

Bayesian Inference
Data Evaluation and Decisions
Corrections to the book published by
Springer Verlag, Heidelberg 2016

Hanns Ludwig Harney

Heidelberg, January 2018

In the last paragraph of the ***preface*** the first phrase should read: The example of the binomial distribution — sketched on Fig. 5.1 — represents 300 years of research in statistics.

Contents

1	Knowledge and Logic	9
2	Bayes' Theorem	11
3	Probable and Improbable Data	13
4	Description of Distributions I: Real x	15
5	Description of Distributions II: Natural x	17
6	Form Invariance I	19
7	Examples of Invariant Measures	21
8	A Linear Representation of Form Invariance	23
9	Going Beyond Form Invariance: The Geometric Prior	25
10	Inferring the Mean or the Standard Deviation	27

11 Form Invariance II: Natural x	29
12 Item Response Theory	31
13 On the Art of Fitting	33
14 Summary	35
A Problems and Solutions	37
A.1 Knowledge and Logic	38
A.1.1 The Joint Distribution	38
A.2 Bayes' Theorem	39
A.2.1 Bayes' Theorem under Reparameterisations	39
A.2.2 Transformation to the Uniform Prior	39
A.2.3 The Iteration of Bayes' Theorem	39
A.2.4 The Gaussian Model for many Events	39
A.2.5 The Distribution of Leading Digits	39
A.3 Probable and Improbable Data	40
A.3.1 The Size of an Area in Parameter Space	40
A.3.2 No Decision without Risk	40
A.3.3 Normalisation of a Gaussian Distribution	40
A.3.4 The Measure of a Scale Invariant Model	40
A.3.5 A Single Decay Event	40
A.3.6 Normalisation of a Posterior of the Gaussian Model	40
A.3.7 The ML Estimator from a Gaussian Likelihood Function	40
A.3.8 The ML Estimator from a chi-squared Model	41
A.3.9 Contour Lines	41
A.3.10 The Point of Maximum Likelihood	41
A.4 Description of Distributions I:	
Real x	42
A.4.1 The Mean of a Gaussian Distribution	42
A.4.2 On the Variance	42
A.4.3 Moments of a Gaussian	42
A.4.4 The Normalisation of a Multidimensional Gaussian	42
A.4.5 The Moments of the Chi-Squared Distribution	42

A.4.6	Moments of the Exponential Distribution	42
A.5	Description of Distributions II:	
	Natural x	43
A.5.1	The Second Moments of the Multinomial Distribution .	43
A.5.2	A Limit of the Binomial Distribution	43
A.6	Form Invariance I	44
A.6.1	Every Element can be Considered the Origin of a Group	44
A.6.2	The Domain of Definition of a Group Parameter is Im- portant	44
A.6.3	A Parameter Representation of the Hyperbola	44
A.6.4	Multiplication Functions for the Symmetry Groups of the Circle and the Hyperbola	44
A.6.5	The Group of Dilations	44
A.6.6	The Combination of Translations and Dilations	44
A.6.7	Reversing the Order of Translation and Dilation	44
A.6.8	A Transformation of the Group Parameter	45
A.6.9	A Group of Transformations of the Group Parameter .	45
A.6.10	The Model p is normalized when the Common Form w is Normalized	45
A.6.11	Two Expressions Yielding the Measure μ	45
A.6.12	Form invariance of the Posterior Distribution	45
A.6.13	Invariance of the Shannon Information	45
A.7	Examples of Invariant Measures	46
A.7.1	The Invariant Measure of the Group of Translation-Dilation	46
A.7.2	Groups of Finite Volume	46
A.7.3	The Inverse of a Triangular Matrix	46
A.7.4	The Invariant Measure of a Group of Triangular Matrices	46
A.8	A Linear Representation of Form Invariance	47
A.8.1	Transforming a Space of Square Integrable Functions	47
A.8.2	An Integral Kernel	47
A.9	Beyond Form Invariance:	
	The Geometric Prior	48
A.9.1	Jeffreys' Rule Transforms as a Density	48
A.9.2	The Fisher Matrix is Positive Definite	48
A.9.3	The Measure on the Sphere	48
A.9.4	Another Form of the Measure on the Sphere	48

