Frank Yates' paper (Yates 1934) discussing options for testing for association in contingency tables: the Pearson χ^2 test, Fisher's exact test, and the well-known continuity correction that bears Yates' name. While it may not be commonly given credit as a colossally influential article that has shaped statistical science, this medium-length paper introduced some lasting ideas and methods (as well as some perpetually controversial ones) to contingency table analysis.

The purpose of Yates' paper is twofold: firstly, to introduce statisticians to Fisher's exact test (a very new procedure at the time), in large part to use the exact test as a sort of gold standard against which the small-sample performance of the (at that point in time) well-established χ^2 test of Pearson may be judged. Secondly, Yates presents his continuity correction, which results in the χ^2 test better approximating the exact test.

Yates (1934) motivates the discussion by immediately asserting, "The χ^2 test is admittedly approximate, for in order to establish the test it is necessary to regard each cell value [i.e., count] as normally distributed with a variance equal to the expected value, the whole set of values being subject to certain restrictions." Note that the variance equals the mean in the archetypal count model, the Poisson, and that the normal approximates a Poisson with large mean (Mood, Graybill, and Boes 1974, p. 120). This heuristic argument was also used by Fisher in a revised footnote within a paper on the χ^2 statistic

(Fisher 1922).

Of course, the χ^2 approximation requires a large sample size, and Yates quotes the rule of thumb that is still most commonly used today: the χ^2 test is "sufficiently accurate if no cell has an expectancy of less than 5." In Section 5 we deal with Yates' discussion of the performance of the χ^2 test for small to moderate samples.

After some brief background information about Frank Yates, we explore in Sections 3 through 5 his 1934 paper, outlining its major statistical contributions. In Section 6 we discuss controversies and criticisms of Yates' correction that arose in later years and revisit Yates' 1984 reply to those critics. The final two sections detail the current relevance and historical importance of the 1934 paper.

2 Background information about Frank Yates

There are a number of good biographical articles about Frank Yates in the statistical literature, including those by Nelder (1997), Dyke (1995) and Healy (1995a and 1995b). Here we briefly summarize some highlights from his career, including those relevant to the 1934 paper on contingency tables.

Yates came to prominence as a statistician when he began working at Rothamsted Experimental Station in 1931 as an assistant to R. A. Fisher, who was already highly prominent at that time. When Fisher left Rothamsted two years later, Yates rose to head of the Statistics Department, where he remained for 35 years, while still continuing collaborations with Fisher (Nelder 1997). It is natural, albeit somewhat unfortunate, that Yates' legacy is so closely tied to Fisher. Given all of Yates's accomplishments, it would be mightily unfair to view him as a sort of Watson to Fisher's Holmes; rather, it is better to view Yates as a Gehrig to Fisher's Ruth. Healy (1995b), while noting that Yates was "undoubtedly Fisher's follower and stood in [Fisher's] shade," suggested that Yates' work was a major impetus for Fisher's statistical insights spreading through the larger scientific community. Healy rated Yates (as a *practicing* statistician) at least as highly as Fisher.

The contributions of Yates to the field of experimental design (e.g., Yates 1933; Yates 1936a; Yates 1936b; Yates 1937) are well known and well recounted in many of the references listed above. However, Yates' greatest contribution to statistics is perhaps his embrace of the use of computing to solve statistical problems. This philosophy is of course of primary importance today, and is quite relevant to the article which we discuss here.

3 Development of Fisher's exact test

As Yates points out in his first paragraph, the χ^2 test was famously introduced by Pearson (1900), with Fisher (1922) modifying the degrees of freedom of the test statistic. The origination of the exact test is not as well known. The first appearance of the exact test in Fisher's book *Statistical Methods for Research Workers (SMRW)*, whose first edition had been published in 1925, was in the fifth edition, published in 1934, the same year as Yates' paper. (The fifth edition of *SMRW* also included, for the first time, discussion of Yates' continuity correction.) Clearly, *SMRW* was quite expeditious in reflecting the then state-of-the-art methods in contingency table analysis.

