### UC Berkeley UC Berkeley Previously Published Works

### Title

Similar rates of protein adaptation in Drosophila miranda and D. melanogaster, two species with different current effective population sizes

**Permalink** https://escholarship.org/uc/item/4bn7f257

**Journal** BMC Ecology and Evolution, 8(1)

**ISSN** 2730-7182

Author Bachtrog, Doris

Publication Date 2008

**DOI** 10.1186/1471-2148-8-334

Peer reviewed

# **BMC Evolutionary Biology**

### Research article

### Similar rates of protein adaptation in Drosophila miranda and D. melanogaster, two species with different current effective population sizes Doris Bachtrog

**Open Access** 

Address: Department of Integrative Biology, University of California Berkeley, 3060 Valley Life Sciences Building, Berkeley, CA 94720, USA Email: Doris Bachtrog - dbachtrog@berkeley.edu

Published: 18 December 2008

BMC Evolutionary Biology 2008, 8:334 doi:10.1186/1471-2148-8-334

This article is available from: http://www.biomedcentral.com/1471-2148/8/334

© 2008 Bachtrog; licensee BioMed Central Ltd.

This is an Open Access article distributed under the terms of the Creative Commons Attribution License (<u>http://creativecommons.org/licenses/by/2.0</u>), which permits unrestricted use, distribution, and reproduction in any medium, provided the original work is properly cited.

Received: 9 April 2008 Accepted: 18 December 2008

### Abstract

**Background:** Adaptive protein evolution is common in several Drosophila species investigated. Some studies point to very weak selection operating on amino-acid mutations, with average selection intensities on the order of  $N_e s \sim 5$  in *D. melanogaster* and *D. simulans*. Species with lower effective population sizes should undergo less adaptation since they generate fewer mutations and selection is ineffective on a greater proportion of beneficial mutations.

**Results:** Here I study patterns of polymorphism and divergence at 91 X-linked loci in *D. miranda*, a species with a roughly 5-fold smaller effective population size than *D. melanogaster*. Surprisingly, I find a similar fraction of amino-acid mutations being driven to fixation by positive selection in *D. miranda* and *D. melanogaster*. Genes with higher rates of amino-acid evolution show lower levels of neutral diversity, a pattern predicted by recurrent adaptive protein evolution. I fit a hitchhiking model to patterns of polymorphism in *D. miranda* and *D. melanogaster* and estimate an order of magnitude higher selection coefficients for beneficial mutations in *D. miranda*.

**Conclusion:** This analysis suggests that effective population size may not be a major determinant in rates of protein adaptation. Instead, adaptation may not be mutation-limited, or the distribution of fitness effects for beneficial mutations might differ vastly between different species or populations. Alternative explanation such as biases in estimating the fraction of beneficial mutations or slightly deleterious mutation models are also discussed.

### Background

Researchers have made considerable progress in recent years to quantify rates of adaptive evolution in the genome using population variability data [1-6]. Many studies aimed at detecting adaptive evolution have applied the McDonald-Kreitman (MK) test [7] or modifications of it, which contrasts the number of polymorphisms within a species to the number of substitutions between species at two classes of sites, a putatively neutral and a putatively selected class. In protein-coding sequences these classes are usually synonymous and replacement sites [7].

Several members in the *Drosophila melanogaster* species group show high rates of adaptive amino-acid evolution. Using the MK test and its extensions, about half (and up to 95%) of all amino-acid mutations fixed between species are inferred to be driven by positive selection [1-4]. Some uncertainty in estimates of  $\alpha$ , the fraction of aminoacid substitutions driven to fixation by adaptive evolution in D. melanogaster and D. simulans exists among different studies, reflecting in part the choice of loci and their chromosomal location and the populations surveyed, as well as the specific methodology employed to infer adaptive evolution (i.e. see ref. [8] for a discussion). However, estimates of  $\alpha$  at X-linked loci in African, presumably ancestral populations of D. melanogaster and D. simulans are very similar between the two species. In particular, roughly 60% of amino-acid substitutions at X-linked loci are inferred to be adaptive in both a Zimbabwe population of *D. melanogaster* and a Madagascar population of *D*. simulans [3,9]. Both populations have similar levels of Xlinked synonymous diversity,  $\pi_s$  (about 3% [3,9]), indicating that they have similar effective population sizes. Comparable estimates of pervasive positive selection have been obtained in D. americana, a member of the virilis species group [10] which also has similar levels of synonymous diversity (around 2% [10]) and thus probably a similar effective population size  $(N_e)$ .

