STATISTICAL ANALYSIS WITH A BAYESIAN APPROACH TO THE HARDY-WEINBERG EQUILIBRIUM

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- ABSTRACT: In population genetics, it is very common to use statistical analysis to test the Hardy-Weinberg genetic equilibrium in a given population. The classical method of approaching this problem is done through the chi-square test that often leads to the verification of the equilibrium hypothesis. In the present work, a Bayesian analysis was developed involving hypothesis testing, estimation and credibility intervals to test this balance. Data on M, MN and N blood groups from the MNS system were used on samples from two populations, one from Brazilians and one from North Americans, obtained by Beiguelman (1977). The Hardy-Weinberg equilibrium hypothesis was confirmed. By Bayesian analysis, the rejection of the Hardy-Weinberg equilibrium hypothesis was confirmed, mainly by the Bayes factor. Our primary concern was to develop a Bayesian technique as an alternative to testing Hardy-Weinberg equilibrium using the MNSs blood sample data. The result obtained may encourage researchers mainly in the field of biological sciences to practice Bayesian Methodology, as an alternative in statistical tests.
- KEYWORDS: Genetics; chi-square test; credibility intervals; blood groups.

1 Introduction

In population genetics, the use of the structure of statistical analysis to test Hardy-Weinberg genetic equilibrium is very common. The classical method of approaching this

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problem is performed using the chi-square adherence test, which often assumes the hypothesis of the referred genetic balance.

Researchers such as Hogen (1946), Levence (1949), Haldade (1954), Cannings (1969), Smith (1970), Emigh (1975), Elston (1977), and Beiquelman (1973) developed methods to prove or reject the hypothesis of Hardy-Weinberg equilibrium given a population sample using the chi-square adherence test. Rogatko (1985) made a study, through the Bayesian methodology of data analysis, for problems of estimation of the penetrance from genealogies, and the verification of the Hardy-Weinberg equilibrium, in Mendelian populations. Giannoni (1989) conducted an study on quantitative and population genetics to demonstrate and make applications of Hardy-Weinberg equilibrium related to multiple alleles and genes linked to sex, in cases of codominance and complete dominance.

In the present work, a Bayesian analysis was developed involving hypothesis testing, Bayes estimator and credibility intervals to test said balance. Data regarding the M, MN and N blood groups of the MNSs system were used in samples from two populations, one from Brazilians and one from Americans, obtained by Beiguelman (1977). The Hardy-Weinberg equilibrium adhesion test χ^2 was performed, which confirms the acceptance of the Hardy-Weinberg equilibrium hypothesis. The Bayesian analysis developed confirmed the rejection of the Hardy-Weinberg equilibrium hypothesis, estimated by the Bayes factor. The fundamental objective was to develop a Bayesian analysis technique, as an alternative to test the Hardy-Weinberg equilibrium, thus using blood group sample data from the MNSs system. The result obtained may encourage researchers mainly from the field of biological sciences in the practice of Bayesian methodology, as an alternative in statistical tests.

The frequencies of the M and N alleles in each population are estimated. The Hardy-Weinberg equilibrium adherence test is performed and the Bayesian methodology is applied to test the genetic balance in the same samples used in the Hardy-Weinberg equilibrium adhesion test.

2 Material and methods

We are using data regarding to the M, MN and N blood groups of the MNSs system, obtained from samples from two populations, one from Brazilians and one from the Americans, respectively, with which the probabilities are determined. Posteriori, under the Hardy-Weinberg hypothesis H_0 of equilibrium, as shown in Table I below. The frequencies of the M and N alleles in each population are estimated, and the standard deviation of q is calculated using $\sigma_q = \sqrt{pq/2n}$ where n is the sample size. We denote by \mathbf{n}_1 : the absolute frequency of the genotype A_1A_1 , n_2 : the absolute frequency of the genotype A_2A_2 . Thus, if we call p the relative frequency of the allele A_1 , and q the allele A_2 , and symbolize the relative frequencies of individuals with genotypes A_1A_1 , A_1A_2 and A_2A_2 by D, $H \in R$, respectively, it can be written that the frequencies p and q of alleles A_1 , and A_2 in the generation under study will be:

$$p = \frac{2n_1 + n_2}{2(n_1 + n_2 + n_3)} = \frac{n_1}{n_1 + n_2 + n_3} + \frac{1}{2} \left(\frac{n_2}{n_1 + n_2 + n_3} \right)$$
(1)

and

$$q = \frac{2n_3 + n_2}{2(n_1 + n_2 + n_3)} = \frac{n_3}{n_1 + n_2 + n_3} + \frac{1}{2} \left(\frac{n_2}{n_1 + n_2 + n_3} \right)$$
(2)