A.10	Inferring the Mean or the Standard Deviation	49
A.10.1	Calculation of a Fisher Matrix	49
A.10.2	The Expectation Value of an ML Estimator	49
A.11	Form Invariance II: Natural x	50
A.11.1	The Identity of two Expressions	50
A.11.2	Form Invariance of the Binomial Model	50
A.11.3	The Multiplication Function of a Group of Matrices	50
A.11.4	An ML Estimator for the Binomial Model	50
A.11.5	A Prior Distribution for the Poisson Model	50
A.11.6	A Limiting Case of the Poisson Model	50
A.12	Item Response Theory	51
A.12.1	Expectation Values Given by the Binomial Model	51
A.13	On the Art of Fitting	52
A.13.1	A Maximum Likelihood Estimator	52
A.13.2	Gaussian Approximation to a Chi-Squared Model	52
B	Description of Distributions I: Real x	53
C	Form Invariance I	55
D	Beyond Form Invariance: The Geometric Prior	57
E	Inferring Mean or Standard Deviation	59
F	Form Invariance II: Natural x	61
G	Item Response Theory	63
H	On the Art of Fitting	65
H.1	The Geometric Measure on the Scale of a Chi-Squared Distribution	65
H.2	Convoluting Chi-Squared Distributions	66
H.3	Definitions of Fourier Transforms	68

H.4 The Fourier Transform of the Chi-Squared Distribution	70
---	----

Chapter 1

Knowledge and Logic

As yet there are no corrections to Chap. 1.

Chapter 2

Bayes' Theorem

Following Eq. (2.9) the text should be: The absolute value $|\dots|$ appears because $d\xi/d\eta$ may be positive or negative. It must, however, have the same sign everywhere.

In the second phrase after Eq. (2.27) it should read: The posteriors (2.20) for $N = 3$ and $N = 4 \dots$

After Eq. (2.29) plus two more sentences it should read: \dots lower part of the figure. The eight events are indicated by the dots on the abscissa. It is rectangular \dots

Chapter 3

Probable and Improbable Data

In the caption of Fig. 3.8 the second phrase should read: This curve is a version of the chi-squared distribution with 7.4 degrees of freedom; see Sect. 4.1.3

The second last phrase of Chap. 3 should read: Let us note that the distribution w becomes a chi-squared distribution with $N = 2\alpha$ degrees of freedom ...

Chapter 4

Description of Distributions I:

Real x

In the second line of Eq. (4.5) there should be the fourth power of σ .

The third line of the paragraph that begins after Eq. (4.8) should read: ... considered as the sum of sufficiently many contributions that all follow the same distribution.

The footnote on p. 48 should be modified: ... in the first edition of this book. The present definition is easier and more commonly used.

In Fig. 4.2 the abscissa should be labelled T .

The paragraph that ends after Eq. (4.46) should be completed with the phrases: This occurs because neither the first moment \bar{t} nor the second moment \bar{t}^2 exist of the distribution (4.45). They are necessary for z to approach a Gaussian distribution.

Chapter 5

Description of Distributions II:

Natural x

There is no correction to Chap. 5.

Chapter 6

Form Invariance I

Following Eq. (6.5) insert the demand: The interested reader should answer the question:

Chapter 7

Examples of Invariant Measures

There are no corrections to Chap. 7.

Chapter 8

A Linear Representation of Form Invariance

There are no corrections to Chap. 8.

Chapter 9

Going Beyond Form Invariance: The Geometric Prior

In the second line of p. 104 it should read: Its elements estimate the second derivative of $-\ln p$,

In Eq. (9.16) the sum reaches from $\nu = 1$ to $\nu = n$.

Chapter 10

Inferring the Mean or the Standard Deviation

At the end of the introductory remarks on p. 115 there should be mentioned: Section A.10 gives the solutions to the problems suggested to the reader.