While adaptive protein evolution appears to be common in Drosophila, we know much less about the strength of selection (s) acting on beneficial amino-acid changes. Different studies and approaches have yielded very different estimates of s for amino acid mutations. In Drosophila, there is a correlation between rates of recombination and levels of nucleotide diversity [11], but the causes of this correlation are controversial [12,13]. Assuming that this correlation is entirely driven by beneficial mutations, Eyre-Walker [14] estimates the strength of selection of fixed mutations in *D. melanogaster* to be  $350 < N_e s < 3500$ . Macpherson et al. [15] also concluded that selection is strong (s ~ 1%; i.e.  $N_e s \sim 10^4 \cdot 10^5$ ), by fitting a genetic hitchhiking model to patterns of genome variability in D. simulans. Similarly, Li and Stephan [16] used a likelihood approach to estimate selection parameters from patterns of single nucleotide polymorphisms in D. melanogaster, and infer selection to be strong (s between 0.05–0.5%). In contrast, Andolfatto [17] inferred much weaker selection by fitting genome variability data in D. melanogaster to a recurrent sweep model, and estimates  $N_e s \sim 40$ . Finally, by fitting MK-type data from *D. simulans* to a weak selection model, Sawyer et al. [4] estimate that the average scaled selection intensity of fixed mutations is only  $N_e s \sim 5$ . Thus, there is little agreement among studies on the average strength of selection of fixed mutations in Drosophila. However, if selection would indeed be on the order of  $N_es$  $\sim 5$  [4], even modest changes in the effective population size among Drosophila species would have dramatic impacts on rates of adaptation between different lineages. That is because mutations are effectively neutral if  $N_{e}s < 1$ , i.e. their fate is mostly governed by genetic drift and not selection [18].

Although the data are limited, there does appear to be a possible correlation between the level of adaptive evolu-

tion and population size: hominids appear to have undergone very little adaptive evolution [5,19], compared with Drosophila, while bacteria and viruses seem to show even higher rates of adaptive divergence [20,21]. This is to be expected given that large populations generate more mutations and selection is effective on a greater proportion of mutations [18]. This might mean that species with small population sizes are much less able to adapt to their environment.

There are, however, some problems with the very broadbrush nature of these patterns. The most fundamental difficulty is that many different aspects of the biology of these very different species compared are confounded. A more direct approach to estimate the influence of  $N_e$  on rates of adaptation is to compare closely related species that differ in their effective population size, such as different members from the genus Drosophila.

Here, I report and analyze data from 91 X-linked proteincoding genes from D. miranda, to estimate rates of adaptation at the protein level. Synonymous site diversity in this species is substantially lower than in members of the D. melanogaster species group, only about 0.4% [22-24], suggesting a 5-fold lower current effective population size for D. miranda. Thus, if the average selection intensity for beneficial mutations in D. simulans is indeed in the order of  $N_e s \sim 5$ , as suggested by some studies [4], and the distribution of s is similar between species, a large fraction of the beneficial mutations fixed in D. simulans would behave effectively neutral in D. miranda. Previous studies based on many fewer genes scattered over different chromosomes have indeed found little evidence for positive selection operating on amino-acid mutations in D. miranda [23,25]. Applying MK-tests to this much larger data set, I find evidence for high rates of adaptive protein evolution, similar to those reported in the D. melanogaster species group. In addition, I show that genes with high rates of protein evolution harbor lower levels of synonymous site diversity, a signature of hitchhiking effects associated with linked beneficial amino-acid substitutions. These findings are discussed in comparisons with inferences drawn from D. melanogaster, in light of the effect of population size on rates of adaptation.

### Results

### Levels of polymorphism in D. miranda

Here, I study diversity at 91 X-linked coding regions in *D. miranda* (~1.1 kb on average), in a sample of 14 individuals. Table 1 gives an overview of the polymorphism summaries across the regions investigated, and their level of divergence to *D. pseudoobscura*. For locus-specific estimates of polymorphism statistics and divergence, see Additional file 1. A total of 489 synonymous and 144 replacement polymorphisms were observed. Average pairwise diversity is 0.62% at synonymous site, and roughly

	π <b>(%)</b>	D <sub>xy</sub> pse (%)	D <sub>xy</sub> aff (%)	D <sub>xy</sub> ANC (%)	Taj D
Synonymous Sites					
(23142 bp) Replacement Sites	0.621	4.210	25.410	1.670	-0.444
(73584 bp)	0.044	0.569	1.110	0.209	-0.798

Table 1: Summary statistics for 91 X-linked protein-coding genes in a sample of 14 alleles of D. miranda.