Table 1 - Comparison between the expected Hardy-Weinberg equilibrium genotype frequencies and those observed in samples from two Beiguelman populations (1977), classified according to the blood groups of the MNss system with two sera (anti-m and anti-n)

Samples	Blood	Observed		Frequencies	Expected		$\chi^2_{(1)}$
	group	Ν	%	e <i>σq</i>	Ν	%	n (1)
	М	30	30	p = 0.55	$np^2 = 30.25$	$p^2 = 30.25$	
Brazilians	MN	50	50	q = 0.45	$n^2 pq = 49.5$	2pq = 49.5	0.010
	Ν	20	20	$\sigma_q = 0.035$	$nq^2 = 20.25$	$q^2 = 20.25$	<i>P</i> < 0.95
	Total	100	100		100	100	
	М	125	31,7	p = 0.562	$np^2 = 124.5$	$p^2 = 31.6$	
North-	MN	193	49	q = 0.438	$n^2 pq =$	2pq = 49.2	0.008
					193.8		
Americans	Ν	76	19,3	$\sigma_q = 0.018$	$nq^2 = 75.8$	$q^2 = 19.2$	<i>P</i> < 0.95
	Total	394	100		394	100	

P is the value of the proof, and in the two samples considered we have to: 0.90 < P < 0.95.

It is known that:

$$D = \frac{n_1}{n_1 + n_2 + n_3}, H = \frac{n_2}{n_1 + n_2 + n_3} e R = \frac{n_2}{n_1 + n_2 + n_3}$$

You can also write:

$$p = D + \frac{1}{2}H \tag{3}$$

$$q = R + \frac{1}{2}H \quad ou \quad p = 1 - q \tag{4}$$

Thus, in the sample of Brazilians: p = 0.55, so, q = 0.45 and in the sample of Americans, p = 0.562, so, q = 0.438.

To calculate the frequencies in these classes two pieces of information are needed, that is, the sample size and the frequency of one of the alleles. So the number of degrees of freedom of the χ^2 is equal to the number of expected classes minus the number of information required to calculate the frequencies in these classes, thus, in the present case, that *G*. *L*. = 1.

A posteriori distribution

The choice of a priori distribution is restricted to the class of beta distributions given by:

$$B(x|a;b) = \int_{a}^{b} x^{a-1}(1-x)^{b-1}dx, \qquad a > 0 \ e \ b > 0$$
(5)

It is deduced that this distribution, with parameters: a = 1 e b = 5, has a considerable approximation with the distribution of homozygous genotypes A_2A_2 , n populations with different allelic frequencies and Hardy-Weinberg equilibrium.

Therefore, a priori to R will be:

$$B(R|1;5) = \int_{0}^{1} (1-R)^{4} dR$$
(6)

where, $0 \le R \le 1$ is the range of variation of the genotypic relative frequency of A_2A_2 . A population is in Hardy-Weinberg equilibrium if and only if there is a number p, $(0 \le p \le 1)$ such that $D = p^2$, = 2(1-p) and $R = (1-p)^2$, where D + H + R = 1. Therefore, in the Hardy-Weinberg equilibrium situation the likelihood function is given by

$$L(Y|H_0) = \frac{n!}{n_1! n_2! n_3!} 2^{n_2} p^{n_1 + n_2} (1 - p)^{2n_3 + n_2}$$
(7)

Rev. Bras. Biom., Lavras, v.38, n.1, p.69-78, 2020 - doi: 10.28951/rbb.v38i1.427

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with the implications,

$$D = p^2 \rightarrow p = \sqrt{D}$$
 and $R = (1 - p)^2 \rightarrow 1 - p = \sqrt{R}$.

