

## Statistical evidence favoring Poisson variation in *Rb9 trans* and *Rb9 cis*

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The possibility of Poisson variation of tumor multiplicities in each of the four groups [*Rb9*-free (+/+), *Rb9 trans*, *Rb9 cis*, *Rb9/Rb9*] is assessed in two steps. First, the null hypothesis of Poisson variation is tested by exact conditional inference<sup>A</sup>. Conditionally on the total tumor count in each line, the numbers of tumors per animal has a multinomial distribution. The null distribution of the sample coefficient of dispersion (CD) test statistic is obtained by Monte Carlo simulation, and a small group-specific p-value indicates evidence against Poisson variation (Table A).

**Table A • p-values based on 10<sup>4</sup>-1 simulated data sets**

+/+	<i>Rb9 trans</i>	<i>Rb9 cis</i>	<i>Rb9/Rb9</i>
0.0001	0.37	0.38	0.15

These results indicate that the *Rb9*-free line is not consistent with Poisson variation but the *Rb9*-carrying lines are consistent with such variation. Calculations were done using R ([www.r-project.org](http://www.r-project.org)). As extra-Poisson variation is often observed with tumor multiplicity data, these results do not in themselves provide positive evidence favoring Poisson variation. Such evidence is assessed in a second calculation.

The two-parameter Negative Binomial distribution describes variation in tumor multiplicity data and includes the Poisson distribution as a special case<sup>B</sup>. Specifically, the probability mass assigned to *x* tumors is

$$p(x|\lambda, \kappa) = c \lambda^x \Gamma(x+1/\kappa) / \Gamma(x+1)$$

where *c* is a normalizing constant,  $\lambda$  is the expected tumor count,  $\Gamma(\cdot)$  is the Gamma function, and  $\kappa \geq 0$  characterizes over-dispersion relative to the Poisson in that the variance is  $\lambda (1+\kappa \lambda)$ . The Poisson distribution arises in the limit when  $\kappa = 0$ .

To evaluate the evidence supporting  $\kappa = 0$  in the *Rb9* groups, we note that each of the four groups may have its own value of  $\lambda$  and its own value of  $\kappa$ . Different hypotheses may be posed regarding the equality of the  $\lambda$ 's among some of the groups, equality of the  $\kappa$ 's among some groups, and whether or not  $\kappa = 0$  for any groups. In total, there are 780 distinct hypotheses (15 patterns among the  $\lambda$ 's and, for each, 52 patterns among the  $\kappa$ 's). We estimated by the method of maximum likelihood the free parameters under each hypothesis, thus obtaining a maximized log-likelihood (*L*) and a number of parameters (*p*). The best hypothesis maximizes *L* subject to a complexity penalty. Using either the Akaike information criterion (AIC)<sup>C</sup> or the Bayes information criterion (BIC)<sup>D</sup>, the best model entails Poisson variation for both *Rb9 trans* and *Rb9 cis*, equality of means for these groups, different means but common shape between the +/+ case and the *Rb9/Rb9* case. Table B indicates the position of several hypotheses. A traditional hypothesis testing approach would not evaluate the evidence in favor of Poisson variation, which is supported by the global analysis based on BIC and AIC.

**Table B • Statistical evidence favoring Poisson variation in *Rb9 trans* and *Rb9 cis***

+/-	Pattern of means			+/-	Pattern of $\kappa$			L	p	BIC(r)	AIC(r)
	<i>Rb9 trans</i>	<i>Rb9 cis</i>	<i>Rb9/Rb9</i>		<i>Rb9 trans</i>	<i>Rb9 cis</i>	<i>Rb9/Rb9</i>				
1	2	2	3	1	0	0	1	-211.62	4	1	1
1	2	2	3	1	0	0	0	-211.68	4	2	2
1	2	2	3	1	0	1	1	-212.43	4	3	6
1	2	3	4	1	0	0	1	-210.71	5	8	3
1	2	2	3	1	1	0	1	-212.46	4	4	7
1	2	3	4	1	0	0	0	-210.76	5	9	4
1	2	3	4	1	1	1	1	-212.55	5	40	52
1	2	3	4	1	2	3	4	-210.50	8	160	91

In columns 1-4 equality of the label corresponds to equality of the means. In columns 5-8 equality of the label corresponds to equality of  $\kappa$ , and, further, the label 0 indicates Poisson variation in that group. L is the maximized log-likelihood; p is the number of free parameters; BIC(r) and AIC(r) are, respectively, the rank (out of 780) of the hypothesis in terms of the BIC and the AIC. Models were fit using Splus 3.4 (Mathsoft).

## References

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