Note – Dxy is average pairwise divergence from the outgroup (pse: D. pseudoobscura; aff: D. affinis; ANC: reconstructed ancestor of D. miranda and D. pseudoobscura)

15-fold less at replacement sites (0.04%, see Table 1). Similarly, divergence is lower at replacement sites compared to synonymous sites (Table 1). There is a general skew in the allele frequency spectrum towards rare variants, as measured by Tajima's D [26], both at synonymous sites and at replacement sites (Table 1). However, replacement sites are skewed more strongly towards rare variants compared to synonymous sites (D = -0.80 vs. D = -0.44, Table 1). Reduced diversity, reduced divergence and more low-frequency variants are all expected if amino-acid sites are under stronger purifying selection than synonymous sites [27]. The skew of synonymous sites could reflect non-equilibrium demography, or positive selection at linked sites (see below).

Here, I use synonymous sites as a neutral marker in MK tests, and to detect hitchhiking effects associated with adaptive protein evolution. In Drosophila, synonymous codons are not used randomly, but instead some codons are used preferentially over a different codon encoding for the same amino acid [28,29]. Thus, synonymous sites are not necessarily free of selective constraints. Nevertheless, selection for codon bias is strongly reduced in *D. miranda*, and synonymous sites are evolving probably close to neutral in this species [25,30]. Thus, synonymous polymorphisms are a suitable "almost neutral" marker for tracking adaptive events in *D. miranda*.

#### Adaptive protein evolution in D. miranda

The MK test and its extensions were used to test for adaptive protein evolution in *D. miranda* (Table 2). The fraction of amino-acid substitutions that have been fixed by positive selection ( $\alpha$ ) is estimated using three slightly different approaches [1,2,31]. Segregating slightly deleteri-

 Table 2: Count of synonymous and replacement polymorphism

 in D. miranda and divergence to D. pseudoobscura.

	Divergence	Polyr	Polymorphism	
		all	f > 0.1	
Synonymous	796	489	292	
Replacement	396	144	56	

Note – Dxy is average pairwise divergence from the outgroup (pse: D. pseudoobscura; aff: D. affinis; ANC: reconstructed ancestor of D. miranda and D. pseudoobscura)

ous amino-acid mutations will bias the estimate of  $\alpha$ downwards, because slightly deleterious mutations tend to contribute relatively more to polymorphism than they do to divergence, when compared to neutral mutations [2,32,33]. Slightly deleterious mutations segregate at lower frequencies than neutral alleles, and consistent with the idea of segregating deleterious amino-acid mutations, replacement polymorphisms do segregate at lower frequencies than synonymous mutations in D. miranda (Table 1). I attempt to reduce the effect of slightly deleterious mutations in my analysis, by also removing polymorphisms at a frequency of 10% or lower, at both synonymous and replacement sites (Table 2). If all polymorphisms are considered, estimates of  $\alpha$  range from 12%-41%, depending on the estimation method used (Table 3). If low-frequency variants are ignored, I estimate  $\alpha$  to be between 44%–61% (and the 95% confidence intervals do not overlap zero, Table 3). Thus, roughly half of the protein divergence between D. miranda and D. pseudoobscura is driven by positive selection. These numbers are in close agreement to estimates of  $\alpha$  obtained in D. melanogaster and D. simulans if similar approaches are used to estimate  $\alpha$  [1-3,9,14,31]; but also see [4].

Average synonymous divergence between D. miranda and D. pseudoobscura is low, roughly only 4% (Table 1). It has been suggested that low levels of divergence can lead to upwardly biased estimates of  $\alpha$  for two reasons [8,31]. First, advantageous mutations spread through a population much more rapidly than neutral mutations. Thus, the divergence time may have been to short for a stochastic steady state for fixations to have been reached, resulting in an upward bias in the estimation of  $\alpha$  [31]. The divergence time between D. miranda and D. pseudoobscura is about 7fold larger than the population coalescence time, very similar to that observed for D. melanogaster and D. simulans [9,34]. Thus, if low divergence leads to a bias in the estimation of  $\alpha_{i}$  a similar bias may be expected in the two species comparisons. Secondly, since only a single D. pseudoobscura sequence is used for outgroup comparison, some of the inferred divergence includes undetected segregating polymorphism, which could also result in an upward bias in the estimation of  $\alpha$  [8]. To avoid potential biases in inferring the fraction of beneficial amino-acid fixations due to low levels of divergence, I also estimated