That replaced in equality H=2p(1-p), have up, $\frac{H^2}{DR}=4$, that is, $D=(1-\sqrt{R})^2$,

which is equivalent to $R = (1 - \sqrt{D})^2$. Let be the parameter $= \frac{H^2}{DR}$, we saw above that, if $\theta = 4$, we have that the hardy-

Combining a priori distribution (R|1; 5) with the likelihood function ($Y|H_0$), the marginal probability function of the data under the Hardy-Weinberg equilibrium hypothesis is given by:

$$F(H_0|Y) = \frac{n!}{n_1! n_2! n_3!} 2^{n_2} p^{n_1 + n_2} (1-p)^{2n_3 + n_2} \int_0^1 (1-R)^2 dR$$

Under the hypothesis $H_1: \theta \neq 4$, (Hardy-Weinberg's non-equilibrium) likelihood can be expressed as:

$$L(Y|H_1) = \frac{n!}{n_1! n_2! n_3!} D^{n_1} H^{n_2} R^{n_3}$$
(8)

A priori may be particularized, in relation to the hypothesis of genetic equilibrium, by a beta distribution with parameters a = 1 and b = 5, imposed by the Hardy-Weinberg equilibrium conditions. We now take as a priori, in relation to the Hardy-Weinberg nonequilibrium hypothesis, a generalized beta probability density function belonging to the Dirichlet class of distributions.

Since $(D, R) \sim D(n_1, n_2, n_3)$, that is, (D, R) has parameterized Dirichlet distribution (n_1, n_2, n_3) . Its density is given by:

$$P(H_1) = \frac{\Gamma(n)}{\Gamma(n_1, n_2, n_3)} D^{n_1 - 1} H^{n_2 - 1} R^{n_3 - 1}$$
(9)

where, $n = n_1 + n_2 + n_3$ and $\Gamma(x)$ represents the gamma function.

Predictive probability function under H_1 , obtained by combining $(Y|H_1)$ with a priori (H_1) , is given by:

$$F(H_1|Y) = \frac{n!}{n_1! n_2! n_3!} D^{n_1} H^{n_2} R^{n_3} \frac{\Gamma(n)}{\Gamma(n_1)\Gamma(n_2)\Gamma(n_3)} D$$
(10)

The marginal (a posteriori) probabilities of the data, determined under the hypothesis of equilibrium $(H_0|Y)$, are presented in Table 2. The marginal (a posteriori) probabilities of the data under the hypothesis of non-equilibrium H_1 are described in Table 3.

Table 2 - Marginal data probabilities, under the hypothesis h_0 Hardy-Weinberg equilibrium in samples obtained from Beiguelman (1977) of two populations, one of Brazilians and one of Americans, respectively

Samples	n_1	n_2	n_3	р	R	$F(H_0 Y)^*$
Brazilians	30	50	20	0.55	0.202	0.0018
North- Americans	125	193	76	0.562	0.192	0.0005

 $F(H_0|Y)^*$ is proportional to 0.0018, as well, it is proportional to 0.0005, in the respective samples.

Table 3 - Marginal data probabilities under the Hardy-Weinberg non-equilibrium hypothesis, $(H_1|Y)$ in samples obtained by Beiguelman (1977) from two populations, one of Brazilians and one of Americans, respectively

Samples	<i>n</i> ₁	n_2	n_3	p	R	$F(H_1 Y)^*$
Brazilians	30	50	20	0.55	0.202	0.8141
North- Americans	125	193	76	0.562	0.192	0.7741

 $F(H_1|Y)^*$ is proportional to 0.8141, as well, it is proportional to 0.7741, in the respective samples.

Bayes Estimator

We have seen that a situation characterizing Hardy-Weinberg equilibrium is given by the expression. $\theta = \frac{H^2}{DR}$, when θ equals 4, where θ is a parameter of interest.

The Bayes estimator for the parameter is simplified by two facts:

If (D, R) has a priori distribution $D(\alpha_1, \alpha_2, \alpha_3)$, that is, Dirichlet distribution with parameters $(\alpha_1, \alpha_2, \alpha_3)$, then it is a posteriori distribution is $D(\alpha_1 + n_1, \alpha_2 + n_2, \alpha_3 + n_3)$.

If $X_1, X_2 \in X_3$ are independent gamma variables with parameters $(a_1 + n_1; \beta)$, $(a_2 + 2; \beta)$ and $(a_3 + n_3; \beta)$ respectively, then $(\frac{X_1}{X}, \frac{X_2}{X}, \frac{X_3}{X})$, where $X = X_1 + X_2 + X_3$, have distribution $D(\alpha_1 + n_1, \alpha_2 + n_2, \alpha_3 + n_3)$, where β is the scale parameter.