It is unclear, however, that Fisher was the first person to derive the exact test. That honor may belong to Joseph Oscar Irwin (who had previously worked with Fisher at Rothamsted Experimental Station), who in 1935 published a paper on comparing two binomial proportions using an exact test. In a footnote to that article, Irwin (1935) wrote, "This paper was concluded in May 1933, but its publication has been unavoidably delayed. Meanwhile a paper dealing with the same subject, in some respects more completely, has been published by F. Yates." (Place Fisher/Yates v. Irwin in the long list of precedence controversies, along with Gauss v. Legendre, Mann/Whitney v. Wilcoxon, and the granddaddy of them all, Leibniz v. Newton.) In fact, Yates' 1934 paper was "more complete" than Irwin's only in some respects. Irwin's paper dealt solely with the case of 2×2 contingency tables, whereas Yates mentioned more general tables. Also, the introduction of the exact test was merely a part of Yates' paper, with the introduction of the continuity correction occupying the major portion. On the other hand, Irwin focused solely on the development of the exact test in his paper, and in that particular respect, provided much more description than did Yates. Armitage (1982) and Greenberg (1983) provide information on Irwin's career.

Interestingly, while Yates (1934) refers in the first sentence of the paper to "statistical tests of independence in contingency tables," when he motivates the exact test in the 2 × 2 case, he assumes that the data come from "two samples of N - n and n respectively," each from a binomial distribution. This would actually correspond to a "test for homogeneity," which is based on a different sampling scheme (Bock et al. 2007): In this setting, samples are taken from multiple populations and a single categorical variable is observed, rather than, say, two categorical variables being observed on a single sample in the test for independence. Of course, the implementations of both the exact test and the χ^2 test are identical whether we are testing for independence or homogeneity, so we may use either setting to motivate the test statistic calculation. Anyway, Yates makes no distinction between the two settings in the article.

We note that in the 1934 paper Yates denotes the marginal totals by N - n, n, N - n', and n', respectively. In a later paper (Yates 1984), he adapts an arguably less confusing notation for the 2 × 2 table, shown in Table 1.

In the 1934 paper, Yates (giving credit to a suggestion by Fisher) derives the fact that the P-value of the exact test is a hypergeometric probability. Yates' explanation of the exact test is somewhat more theoretically detailed than Fisher's in *SMRW* (although Fisher illustrates the method with a numerical example). While Yates states that the method is due to Fisher, Healy (1995b) wonders if it might be more appropriately called the Fisher-Yates

Table 1: A cross-classification table following the notation of Yates (1984).

| | B_1 | B_2 | Total |
|-------|-------|-------|-------|
| A_1 | a | b | n_1 |
| A_2 | c | d | n_2 |
| Total | m_1 | m_2 | N |

NOTE: N observations, on which two binary variables A and B are measured, are cross-classified.

Exact Test, given Yates' role in disseminating the method.

In the case of a 2×2 table, the P-value of the exact test represents the probability that the count in a particular cell is as or more favorable to the alternative hypothesis (of association) than the observed count for that cell, when the margins of the table are fixed at their observed values. Is it reasonable to assume the "constancy of marginal totals"? This is a question that many practitioners gloss over, but Yates devotes nearly a page and a half to justifying this assumption. As it turns out, through the years Yates' arguments in this regard were not universally accepted, and this led in part to the minor furor recounted in Section 6.

Yates' first, fairly intuitive, argument was that the conclusion of the test is in no way affected by which variable represents the rows and which represents the columns; therefore, since the row totals are fixed (as is the case when taking two independent binomial samples), we can just as well view the columns as fixed. A second argument Yates presents is that we may view the observations as a *single* random sample of size N, and then classify those sampled observations according to the row variable (say, A). We may then randomly select m_1 of these N observations and assign them to class 1 of the column variable (say, B), with the other m_2 of the observations being assigned to class 2 of B. While this establishes the constancy of the column totals, it may not intuitively mirror the way data are gathered for 2×2 tables, in many cases. Finally, Yates mentions that "the marginal totals are in the nature of ancillary statistics."

Throughout the paper, Yates focuses mostly on the 2 × 2 case, although Fisher's exact test can be extended to general $r \times c$ tables. (In that case, one must choose a method of ordering possible table configuations according to how severely they depart from the null.) Having derived the exact test, Yates concludes, "even when the marginal totals are quite small the evaluation of χ^2 is much more expeditious," and he focuses on the properties of the χ^2 test. In fact, one suspects that Yates discusses the exact test here primarily to motivate exact probability calculations with which the various χ^2 approximations may be compared.