	D. pseudoobscura		D. affinis	ancestor	
method	all sites	excluding singletons	excluding singletons	excluding singletons	
	α (95% Cl)	α (95% CI)	α (95% CI)	α (95% Cl)	
Fay et al.	0.41 (0.19, 0.56)	0.61 (0.45, 0.74)	0.39 (-0.08, 0.69)	0.59 (0.25, 0.78)	
Smith & Eyre-Walker	0.12 (-0.22, 0.38)	0.48 (0.28, 0.66)	0.32 (-0.17, 0.63)	0.54 (0.20, 0.75)	
Bierne & Eyre-Walker	0.17 (-0.11, 0.36)	0.44 (0.19, 0.61)	0.41 (0.06, 0.61)	0.61 (0.28, 0.80)	

#### Table 3: Proportion of amino-acid substitutions driven by positive selection ( $\alpha$ )

Note  $-\alpha$  is calculated using either D. *pseudoobscura*, D. affinis or a reconstructed ancestral sequence as the outgroup.

 $\alpha$  using divergence to a more distantly related species. To this end, *D. affinis* was employed, a species which shows about 25% synonymous divergence to *D. miranda* at synonymous sites (see Table 1). Interestingly, using *D. affinis* as an outgroup species results in similar, although slightly lower, estimates of  $\alpha$  (i.e. 30%–40%, see Table 3). If  $\alpha$  is estimated along the *D. miranda* lineage, using a reconstructed *D. miranda* – *D. pseudoobscura* ancestral sequence, estimates of  $\alpha$  are increased (Table 3). Thus, while  $\alpha$  may be overestimated for short divergence times, *D. pseudoobscura* appears sufficiently diverged from *D. miranda* to result in little bias in estimating  $\alpha$  due to low levels of sequence divergence.

### Hitchhiking effects at fast evolving genes

Positively selected amino-acid mutations should leave characteristic signatures at surrounding genomic regions. One such signature is reduced neutral diversity surrounding sites that are targets of positive selection; i.e. selective sweeps [35-38]. Indeed, several recent studies have found reduced levels of synonymous diversity at genes with high rates of protein evolution in *D. melanogaster* [17,39] and *D. simulans* [15].

Levels of synonymous diversity ( $\pi_s$ ) are reduced in protein-coding genes with high rates of amino-acid evolution ( $K_a$ ) in *D. miranda* (R = -0.265, p < = 0.01, rank correlation test; Figure 1), as expected if fast evolving proteins undergo more frequent adaptive evolution. I find no correlation between rates of substitutions at synonymous sites ( $K_s$ ) and  $K_a$  (R = 0.0809, p < = 0.44, rank correlation test), suggesting little mutation rate variation among the regions studied.

The recurrent hitchhiking model predicts a stronger skew towards low-frequency variants at faster evolving genes [38,40]. In accordance with this expectation, I find a significant negative correlation between  $K_a$  and Tajima's D (R = -0.2077, p < = 0.05, rank correlation test, Figure 2A). Recurrent hitchhiking is also predicted to reduce the efficacy of natural selection against very weakly selected sites, such as synonymous sites experiencing codon bias selection [41,42]. As a measure for codon bias selection expe-

rienced by each gene, I calculate the frequency of optimal codons (*Fop*), as identified in *D. pseudoobscura* [30]. Figure 2B shows that *Fop* is negatively correlated with rates of protein evolution (R = -0.3523, p < = 0.0008, rank correlation test), i.e. genes undergoing more adaptive evolution generally show less biased codon usage. This is consistent with the notion that adaptive protein evolution interferes with selection for codon usage at linked sites (but see also [43-45]).