These two results imply that θ have distribution $\frac{x_2^2}{x_1x_3}$.

<u>Proposition</u>: If $\alpha_1 + n_1 > 1$ and $\alpha_3 + n_3 > 1$, then the Bayes estimator of the a posteriori average of θ , that is, $\hat{\theta} = E\left(\frac{X_2^2}{X_1X_3}\right)$ is given by:

$$\hat{\theta} = \frac{(\alpha_2 + n_2)(\alpha_2 + n_2 + 1)}{(\alpha_1 + n_1 - 1)(\alpha_3 + n_3 - 1)}$$
(11)

In addition, if $(\alpha_2 + n_2) > 2$ and $(\alpha_2 + n_2) > 2$, then the a posteriori variance of θ is given by:

$$Var[\theta|(n_1, n_2, n_3)] = \hat{\theta} \left[\frac{(\alpha_2 + n_2 + 2)(\alpha_2 + n_2 + 3)}{(\alpha_1 + n_1 - 2)(\alpha_3 + n_3 - 2)} - \hat{\theta} \right]$$
(12)

This proposition is demonstrated in Rogatko (1985).

Taking the data regarding the M, MN and N blood groups from the MNSs system, obtained from samples from two populations, one from Brazilians and one from Americans, by Beiguelman (1977), we now have the results shown in Table 4, below.

Table 4 - Bayesian estimators for the parameter θ Hardy-Weinberg equilibrium and its variances a posteriori in samples obtained from Beiguelman (1977), of two populations, one of Brazilians and one of Americans, respectively

Samples	n_1	n_2	n_3	$\widehat{ heta}$	$Var[\theta (n_1, n_2, n_3)]$
Brazilians	30	50	20	4.39	1.654
North- Americans	125	193	76	3.97	0.346

 $\hat{\theta}$ is the a posteriori estimated average of θ .

Credibility interval

A Bayesian range with 95% credibility to contain θ , considering θ normally distributed, is given by:

$$IC(\theta)_{(0.95)} = \hat{\theta} \pm 1.96 \sqrt{Var[\theta|(n_1, n_2, n_3)]}$$
(13)

Based on a posteriori distribution, a credibility interval that has a 95% chance of containing θ . Then, for the sample of Brazilians, according to the results extracted from Table 4, a credibility interval given by:

 $IC(\theta)_{(0.95)} = 4.39 \pm 2.56$ ou seja, $1.86 \le \theta \le 6.91$.

For a sample of Americans, according to the results extracted from Table 4, the credibility interval is given by:

$$IC(\theta)_{(0.95)} = 3.97 \pm 1.15$$
 that is, $2.82 \le \theta \le 5.12$.

It is observed that in the equilibrium condition the parameter θ really falls within the two credibility ranges calculated above, and the second range is narrower, or more accurate, as it refers to a sample that has, besides the lower a posteriori average, also a much smaller a posteriori variance than the a posteriori variance of the first sample.

3 Results and discussion

The classical statistics methods require that the sample space of the experiment to be performed be fully known. This requirement comes from the fact that these methods are based on the probability distribution of the data for each parameter value (which is unknown). It turns out that in Population Genetics, the probability distribution for allelic and genotypic frequencies of a population that meets the Hardy-Weinberg equilibrium conditions is not precisely determined.

In Bayesian inference, instead of taking into account all the infinite possible observations that could have occurred but did not, we consider the results actually observed. Moreover, sample size does not limit its application (CANNING, 1969).

Gelman (1977) agrees that all statistical methods that use probabilities are subjective in the sense that they are based on mathematical idealizations of the world.

According to Reis (2011), it is assumed that the best Bayesian model to study Hardy-Weinberg equilibrium through the inbreeding coefficient is that which uses Dirichlet a priori distributions.

The researcher Shoemaker (2018) compares the Dirichlet prioris, beta, uniform and uniform step, which confirms a priori Dirichlet, as the best option to study Hardy-Weinberg imbalance.