4 Yates' continuity correction

The part of the Yates (1934) paper that is most well-known today may be his continuity correction recommendation, for which, according to Nelder (1997), "Yates is probably most widely known." The ordinary (uncorrected) χ^2 statistic commonly given as

$$\chi^2 = \sum_{i,j} \frac{(Obs_{ij} - Exp_{ij})^2}{Exp_{ij}}$$

where Obs_{ij} is the observed count in cell (i, j) and Exp_{ij} the estimated expected count in cell (i, j) given no association, results in a uniformly lower P-value than that of the exact test, as Yates illustrates with a simple table. His recommendation is to adjust the expected counts 1/2 unit closer to the observed counts for each cell, resulting in:

$$\chi^{2'} = \sum_{i,j} \frac{(|Obs_{ij} - Exp_{ij}| - 0.5)^2}{Exp_{ij}}.$$

Yates points out that this adjusted test statistic produces a P-value sometimes greater and sometimes less than the exact P-value, but which is typically much closer to the exact than is the P-value from the uncorrected χ^2 . To illustrate this, Yates first deals with the simple case of a 1 × 2 contingency table, calculating some exact binomial probabilities and comparing these with the corresponding (one-tailed) P-values of the ordinary χ^2 test and the χ^2 test with his continuity correction. For example, if the true probability of success p = 0.5, in 10 independent trials the exact probability of 4 or fewer successes is 0.3770. The P-value of the uncorrected test (with a "less than" alternative) is 0.2635, and the P-value of the corrected test is 0.3759, far closer to the "exact" value. Yates points out that this is because the χ^2 distribution is continuous, "whereas the distribution it is endeavouring to approximate is discontinuous." With several other such examples, Yates provides evidence for the continuity correction's improvement to the approximation.

We may note that most contemporary introductory texts (e.g., Peck et al. 2008; Sullivan 2007; Bock et al. 2007) seem to focus all attention on the uncorrected χ^2 statistic, not mentioning the continuity correction. Certainly this is a defensible choice; it seems pedagogically simpler to deal with only the uncorrected statistic. Furthermore, for sufficiently large samples the uncorrected statistic gives a P-value approximating the exact P-value quite well, and for small to moderate samples, the exact test itself is computationally much more feasible than in Yates' day. If the continuity correction with the χ^2 test is no longer needed/taught, however, we may logically ask the question of whether it is necessary to teach the continuity correction for the normal approximation to the binomial, which is much more commonly done. (Perhaps since students have immediately available tables and calculators with which to compare the true binomial probability with the normal approximation, teachers feel pressure to make this approximation as close as possible for moderate sample sizes!)

5 Yates' study of the small sample behavior of the χ^2 test

In the section of his paper labeled, "Discrepancies of the χ^2 Test after correcting for Continuity," Yates (1934) computes discrepancies between the

0.025 and 0.005 cutoff values of the χ^2 distribution and the corresponding values of the sampling distribution of the continuity-corrected test statistic $\chi^{2'}$. This is by far the most technical section of the paper, and given the style of exposition of Yates' day (heavy on wordy explanations and light on mathematical notation), it is probably the most difficult to follow.

Whereas in the previous section Yates compared P-values arising from the uncorrected and corrected χ^2 tests, in this section he attempts to compare specific cutoff points for quantities having a discrete distribution. This is a bit more awkward: Yates (1934, p. 223) notes, "There are, of course, in general no discrepancies corresponding to the exact 2.5 per cent and 0.5 per cent points, but it is possible to determine approximate hypothetical discrepancies ... by interpolation." These interpolations give rise to some unusual-looking plots with multiple axes that require some study to understand. Yates later apparently regretted this focus on nominal levels in this discrete type of test, noting that "concentration on single-tail nominal levels of 2.5 and 0.5 per cent is a defect in my 1934 paper, which reflects the current thinking of the time" (Yates 1984, p. 437).

Specifically, Yates orders Table 1 so that $n_1 > n_2$ and $m_1 > m_2$ (if this is not so, one can simply switch the category labels). He then examines the distribution of d, which in this formulation is the random value for the cell with the smallest expected value. He notes that its value may range from 0 to n_2 (i.e., across $n_2 + 1$ terms) and its expected value will be $E(d) = n_2 m_2/N$. If we fix E(d) and n_2+1 , we obtain a series of distributions for d as the overall total N varies. Yates calls the distribution in such a series with the smallest possible N (for a given E(d) and n_2+1) the *limiting contingency distribution*, and notes than when $N \to \infty$, the distribution approaches a binomial. By examining the discrepancies associated with the continuity-corrected χ^2 for each of these extreme distributions, Yates could generally characterize the discrepancies for any distribution in that series.