Chapter 11

Form Invariance II: Natural x

There are no corrections to Chap. 11.

Chapter 12

Item Response Theory

In the References on p. 149 under number 3 it should read: ... a theory of objectivity in comparisons ... ed. by L.J.Th. van der Kamp ...

In Ref. 14 it should read: ... Published by Springer VS, Wiesbaden 2018

Chapter 13

On the Art of Fitting

The text after Eq. (13.3) should read: with N degrees of freedom; see Sect. 4.1.3. We assume that all σ_k are equal to unity. Then the scaling parameter is

The text after Eq. (13.5) should read: If the actual T is much larger ...

The text after Eq. (13.9) should read: The position of the maximum ...

The text after Eq. (13.10) should read: The interested reader may want to verify this estimate.

The paragraph beginning before Eq. (13.11) should read: We can redefine η such that η^{ML} does not depend on N . This is reached if one shifts the parameter η to

The left hand side of Eq. (13.15) should read $\tilde{\chi}_N^{\text{sq}}(y|\eta')$

Eq. (13.17) should read $q(n_k|\lambda_k) = \frac{\lambda_k^{n_k}}{n_k!} e^{-\lambda_k}$,

The text after Eq. (13.34) should read: The expression (13.33) is a likelihood function. ...

In both lines of Eq. (13.35) the minus should be replaced by a plus sign.

The line that introduces Eq. (13.37) should read: The Fisher function of (13.36) is

The second paragraph of Sect. 13.4 should end with the statement: ... the Shannon information of a form invariant model becomes independent of the parameterisation of the model.

Chapter 14

Summary

The last lines of the first paragraph of Sect. 14.1 should read: ... needed to make the posterior independent of the prior, [1]. As long as the prior remains arbitrary, one can generate any posterior.

In the fifth line of the last paragraph of Sect. 14.1 it should read: that is, whether the observed events x_1, \dots, x_N comply with the distribution $p(x_1, \dots, x_N | \xi^{\text{pre}})$.

The second paragraph of Sect. 14.2 should read: ... The test is widely used to assess the quality of a fit. The present method yields a chi-squared criterion that is simmilar to the test. However, the criterion rejects “over-fitting”. It rejects fits that come too close to observation. In particular, it rejects a fit that reproduces the observed \mathbf{x} point by point. One can do so by Occam’s argument ...

Following Eq. (14.1) it should read: ... a given level and its nearest neighbour when the mean level distance is unity. It is certainly ...

In the paragraph on p. 171 that begins with “It is possible that” it should read in the 8th line: a model $p(s|\xi)$ that interpolates ...

The last paragraph of Sect. 14.3 should read: It remains the mystery that probability distributions are ordered by a symmetry although their events do not know of each other. They happen independently. To which extent are events independent that have a common observer?

Appendix A

Problems and Solutions

In the present appendix, we give the solutions or hints to the solutions of the problems that have been posed within the main text of the book.

A.1 Knowledge and Logic

A.1.1 The Joint Distribution

The phrase after Eq. (A.1) should be continued as follows: ... not conditioned by x_2 ; it is independent of x_2 .

The words “A proof by induction yields” should be replaced by: Since any pair of the x_k is statistically independent of each other, one obtains

A.2 Bayes' Theorem

A.2.1 Bayes' Theorem under Reparameterisations

There is no correction to this subsection.

A.2.2 Transformation to the Uniform Prior

After Eq. (A.6) one should insert: When $\mu(\xi)$ was already uniform, then η becomes a linear transformation of ξ and thus $\mu_T(\eta)$ will again be a uniform prior.

A.2.3 The Iteration of Bayes' Theorem

There is no correction to this subsection.

A.2.4 The Gaussian Model for many Events

There is no correction to this subsection.

A.2.5 The Distribution of Leading Digits

After the phrase following Eq. (A.10) one should insert: The function \log is the logarithm to the basis of 10.

After Eq. (A.11) one should insert: Here, the function \ln is the natural logarithm.