# Estimating the strength of selection (s) under a recurrent hitchhiking model

Reduced diversity at synonymous sites, a skew toward low-frequency variants, and reduced selection for codon usage bias in fast evolving proteins are all features expected under recurrent adaptive amino-acid evolution. I fit a recurrent hitchhiking model to the relationship between synonymous site diversity ( $\pi_s$ ) and amino acid divergence  $(K_{a})$ , to quantify selection parameters for beneficial mutations [13]. The diversity reduction under the hitchhiking model employed [13] depends on the rate at which beneficial mutations occur ( $\lambda$ ), and their average selection coefficients (s). Assuming adaptive protein evolution solely accounts for the observed diversity reduction at fast evolving genes, and no heterogeneity in  $\alpha$  among genes, as suggested in Drosophila [8,31],  $\lambda$  can be directly related to  $\alpha$ , the fraction of adaptive protein divergence ( $\lambda$ =  $\alpha K_a/2T$ , where T is the species divergence time, see Methods). In Figure 1, I show the least squares fit of the D. *miranda* polymorphism data to this recurrent hitchhiking model. For comparison, I performed the same fitting procedure using a data set of 137 X-linked protein-coding genes from a sample of 12 D. melanogaster alleles sampled from a Zimbabwe population, which also shows a correlation between  $K_a$  and  $\pi_s$  [17]. Table 4 gives an overview of relevant population summary statistics for D. miranda and D. melanogaster and estimated selection parameters for beneficial amino-acid mutations. Note that the positive selection parameters inferred for D. melanogaster in this study differ slightly from those presented in ref. [17], where the same data set using a simulation-based method was analyzed. However, while the exact absolute values of selection parameters depend on the methodology used, it



### Figure I

ā

**Neutral diversity is reduced in fast evolving protein-coding genes.** The level of synonymous diversity ( $\pi_s$ ) is plotted against the rate of amino-acid evolution ( $K_a$ ) at X-linked loci in *D. miranda*. The solid line represents the least squares fit to a recurrent hitchhiking model.

is the comparison between *D. miranda* and *D. melanogaster* that is the main focus of this paper. I estimate the neutral population mutation rate (i.e. in the absence of genetic hitchhiking effects) to be  $\theta = 0.99\%$  per site in *D. miranda* and  $\theta = 2.81\%$  in *D. melanogaster* (Table 4). The model also yields an estimate of the product  $\alpha s = 1.2 \times 10^{-3}$  in *D. miranda* and  $\alpha s = 1.2 \times 10^{-5}$  in *D. melanogaster*.

In the recurrent hitchhiking model used, *s* and  $\alpha$  (or  $\lambda$ ) are conflated parameters and only their product can be esti-

mated. However, I can infer *s* using an independent estimate of  $\alpha$ . I estimate  $\alpha = 44\%$  for *D. miranda* and  $\alpha = 51\%$  for *D. melanogaster*, using a maximum likelihood method [31]. This value of  $\alpha$  implies that  $s \sim 2.7 \times 10^{-3}$  for *D. miranda* and  $s \sim 2.3 \times 10^{-5}$  for *D. melanogaster*. Given estimates of  $\lambda$ ,  $N_e$  and *s*, we can also estimate the rate at which beneficial mutations arise per site and generation ( $u_{\text{ben}} = \lambda/(4N_e s)$ , see Methods). The beneficial mutation rate is  $u_{\text{ben}} \sim 6.5 \times 10^{-14}$  in *D. miranda* and  $u_{\text{ben}} \sim 4.7 \times 10^{-12}$  in *D. melanogaster*. Thus, while the inferred rate of adaptation



### Figure 2

An excess of rare polymorphisms and reduced codon bias in fast evolving protein-coding genes. A. Tajima's D, a measure of the frequency distributions of mutations, is plotted against the rate of amino-acid evolution ( $K_a$ ) at X-linked loci in D. miranda. B. The frequency of optimal codons (Fop) is plotted against the rate of amino-acid evolution ( $K_a$ ).

Table 4: Parameters inferred for positive amino-acid mutation	ns
in D. miranda and D. melanogaster	

	D. miranda	D. melanogaster
K <sub>a</sub> (%) <sup>a</sup>	0.57	2.90
K <sub>s</sub> (%) <sup>a</sup>	4.21	14.91
π <sub>s</sub> (%) <sup>a</sup>	0.62	2.48
$\rho$ /site/generation <sup>b</sup>	8.8E-08	3.3E-08
$\mu$ /site/generation <sup>c</sup>	5.8E-09	5.8E-09
$\alpha^{d}$	0.44	0.51
$T=(K_{s}\text{-}\pi_{s})/(2\mu)$	3,093,681	10,716,289
θ <sub>0</sub> (%) <sup>e</sup>	0.99	2.81
$2N_es^* \alpha^e$	1353.8	37.9
$N_e = \theta_0 / (3\mu)$	568,85 I	1,613,218
2N <sub>e</sub> s	3103	74
s	2.7E-03	2.3E-05
$\lambda = (\alpha * K_a)/(2T)$	4.0E-10	7.0E-10
2N <sub>e</sub> s* λ	1.2E-06	5.1E-08
$u_{ben} = \lambda/(4*N_es)$	6.5E-14	4.7E-12