In terms of practically applying his findings, Yates suggests using the continuity correction whenever the smallest expected cell count is less than 500 (in other words, in any case other than when the correction has a negligible effect). When the smallest expected cell count is less than 100, Yates suggests forgoing the ordinary χ^2 table when obtaining the critical value for the test. Rather, the analyst should find an adjusted cutoff value based on the table Yates (1934, Table III) presents. If interpolation within the levels given in Yates' table is not precise enough, Yates recommends that the exact test be used. Again, these small-sample conclusions and recommendations Yates provides are philosophically based on the exact test being a gold standard; Yates is determining what application of a χ^2 -type test can best approximate the exact-test results. As the years went by, the general trust in the exact test fell into doubt in some statisticians' eyes.

6 Yates' 1984 paper

With the increased computing power of the 1970s and 1980s, simulationbased evaluations of classical statistical tests became feasible. In one of the first of these, Berkson (1978) compared the sizes of the ordinary χ^2 test, the continuity-corrected test, and the exact test (examining one-tailed alternatives in each case). His conclusion was that the uncorrected test maintained the nominal level far better than the other two, which were found to be overly conservative. Given this, Berkson noted that the "exact test" was far from exact in this sense; he also suggested that, considering the large discrepancies among the test, that the exact test *and* Yates' test were not merely the uncorrected test "with a 'correction,' but are actually different tests, based on different principles."

In a comprehensive analysis of a large class of 2×2 tables, Haber (1980) compared the uncorrected χ^2 test and several continuity-corrected tests, including that of Yates (1934). Haber's results showed that in two-sided tests with 2×2 tables, the uncorrected χ^2 test produced P-values that were too low, while Yates' correction led to P-values that were too high (resulting in a conservative test). (Yates (1984) would find fault with Haber's method for calculating the two-sided P-value.)

Upton (1982) produced a simulation-based comparison of a large number of tests for association in 2 × 2 tables, among which were Fisher's exact test and the χ^2 test with Yates' continuity correction. He found that these two tests performed nearly identically (which mirrors the major point of Yates' 1934 paper), but found that both tests were highly conservative, typically failing to reach the nominal significance level. (This agreed with the conclusions of Garside and Mack (1976) and Berkson (1978).) Upton (1982) recommended against these two tests when analyzing data from two independent samples, although his recommendation would not prove permanent.

In response to these critical papers, Yates (1984) wrote a long and detailed defense of the exact test (and, to a lesser degree, of the continuity-corrected χ^2 test). Using a large series of examples, Yates defended the exact test on mostly philosophical grounds that highlighted his objections to the Neyman-Pearson style of hypothesis testing. Some foundational issues intrinsic to Yates' arguments included: the interpretation of the significance level as the long-run proportion of rejections when H_0 is true; the role of conditioning on the marginals when testing association in two-way tables; the use (or misuse) of strict nominal significance levels; and the correct approach for adapting one-sided P-values to a two-sided test and vice versa. Many of the questions, of course, have no indisputably correct answer. However, based on Yates' views of these issues, he presented passionate refutations of the conclusions drawn by Berkson (1978), Haber (1980), and Upton (1982).

Later, Upton (1992) would reverse his criticism of the exact test, concluding it was unfair, when dealing with a test based on a discrete distribution, to compare the Type I error rate with a nominal α . Upton (1992) was still hesitant about the continuity correction, worrying about users "forgetting

| | Normal Teeth | Maloccusion | Total |
|------------|--------------|-------------|-------|
| Breast-fed | 4 | 16 | 20 |
| Bottle-fed | 1 | 21 | 22 |
| Total | 5 | 37 | 42 |

Table 2: An example 2×2 contingency table given in Yates (1934).

NOTE: The row variable is method of feeding for infants and the column variable is incidence of maloccusion. The original data are from Hellman (1914).

that [the continuity-corrected statistic] is being used to *approximate* a sum of *discrete* probabilities."

7 Relevance of the issues today

In some ways, the onset on fast computing has rendered some of the issues raised by Yates (1934) irrelevant. For instance, consider an example Yates (1934) presents using data from Hellman (1914) on maloccusion of infants' teeth, presented here as Table 2: Yates calculates χ^2 and the corrected $\chi^{2'}$ for these data and compares the respective P-values to the P-value from the exact test. To test for an association between feeding method and incidence of maloccusion, today we can obtain the exact test P-value virtually instantly using the fisher.test function in R, for example (R Development Core Team 2007). Using fisher.test on the expanded 3×2 table (shown here as

| | Normal Teeth | Maloccusion | Total |
|-----------------------|--------------|-------------|-------|
| Breast-fed | 4 | 16 | 20 |
| Bottle-fed | 1 | 21 | 22 |
| Breast and Bottle-fed | 3 | 47 | 50 |
| Total | 8 | 84 | 92 |

Table 3: An example 3×2 contingency table given in Yates (1934).