A.3 Probable and Improbable Data

A.3.1 The Size of an Area in Parameter Space

There is no correction to A.3.1.

A.3.2 No Decision without Risk

There is no correction to A.3.2.

A.3.3 Normalisation of a Gaussian Distribution

There is no correction to A.3.3.

A.3.4 The Measure of a Scale Invariant Model

There is no correction to A.3.4.

A.3.5 A Single Decay Event

There is no correction to A.3.5.

A.3.6 Normalisation of a Posterior of the Gaussian Model

There is no correction to A.3.6.

A.3.7 The ML Estimator from a Gaussian Likelihood Function

There is no correction to A.3.7.

A.3.8 The ML Estimator from a chi-squared Model

There is no correction to A.3.8.

A.3.9 Contour Lines

There is no correction to A.3.9.

A.3.10 The Point of Maximum Likelihood

There is no correction to A.3.10.

A.4 Description of Distributions I:

Real x

A.4.1 The Mean of a Gaussian Distribution

There is no correction to A.4.1.

A.4.2 On the Variance

There is no correction to A.4.2.

A.4.3 Moments of a Gaussian

There is no correction to A.4.3.

A.4.4 The Normalisation of a Multidimensional Gaussian

There is no correction to A.4.4.

A.4.5 The Moments of the Chi-Squared Distribution

There is no correction to A.4.5.

A.4.6 Moments of the Exponential Distribution

There is no correction to A.4.6.

A.5 Description of Distributions II:

Natural x

A.5.1 The Second Moments of the Multinomial Distribution

There is no correction to A.5.1.

A.5.2 A Limit of the Binomial Distribution

There is no correction to A.5.2.

A.6 Form Invariance I

A.6.1 Every Element can be Considered the Origin of a Group

There is no correction to A.6.1.

A.6.2 The Domain of Definition of a Group Parameter is Important

There is no correction to A.6.2.

A.6.3 A Parameter Representation of the Hyperbola

There is no correction to A.6.3.

A.6.4 Multiplication Functions for the Symmetry Groups of the Circle and the Hyperbola

There is no correction to A.6.4.

A.6.5 The Group of Dilations

There is no correction to A.6.5.

A.6.6 The Combination of Translations and Dilations

There is no correction to A.6.6.

A.6.7 Reversing the Order of Translation and Dilation

There is no correction to A.6.7.

A.6.8 A Transformation of the Group Parameter

There is no correction to A.6.8.

A.6.9 A Group of Transformations of the Group Parameter

There is no correction to A.6.9.

A.6.10 The Model p is normalized when the Common Form w is Normalized

There is no correction to A.6.10.

A.6.11 Two Expressions Yielding the Measure μ

There is no correction to A.6.11.

A.6.12 Form invariance of the Posterior Distribution

There is no correction to A.6.12.

A.6.13 Invariance of the Shannon Information

There is no correction to A.6.13.

A.7 Examples of Invariant Measures

A.7.1 The Invariant Measure of the Group of Translation-Dilation

There are no corrections to A.7.1.

A.7.2 Groups of Finite Volume

There are no corrections to A.7.2.

A.7.3 The Inverse of a Triangular Matrix

There are no corrections to A.7.3.

A.7.4 The Invariant Measure of a Group of Triangular Matrices

There are no corrections to A.7.4.

A.8 A Linear Representation of Form Invariance

A.8.1 Transforming a Space of Square Integrable Functions

There is no correction to A.8.1.

A.8.2 An Integral Kernel

There is no correction to A.8.2.

A.9 Beyond Form Invariance: The Geometric Prior

A.9.1 Jeffreys' Rule Transforms as a Density

There is no correction to A.9.1.

A.9.2 The Fisher Matrix is Positive Definite

There is no correction to A.9.2.

A.9.3 The Measure on the Sphere

There is no correction to A.9.3.

A.9.4 Another Form of the Measure on the Sphere

There is no correction to A.9.4.

A.10 Inferring the Mean or the Standard Deviation

A.10.1 Calculation of a Fisher Matrix

There is no correction to A.10.1.