Although, the choice of a priori distribution for the Hardy-Weinberg equilibrium hypothesis was based on the distribution of homozygous genotypes A_2A_2 , in populations with different allelic frequencies and within quadratic proportions, we could also choose an a priori distribution based on the distribution of heterozygous genotypes A_1A_2 , or even homozygous genotypes A_1A_1 . Therefore, given the value of emos we get the value of q, and by the conditions of the said equilibrium D, H and R are related by D = p2, H = 2pq and R = q2.

The major relevance for the rejection of the Hardy-Weinberg equilibrium hypothesis is the fact that the posterior distributions for the non-equilibrium hypothesis are greater than the posterior distributions for the equilibrium hypothesis, $F(H_0|Y) < F(H_1|Y)$.

In the Hardy-Weinberg equilibrium adherence test, the hypothesis of equilibrium, in relation to the same previous samples, was accepted. However, the opposite occurs, that

is, the rejection of the equilibrium hypothesis, when the Bayesian methodology is used, a fact that it is an agreement, thus, with the injunction of the evolutionary factors, that is, of those quantities capable of to alter allele frequencies (mutation, natural selection, gene flow and genetic drift). Bayes factors in relation to the Brazilian sample and the North American sample, respectively, were:

$$FB(H_0; H_1) = \frac{L(Y|H_0)}{L(Y|H_1)} = 1 \quad e \quad FB(H_0; H_1) = \frac{L(Y|H_0)}{L(Y|H_1)} = 1.040$$

This fact confirms the rejection of H_0 because a Bayes factor equal to 1, or tending to 1, indicates a lower predisposition to accept H_0 , rather than H_1 .

4 Conclusions

The rejection of the Hardy-Weinberg equilibrium hypothesis was found, when it is tested by the Bayesian methodology, which leads us to reflect that the Bayesian analysis obtained relatively closer results to the reality of the concrete facts.

The Bayesian analysis methods developed in this paper to verify Hardy-Weinberg equilibrium hypothesis have the advantage that they are applicable to samples of any size.

The Bayesian techniques studied showed significant differences in relation to the chi-square adherence test, commonly used to test the Hardy-Weinberg equilibrium hypothesis.

The Bayesian methods presented were efficient to test the Hardy-Weinberg equilibrium. Their application may serve as a subsidy so that the researcher's decision-making is as close to reality as possible.

Acknowledgements

We thank the editors and reviewers for their comments and suggestions.

SANTOS, J. N. M.; CUNHA FILHO, M.; CRUZ, D. V.; OLIVEIRA, E. C. A.; CUNHA, A. L. X.; ARAUJO FILHO, R. N. Análise estatística com uma abordagem bayesiana ao equilíbrio de Hardy-Weinberg. *Rev. Bras. Biom.* Lavras, v.38, n.1, p.69-78, 2020.

• ABSTRACT: Em genética de populações é muito comum usar análise estatística para testar o equilíbrio genético de Hardy-Weinberg em uma determinada população. O método clássico de abordagem deste problema é realizado através do teste do qui-quadrado que, muitas vezes, leva à verificação da hipótese de equilíbrio. No presente trabalho, foi desenvolvida uma análise bayesiana envolvendo testes de hipóteses, intervalos de estimação e credibilidade para testar esse equilíbrio. Dados de grupos sanguíneos M, MN e N do sistema MNS foram utilizados em amostras retiradas de duas populações, uma de brasileiros e outra de norte-americanos, obtidas por Beiguelman (1977). Foi realizado o teste de aderência do qui-quadrado para testar o equilíbrio de Hardy-Weinberg, onde foi confirmada a aceitação da hipótese de equilíbrio de Hardy-Weinberg. Pela análise bayesiana, a rejeição da hipótese de equilíbrio de Hardy-Weinberg foi confirmada, principalmente pelo fator Bayes. Nossa principal preocupação era

desenvolver uma técnica bayesiana como uma alternativa para testar o equilíbrio de Hardy-Weinberg usando os dados da amostra de sangue do MNS. O resultado obtido pode incentivar os pesquisadores, principalmente, no campo das ciências biológicas, a utilizatr a Metodologia Bayesiana como alternativa os testes clássicos para análise do equilíbrio de Hardy-Weinberg.

• *KEYWORDS: Genética, teste do qui-quadrado, intervalos de credibilidade, grupos sanguíneos.*

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Received on 17.04.2019 Approved after review on 30.09.2019