NOTE: The row variable is method of feeding for infants (with an additional row category) and the column variable is incidence of maloccusion. The original data are from Hellman (1914).

Table 3) given in Yates (1934) poses no difficulties either. When multiplying the sample cell counts by 10 or even 100, the fisher.test function in R 2.5.1 worked immediately. Eventually the cell counts get too large for the fisher.test function at its default settings (although this can be alleviated by increasing the workspace argument).

This indicates that for the small-to-moderate sized problems to which Yates (1934) refers, there is no need to use the χ^2 test at all, since the exact test is easily accessible (excluding the case of teaching introductory courses). This depends, of course, on whether one accepts the premise of the exact test that the marginal totals be fixed, and that one does not mind the exact test's conservatism in the Neyman-Pearson sense, as discussed in Section 6. When sample sizes are large enough that the exact test is infeasible, the continuity correction makes little difference to the result.

8 Conclusion

The historical significance of Yates' 1934 article is perhaps underrated. Though merely of moderate length, it provided one of the earliest explanations in the statistical literature of Fisher's exact test, at around the same time that Fisher (1934) mentioned the exact test in the fifth edition of *SMRW* (although the idea of the exact test seems to have been known for some time previous by those in Fisher's inner circles). In addition, Yates (1934) formally proposed the continuity correction to the χ^2 test for the first time. Finally, Yates' numerical studies in this paper were the first in a long and often contentious series of investigations into the best method for testing for association in contingency tables. This controversy has carried into modern times, without a definitive resolution, and has led to foundational questions about the meaning of conditional tests and the appropriateness of Neyman-Pearsonian measures of actual levels of significance.

Admittedly, most statisticians today would likely say that the continuity correction to the χ^2 test and its relationship to the exact test is a fairly minor dispute today, as statistical controversies go. While Yates' 1934 paper may be more important historically than as a progenitor of current research, it is more than a mere curio. Since the χ^2 and exact tests are used in numerous everyday applications, its influence, though indirect, is ubiquitous on statistical practice. The acceptance of Yates' continuity correction today is rather mixed. As discussed in Section 4, many introductory statistical textbooks present the χ^2 test without the correction. Agresti (2002), in a more advanced text, also presents the χ^2 test without the correction, mentioning in a footnote that "since software now makes Fisher's exact test feasible even with large samples, this correction is no longer needed" (Agresti 2002, p. 103). On the other hand, note that in the **chisq.test** function built into R (R Development Core Team 2007), the default setting is for the continuity correction to be used, so neither view on the matter is universally held. (Note that PROC FREQ in SAS gives only the uncorrected χ^2 test results, except in the case of 2 × 2 tables, when it also gives the continuity-corrected results.)

Reading Yates' 1934 article and its golden-anniversary counterpart (Yates 1984), one may glean some sharp insights into Frank Yates' personality and statistical philosophy. Yates' deep respect for Fisher shines through, especially in the 1984 paper, in which Yates repeatedly refers to Fisher's work and statistical philosophy. In the examples and justifications Yates (1934) provides, we sense his relatively early reliance on computing machines as vital tools for statistical analysis and his belief in the primacy of applications. From the occasionally almost-scathing rejoinder (Yates 1984) to his critics, on the other hand, we encounter another side of his personality in the passionate, Fisherian defense of his ideas.

While the 1934 paper is neither the first word nor the last word regarding testing for association in contingency tables, it is historically important for several reasons. It provided a snapshot of the contemporary state of the art at the time, it discussed (probably, for most readers, introduced) Fisher's method for exact testing, and it suggested the continuity correction that would be debated for decades to come. Yates bestowed upon statistics many contributions during his distinguished career, and his 1934 paper is a small gem whose brilliance can be seen three-quarters of a century later.