A.10.2 The Expectation Value of an ML Estimator

There is no correction to A.10.2.

A.11 Form Invariance II: Natural x

A.11.1 The Identity of two Expressions

There is no correction to A.11.1.

A.11.2 Form Invariance of the Binomial Model

There is no correction to A.11.2.

A.11.3 The Multiplication Function of a Group of Matrices

In the the first line of A.11.3 it should read: Show that the multiplication function ϕ of the group ... is

A.11.4 An ML Estimator for the Binomial Model

There is no correction to A.11.4.

A.11.5 A Prior Distribution for the Poisson Model

There is no correction to A.11.5.

A.11.6 A Limiting Case of the Poisson Model

There is no correction to A.11.6.

A.12 Item Response Theory

A.12.1 Expectation Values Given by the Binomial Model

There is no correction to A.12.1.

A.13 On the Art of Fitting

A.13.1 A Maximum Likelihood Estimator

There is no correction to A.13.1.

A.13.2 Gaussian Approximation to a Chi-Squared Model

There is no correction to A.13.2.

Appendix B

Description of Distributions I:

Real x

Following Eq. (B.26) the text should read: for positive real part of z . This is given in ...

Preceding Eq. (B.33) it should read: ... the substitution $\beta x = t^2 \gamma^{-2}$ yields ...

Appendix C

Form Invariance I

There is no correction to Chap. C.

Appendix D

Beyond Form Invariance: The Geometric Prior

There is no correction to Chap. D.

Appendix E

Inferring Mean or Standard Deviation

There is no correction to Chap. E.

Appendix F

Form Invariance II: Natural x

There is no correction to Chap. F.

Appendix G

Item Response Theory

There is no correction to Chap. G.

Appendix H

On the Art of Fitting

We have completely rewritten the present appendix because in the second edition of the present book it was too sketchy to be understandable.

H.1 The Geometric Measure on the Scale of a Chi-Squared Distribution

According to the second line of Eq. (9.18) the geometric measure on the scale of η is

$$\mu_g(\eta) = \frac{1}{2} [F(\eta)]^{1/2}, \quad (\text{H.1})$$

if F is the Fisher function of Eq. (9.2), which means

$$F(\eta) = - \int dy \tilde{\chi}_f^{\text{sq}}(y|\eta) \frac{\partial^2}{\partial \eta^2} \ln \tilde{\chi}_f^{\text{sq}}(y|\eta), \quad (\text{H.2})$$

and $\tilde{\chi}_f^{\text{sq}}(y|\eta)$ is the model (13.7). This yields

$$\begin{aligned} F(\eta) &= -\frac{1}{\Gamma(f/2)} \int_{-\infty}^{\infty} dy \exp\left(\frac{f}{2}[y-\eta] - e^{y-\eta}\right) \frac{\partial^2}{\partial \eta^2} \left(\frac{f}{2}[y-\eta] - e^{y-\eta}\right) \\ &= \frac{1}{\Gamma(f/2)} \int dy \exp\left(\frac{f}{2}[y-\eta] - e^{y-\eta}\right) e^{y-\eta} \end{aligned}$$

$$\begin{aligned}
&= \frac{1}{\Gamma(f/2)} \int_{-\infty}^{\infty} dy \exp\left(\left(\frac{f}{2} + 1\right)[y - \eta] - e^{y-\eta}\right) \\
&= \frac{\Gamma(f/2 + 1)}{\Gamma(f/2)} \\
&= \frac{f}{2}.
\end{aligned} \tag{H.3}$$