<sup>a</sup> estimated from polymorphism data

<sup>b</sup> from True et al. (1996) and Oritz-Barrientos et al. (2006)

<sup>c</sup> from Haag-Liautard et al. (2007)

<sup>d</sup> estimated from polymorphism data using Bierne & Eyre-Walker (2004)

<sup>e</sup> estimated from polymorphism data using Wiehe & Stephan (1993) model

(i.e. the fixation rate of beneficial mutations) is similar between *D. miranda* and *D. melanogaster* ( $\lambda \sim 4.0 \times 10^{-10}$  in *D. miranda* and  $\lambda \sim 7.0 \times 10^{-10}$  in *D. melanogaster*, corresponding to  $\lambda 2N_{e}s \sim 1.2 \times 10^{-6}$  and  $\lambda 2N_{e}s \sim 5.1 \times 10^{-8}$ , Table 4), I estimate a lower beneficial mutation rate in *D. miranda* but larger average effects of beneficial amino-acid mutations.

### Discussion

### High rates of protein adaptation in D. miranda

If the rate of beneficial mutations and their selective effects are constant across species, larger populations are expected to show higher rates of adaptation, both because they generate more mutations and selection is effective on a greater proportion of mutations [18,46]. Kimura and Ohta [47] noticed that rates of protein evolution are rather similar across taxa with different population sizes, and argued against models of adaptive substitutions to explain protein evolution. Here, I compare rates of protein evolution in two Drosophila species that differ about 5-fold in their levels of neutral variability, but find little difference in rates of adaptive protein divergence between them.

Specifically, two independent types of evidence suggest that *D. melanogaster* and *D. miranda* both show high rates of adaptive protein evolution. First, application of the MK test suggest that a similar fraction of amino-acid muta-

tions is driven to fixation in both species groups, and my estimate of  $\lambda$ , the rate of selective sweeps, is very similar between the two species. Second, both species show a correlation between rates of protein evolution and synonymous site diversity, as expected under recurrent adaptive protein evolution [17,39]. Fitting a recurrent hitchhiking model to polymorphism data suggests a higher value of  $\alpha$ s in *D. miranda* than in *D. melanogaster*. Since  $\alpha$  is estimated to be very similar between species, *s* is inferred to be larger in *D. miranda*.

What would we expect  $\alpha$ , the rate of adaptive protein divergence, to be in D. miranda using selection parameters inferred from D. melanogaster but accounting for differences in their synonymous site diversity? The rate of adaptive divergence  $K_{\text{ben}}$  can be calculated as  $K_{\text{ben}} = 2N^* u_{\text{ben}}$ \*2s\*2T. Using estimates of  $u_{ben}$  and s from D. melanogaster (Table 4), we would expect the rate of adaptive aminoacid divergence in D. miranda to be 0.107% per site. This means that only 18% of total amino acid divergence was driven by positive selection, i.e.  $\alpha$  = 0.18. This value of  $\alpha$ lies below the confidence limits we estimate for  $\alpha$  in *D*. miranda, using MK approaches (Table 3). Thus, assuming that selection parameters are similar between the species, D. miranda displays higher rates of protein evolution than would be expected given its level of diversity. Below, I discuss several implications of this finding and possible explanations.

## Long-term vs. short-term differences in the effective population size

Levels of synonymous diversity are lower in D. miranda relative to D. melanogaster (see Table 4), suggesting a smaller effective population size in D. miranda. However, levels of diversity only contain information about the recent effective population size of a species, and it is possible that both species had similarly sized populations for much of their evolutionary history. Indeed, there is some evidence that D. miranda has experienced a reduction in its effective population size given reduced levels of diversity compared to its closest relatives, reduced selection to maintain codon bias, or mulitlocus patterns of diversity [22,23,30]. Thus, much of the adaptive evolution detected in D. miranda could reflect selection in a larger, ancestral population, or selection in D. pseudoobscura (which based on levels of synonymous polymorphism, is thought to have a larger population size [22]) since divergence also includes fixations along the D. pseudoobscura lineage. However, similar estimates of  $\alpha$  are inferred, regardless of whether D. pseudoobscura or D. affinis is used as the outgroup species, or whether the reconstructed ancestral sequence of D. miranda and D. pseudoobscura is used (Table 3). While estimates of  $\alpha$  might be biased upwards if divergence between species is low [8,31], a large fraction of amino-acid mutations along the D. miranda are clearly