References

- Agresti, A. (2002), Categorical Data Analysis, Second Edition, Hoboken, NJ: Wiley.
- [2] Armitage, P. (1982), "Joseph Oscar Irwin (1898-1982)", Journal of the Royal Statistical Society, Series A, 145, 526-528.
- Berkson, J. (1978), "In Dispraise of the Exact Test," Journal of Statistical Planning and Inference, 2, 27-42.
- [4] Bock, D. E., Velleman, P.F., and De Veaux, R. D. (2007), Stats: Modeling the World, Second Edition, Boston: Pearson/Addison-Wesley.
- [5] Dyke, G. (1995), "Obituary: Frank Yates," Journal of the Royal Statistical Society, Series A, 158, 333-338.
- [6] Fisher, R. A. (1922), "On the Interpretation of χ² from Contingency Tables, and the Calculation of P," *Journal of the Royal Statistical Society*, 85, 87-94.

- [7] Fisher, R. A. (1934), Statistical Methods for Research Workers, Fifth Edition, Edinburgh: Oliver and Boyd.
- [8] Garside, G. R., and Mack, C. (1976), "Actual Type 1 Error Probabilities for Various Tests in the Homogeneity Case of the 2 × 2 Contingency Table," *The American Statistician*, 30, 18-21.
- [9] Greenberg, B. G. (1983) "Joseph Oscar Irwin, 1898-1982, An Obituary Appreciation", *Biometrics*, 39, 527-528.
- [10] Haber, M. (1980), "A Comparison of Some Continuity Corrections for the χ² Test on 2 × 2 Tables," Journal of the American Statistical Association, 75, 510-515.
- [11] Healy, M. J. R. (1995a), "Obituary: Frank Yates 1902-1994," Biometrics, 51, 389-391.
- [12] Healy, M. J. R. (1995b), "Frank Yates, 1902-1994: The Work of a Statistician," International Statistical Review, 63, 271-288.
- [13] Hellman, M. (1914), "A Study of Some Etiological Factors of Malocclusion," Dental Cosmos, Vol. LVI, 1017-1032.
- [14] Irwin, J. O. (1935), "Tests of Significance for Differences between Percentages Based on Small Numbers," *Metron*, 12, 83-94.
- [15] Mood, A. M., Graybill, F. A., and Boes, D. C. (1974), Introduction to the Theory of Statistics, New York: McGraw-Hill.

- [16] Nelder, J. A. (1997), "Yates, Frank," in Leading Personalities in Statistical Sciences: From the Seventeenth Century to the Present, Norman L. Johnson and Samuel Kotz (eds.), New York: Wiley.
- [17] Pearson, K. (1900), "On a Criterion that a Given System of Deviations from the Probable in the Case of a Correlated System of Variables Is Such that It Can Be Reasonably Supposed to Have Arisen from Random Sampling," *Philosophical Magazine, Series 5*, 50, 157-175. (Reprinted in *Karl Pearson's Early Papers* (1948), E. S. Pearson (ed.), Cambridge: Cambridge University Press.)
- [18] Peck, R., Olsen, C., and Devore, J. (2008), Introduction to Statistics and Data Analysis, Third Edition, Belmont, CA: Thomson Brooks/Cole.
- [19] R Development Core Team (2007). R: A Language and Environment for Statistical Computing. R Foundation for Statistical Computing, Vienna, Austria. ISBN 3-900051-07-0, URL: http://www.R-project.org.
- [20] Sullivan, M. (2007), Statistics: Informed Decisions Using Data, Second Edition, Upper Saddle River, NJ: Pearson Prentice Hall.
- [21] Upton, G. J. G. (1982), "A Comparison of Alternative Tests for the 2×2 Comparative Trial," Journal of the Royal Statistical Society, Series A, 145, 86-105.
- [22] Upton, G. J. G. (1992), "Fisher's Exact Test," Journal of the Royal Statistical Society, Series A, 155, 395-402.

- [23] Yates, F. (1933), "The Principles of Orthogonality and Confounding in Replicated Experiments," *Journal of Agricultural Science*, 23, 108-145.
- [24] Yates, F. (1934), "Contingency Tables Involving Small Numbers and the χ^2 Test," Supplement to the Journal of the Royal Statistical Society, 1, 217-235.
- [25] Yates, F. (1936a), "Incomplete Randomized Blocks," Annals of Eugenics, 23, 108-145.
- [26] Yates, F. (1936b), "A New Method of Arranging Variety Trials Involving a Large Number of Varieties," *Journal of Agricultural Science*, 26, 424-455.
- [27] Yates, F. (1937), The Design and Analysis of Factorial Experiments. Commonwealth Bureau of Soil Science, Technical Communication No. 35.
- [28] Yates, F. (1984), "Tests of Significance for 2 × 2 Contingency Tables," Journal of the Royal Statistical Society, Series A, 147, 426-463.