For the step from the third to the fourth line of this equation, one uses the fact that $\tilde{\chi}_N^{\text{sq}}$ is normalised to unity. The last line follows from Eq. (B.24) in Appendix B. By Eq. (H.1) one obtains

$$\mu_g(\eta) = \left(\frac{f}{8}\right)^{1/2}. \tag{H.4}$$

H.2 Convoluting Chi-Squared Distributions

Let a set of positive numbers $t_k, k = 1, \dots, N$, be given so that each one follows a chi-squared distribution (4.34). The distribution of t_k ,

$$q_k(t_k|\xi) = \frac{\xi^{f_k/2}}{\Gamma(f_k/2)} t_k^{f_k/2-1} \exp(-t_k\xi), \quad 0 < t_k, \xi < \infty, \tag{H.5}$$

shall have the number f_k of degrees of freedom. The f_k are positive; they need not be integer. For $k \neq k'$ the number f_k may be different from $f_{k'}$. We show that the quantity

$$T = \sum_{k=1}^N t_k \tag{H.6}$$

follows the chi-squared distribution with

$$f^{\text{tot}} = \sum_{k=1}^N f_k \tag{H.7}$$

degrees of freedom. In Eq. (13.23) we have made use of this theorem. It is a consequence of the convolution theorem. We explain the notion of “con-

volution” and state the theorem. It describes the structure of the Fourier¹ transform of a convolution. From this follows the distribution of T , see Sect. H.4. The Fourier transform is defined in Sect. H.3.

The convolution $q_1 \circ q_2(x)$ of the functions $q_1(t_1|\xi)$ and $q_2(t_2|\xi)$ is

$$\begin{aligned} q_1 \circ q_2(T) &= \int_0^\infty dt_2 q_1(T - t_2|\xi)q_2(t_2|\xi) \\ &= \int_0^\infty dt_1 \int_0^\infty dt_2 \delta(T - t_1 - t_2)q_1(t_1|\xi)q_2(t_2|\xi) \\ 0 &< T < \infty, \end{aligned} \tag{H.8}$$

where $\delta(x)$ is Dirac’s δ distribution. Integrating $q_1 \circ q_2$ over T from 0 to ∞ yields unity since the distributions q_k are normalised to unity. The N -fold convolution is

$$q_1 \circ \dots \circ q_N(T) = \int_0^\infty dt_1 \dots \int_0^\infty dt_N \delta(T - \sum_{k=1}^N t_k) \prod_{k=1}^N q_k(t_k). \tag{H.9}$$

This convolution is again normalised to unity.

According to Eq.(H.17) the Fourier transform of q_k is

$$F_k(z) = \frac{1}{\sqrt{2\pi}} \int_{-\infty}^\infty dt_k q_k(t_k|\xi) e^{izt_k}. \tag{H.10}$$

Here, we set $q_k(t_k|\xi)$ equal to zero for negative values of t_k in order to obtain the integration from $-\infty$ to ∞ required by the definition (H.17) of the Fourier transform. Equation (H.32) says that

$$F_k(z) = \frac{\xi^{f_k/2}}{\sqrt{2\pi}} \frac{1}{(\xi - iz)^{f_k/2}}. \tag{H.11}$$

Let $F_{1\circ 2}$ be the Fourier transform of $q_1 \circ q_2$. The convolution theorem says that $F_{1\circ 2}(z)$ equals the product of F_1 and F_2 ,

$$F_{1\circ 2}(z) = F_1(z)F_2(z), \tag{H.12}$$

¹Joseph Fourier, 1768–1830, French mathematician and physicist, member of the Académie des Sciences. He studied the transport of heat in solids. In this context he discovered the possibility to expand distributions into the series which nowadays carries his name.

see entry 3 in Sect. 12.22 of [2]. It follows

$$F_{1\circ 2}(z) = \frac{\xi^{(f_1+f_2)/2}}{2\pi} \frac{1}{(\xi - iz)^{(f_1+f_2)/2}}. \quad (\text{H.13})$$

This can be generalised to the statement: the Fourier transform $F_{1\circ\dots\circ N}(\xi)$ of the N -fold convolution (H.9) equals the product of the N Fourier transforms F_k ,

$$F_{1\circ\dots\circ N}(\xi) = \prod_{k=1}^N F_k(\xi). \quad (\text{H.14})$$

since — according to Eq. (H.9) — the operation of convoluting is commutating and associative. This yields

$$F_{1\circ\dots\circ N}(z) = \frac{\xi^{f^{\text{tot}}/2}}{(2\pi)^{N/2}} \frac{1}{(\xi - iz)^{f^{\text{tot}}/2}}, \quad -\infty < z < \infty, \quad 0 < \xi < \infty, \quad (\text{H.15})$$

where f^{tot} is given by Eq. (H.7).