driven by adaptive evolution. Furthermore, if *D. miranda* has experienced a recent reduction in its effective population size, the estimate of  $\alpha$  is likely to be biased downwards, due to segregating deleterious mutations (see below). Similar arguments of a reduced population size in *D. melanogaster* compared to its close relative to *D. simulans* have been invoked to account for lower levels of diversity at autosomal regions, decreased selection for codon bias and patterns of polymorphisms in *D. melanogaster* [48-50]. However, X-linked diversity appears similar between the two species [9,34], and estimates of adaptive protein evolution are comparable [8,9,31]. Thus, the exact dynamics of the long-term effective population size is unclear in both species, but both may have undergone a recent contraction in size.

While inferences of adaptive evolution based on the MK test are sensitive to assumptions about the long-term effective population size of a species, the correlation between synonymous diversity and rate of protein evolution provides an independent conformation of high rates of adaptive protein evolution in both species. This observation is less affected by fluctuations in the long-term effective population size, since reduced diversity in fast evolving proteins reflects the action of very recent selection (i.e. in the order of the population coalescence time). Interestingly, the rate of selective sweeps inferred from the observed correlation between  $\pi_s$  and  $K_a$  is very similar for the two species. Thus, despite uncertainties about the long-term effective population size in both D. melanogaster and D. miranda, several independent lines of evidence suggest similar and high rates of protein evolution in both species. It will be of great interest to study a diverse set of species that differ in their inferred effective population sizes, to better study the influence of population size on rates of adaptive evolution.

# Different distribution of fitness effects for beneficial mutations among species?

The expectation of less adaptation in smaller populations relies on the assumption that the mutation rate and the strength of selection for beneficial mutations are constant among species investigated. However, I infer that both the beneficial mutation rate and the strength of selection are different between *D. melanogaster* and *D. miranda*. But how plausible is such a scenario? In a species with a larger effective population size, a smaller fraction of mutations is effectively neutral, and one might expect such a species to be better adapted since more advantageous mutations will fix [18]. This could change the distribution of fitness effects because, as a species adapts, its fitness is expected to move closer to an optimum [51,52]. Thus, one could intuit that better adapted species have fitness distributions where beneficial mutations are weaker on average, but it

may be harder to explain why the rate of adaptive mutations should be higher in that case.

There is some experimental evidence that the distribution of fitness effects is different between species that have different effective population sizes. Silander et al. [53] performed a mutation-accumulation experiment where bacteriophage populations were passaged through different population sizes. As expected, the small population size lines had lower fitness because they had accumulated more deleterious mutations. Surprisingly, about 15% of the mutations in the small population size lines were adaptive, in contrast to almost none in the large population size lines. The mean effect of mutations, however, did not seem to differ between lines. In comparisons between D. miranda and D. melanogaster, however, I infer that mutation rates are actually lower in the species with the lower population size, while fitness effects for beneficial mutations appear much larger.

### Bias in the estimation procedure to infer $\alpha$ ?

It is also possible that the distribution of beneficial amino-acid mutations is conserved across species, but that biases in estimating  $\alpha$  result in a substantial underestimation of the rate of adaptive amino-acid divergence in D. melanogaster. A schematic model of this effect is shown in Figure 3. Assume the rate of mutation and the strength of selection for adaptive amino-acid changes are constant between species. Because of its larger population size, fewer advantageous mutations will be effectively neutral in D. melanogaster and many adaptive substitutions of weak effect can fix in this species. In contrast, many more mutations are effectively neutral in D. miranda, but the average effect of the mutations incorporated would be larger. This would cause us to infer a larger beneficial mutation rate, but smaller selection coefficients in D. melanogaster, as observed.