Inverting the Fourier transformation that gave (H.15), one finds

$$\begin{aligned} & \frac{\xi^{f^{\text{tot}}/2}}{(2\pi)^{(N+1)/2}} \int_{-\infty}^{\infty} dz \frac{e^{-iTz}}{(\xi - iz)^{f^{\text{tot}}/2}} \\ &= \begin{cases} \frac{\xi^{f^{\text{tot}}/2}}{\Gamma(f^{\text{tot}}/2)} T^{f^{\text{tot}}/2-1} \exp(-T\xi) & \text{for } T > 0 \\ 0 & \text{for } T < 0, \end{cases} \end{aligned} \quad (\text{H.16})$$

see Eqs. (H.33), and (H.26). Thus the quantity T of Eq. (H.6) follows a chi-squared distribution with f^{tot} degrees of freedom which was to be shown.

H.3 Definitions of Fourier Transforms

Let $q(t)$ be a real function which can be integrated over the whole real axis, i.e. the integral

$$\int_{-\infty}^{\infty} dt q(t)$$

exists. We do not require the function $q(t)$ to be regular at all t . The Fourier transform

$$F(z) = \frac{1}{\sqrt{2\pi}} \int_{-\infty}^{\infty} dt q(t) e^{izt} \quad (\text{H.17})$$

exists for all real z . This definition of is found in Sect. 12.21 of [2].

The Fourier transform is an expansion of q in terms of the orthogonal functions

$$\frac{1}{\sqrt{2\pi}} e^{izt}.$$

They are orthogonal in the sense that

$$\frac{1}{2\pi} \int_{-\infty}^{\infty} dt e^{i(z-z')t} = \delta(z - z') \quad (\text{H.18})$$

according to the entry 1 in Sect. 12.23 of [2].

The inversion of the Fourier transform is given in Sect. 12.21 of [2] to be

$$q(t) = \frac{1}{\sqrt{2\pi}} \int_{-\infty}^{\infty} dz F(z) e^{-izt}. \quad (\text{H.19})$$

Antisymmetric and symmetric functions q can be expanded into the so-called Fourier sine and Fourier cosine transforms

$$F_s(z) = \left(\frac{2}{\pi}\right)^{1/2} \int_0^{\infty} dt q(t) \sin(zt) \quad (\text{H.20})$$

and

$$F_c(z) = \left(\frac{2}{\pi}\right)^{1/2} \int_0^{\infty} dt q(t) \cos(zt), \quad (\text{H.21})$$

see Sect. 12.31 of [2]. The symmetric and antisymmetric parts of $q(t)$ — in the sense of a reflection at the origin — are picked up by the cosine and sine transformations. The symmetric part is

$$q^S(t) = \frac{1}{2} (q(t) + q(-t)) \quad (\text{H.22})$$

while

$$q^A(t) = \frac{1}{2} (f(t) - f(-t)) \quad (\text{H.23})$$

is the antisymmetric part. This leads to

$$\begin{aligned} F(z) &= \frac{1}{\sqrt{2\pi}} \int_{-\infty}^{\infty} dt [q^S(t) + q^A(t)] [\cos(zt) + i \sin(zt)] \\ &= \frac{1}{\sqrt{2\pi}} \int_{-\infty}^{\infty} dt [q^S(t) \cos(zt) + iq^A(t) \sin(zt)] \end{aligned} \quad (\text{H.24})$$

because the integrals over products of a symmetric function with an antisymmetric one vanish. It follows

$$F(z) = \left(\frac{2}{\pi}\right)^{1/2} \int_0^{\infty} dt [q^S(t) \cos(zt) + iq^A(t) \sin(zt)]. \quad (\text{H.25})$$

H.4 The Fourier Transform of the Chi-Squared Distribution

We are interested in the Fourier transform $F(z)$ — defined in (H.17) — of the chi-squared distribution (H.5). This means to derive the Fourier transform $F(z)$ of the distribution

$$q(t|\xi) = \begin{cases} \frac{\xi^{f/2}}{\Gamma(f/2)} t^{f/2-1} \exp(-t\xi) & \text{for } x > 0 \\ 0 & \text{for } x < 0. \end{cases} \quad (\text{H.26})$$

For simplicity we have omitted the index k that appears in Eq. (H.5). Thus f is not a function but rather the number of degrees of freedom of the chi-squared distribution. Note that ξ in the present context is a fixed number that conditions the distribution q .

Equation (H.26) defines q such that both, its symmetric and its antisymmetric part, equal $q(t|\xi)/2$ for positive t . In this case Eq. (H.25) yields the Fourier transform

$$F(z) = \frac{1}{2} [F_c(z) + iF_s(z)]. \quad (\text{H.27})$$

The Fourier cosine transform F_c is given as entry 14⁷ of Sec. 12.34 in [2]. One finds

$$F_c(z) = \left(\frac{2}{\pi}\right)^{1/2} \xi^{f/2} (\xi^2 + z^2)^{-f/4} \cos\left(\frac{f}{2} \tan^{-1} \frac{z}{\xi}\right). \quad (\text{H.28})$$

The Fourier sine transform is

$$F_s(z) = \left(\frac{2}{\pi}\right)^{1/2} \xi^{f/2} (\xi^2 + z^2)^{-f/4} \sin\left(\frac{f}{2} \tan^{-1} \frac{z}{\xi}\right), \quad (\text{H.29})$$

see entry 16 of Sec. 12.33 in [2]. Equation (H.27) then gives

$$\begin{aligned} F(z) &= \frac{\xi^{f/2}}{\sqrt{2\pi}} (\xi^2 + z^2)^{-f/4} \exp\left(i\frac{f}{2} \tan^{-1} \frac{z}{\xi}\right), \\ -\infty &< z < \infty, \\ 0 &< \xi < \infty. \end{aligned} \quad (\text{H.30})$$

The arctangent of z/ξ is the phase of the complex number $\xi + iz$, i.e.

$$\tan^{-1} \frac{z}{\xi} = \arg(\xi + iz). \quad (\text{H.31})$$

Therefore Eq. (H.30) takes the form

$$\begin{aligned}
F(z) &= \frac{\xi^{f_k/2}}{\sqrt{2\pi}} (\xi^2 + z^2)^{-f_k/4} \exp\left(i\frac{f_k}{2} \arg(\xi + iz)\right) \\
&= \frac{\xi^{f_k/2}}{\sqrt{2\pi}} \left[(\xi^2 + z^2)^{1/2} \exp(-i \arg(\xi + iz)) \right]^{-f_k/2} \\
&= \frac{\xi^{f_k/2}}{\sqrt{2\pi}} (\xi - iz)^{-f_k/2} \\
&= \frac{1}{\sqrt{2\pi}} \frac{1}{(1 - iz/\xi)^{f_k/2}}, \quad -\infty < z < \infty, 0 < \xi < \infty. \quad (\text{H.32})
\end{aligned}$$

This is the Fourier transform of the function defined in Eq. (H.26).

The inversion (H.19) of this Fourier transformation yields the function in Eq. (H.26),

$$\frac{1}{2\pi} \int_{-\infty}^{\infty} dz, \frac{e^{-izt}}{(1 - iz/\xi)^{f/2}} = q(t|\xi), \quad (\text{H.33})$$

from which we started.

Bibliography

- [1] Ch. Fuhrmann, H.L. Harney, K. Harney, and A. Müller. On the Bayesian posterior distribution. To be published.
- [2] I.S. Gradshteyn, I.M. Ryzhik, and D. Zwillinger. *Table of Integrals, Series, and Products*. Academic Press, New York, 8th edition, 2015.