While this model could account for the observed differences in rates and effects of beneficial amino-acid mutations, it would also predict that D. melanogaster shows much higher rates of adaptive protein evolution than D. miranda. However, my estimate of  $\alpha$  is very similar between the two species. This discrepancy could potentially be explained by a bias in estimating  $\alpha$  from MK tables, which assumes that all amino-acid polymorphism segregating in the population are neutral [7]. However, if the fraction of beneficial amino-acid mutations is high and selection is weak, a substantial proportion of the amino-acid polymorphism segregating in the population might actually represent beneficial mutations. For example, Sawyer et al. [4] estimate that about half of all amino acids segregating in a population sample from D. simulans are beneficial. Including these mutations into MK tables will downward bias our estimate of  $\alpha$ . Thus, if only very



### Figure 3

The frequency of adaptive mutations (U) versus their strength, for large and small populations. Assuming a fixed distribution of selective effects of mutations (s), large populations will have fewer effectively neutral mutations  $u_n$  (light grey area) but more beneficial mutations  $u_{ben}$  (dark grey area), than smaller populations. The mean effect of a beneficial that can become fixed in the species will be larger in a smaller population.

few amino-acid mutations are neutral in *D. melanogaster* (i.e. the majority is either deleterious or slightly beneficial), then a large fraction of amino-acid mutations that segregate in the population will be beneficial (once removing the low-frequency class), resulting in an underestimate of  $\alpha$  using the MK framework employed here. In contrast, a larger fraction of amino-acid mutations will be effectively neutral in *D. miranda*, due to its smaller current population size, and thus a much smaller proportion of the observed amino acid polymorphisms are beneficial. This will cause the estimate of  $\alpha$  to be much closer to its true value in *D. miranda*, while  $\alpha$  might be substantially underestimated in *D. melanogaster*.

Consistent with a substantial fraction of amino-acid mutations segregating in D. melanogaster being beneficial, amino-acid polymorphism is less reduced relative to synonymous sites in D. melanogaster compared to D. miranda  $(\pi_a/\pi_s = 0.08$  in D. melanogaster vs.  $\pi_a/\pi_s = 0.07$  in D. miranda). Purifying selection against deleterious aminoacid mutations would be more effective in a larger species, predicting the opposite patterns, while the  $\pi_a/\pi_s$  ratio should be similar among species if amino-acid polymorphisms are neutral. In fact, if half the amino-acid polymorphisms are removed from D. melanogaster (i.e. they are assumed to be beneficial instead of neutral), the maximum likelihood estimate of  $\alpha$  becomes closer to 0.8 in that species. In this case, we would conclude that D. *miranda* shows reduced rates of adaptation, in accordance with expectations based on its smaller current effective population size. While this model could qualitatively account for the observed patterns with regards to population size and adaptive evolution, it remains to be seen whether it can also quantitatively do so.

### The influence of deleterious mutations

In the above considerations I assume that both the excess divergence at amino acid mutations relative to polymorphisms as well as the correlation between neutral diversity and protein evolution are entirely driven by beneficial mutations. However, for both interpretations, weakly deleterious mutation models pose a potential problem.

Slightly deleterious nonsynonymous mutations can yield biased estimates of  $\alpha$  using MK methods, and the direction of this bias depends on the demography of the population. As mentioned before, if the population size has been relatively stable, the estimate of  $\alpha$  is likely an underestimate, because slightly deleterious amino-acid mutations tend to contribute relatively more to polymorphism than they do to divergence when compared with neutral mutations. However, slightly deleterious mutations can lead to an overestimate of  $\alpha$  if population sizes have expanded, because mutations that might have been fixed in the past, when the population size was small, no longer segregate as polymorphisms. Even fairly modest increases in population size can create artifactual evidence of adaptive evolution [33]. Thus, it is possible that *D. miranda* has undergone a recent population size expansion (i.e. its current  $N_e$  is larger than the ancestral one) and that  $\alpha$  is therefore overestimated. However, as mentioned above, if anything *D. miranda* appears to have gone through a population size decrease based on several consistent patterns of polymorphisms and divergence [22,23,30]. This suggests that  $\alpha$  has not been overestimated in *D. miranda* because of a population size increase.

I invoke recurrent hitchhiking to explain the observed correlation between  $K_a$  and  $\pi_s$  in *D. miranda*; recurrent beneficial amino acid mutations reduce variation more frequently at faster evolving genes, causing a reduction in codon bias and an excess of low frequency variants. It is, however, formally also possible to explain the observed correlation between  $K_a$  and  $\pi_s$  solely by deleterious mutations models. The removal of recurrent deleterious mutations from the population reduces the local effective population size, causing regions with higher deleterious mutation rates (or lower recombination rates) to harbour reduced levels of neutral diversity; i.e. background selection [54,55]. A reduction in  $N_{e'}$  in turn, predicts an acceleration in the rate of accumulation of very weakly deleterious mutations [32,56], including possible unpreferred codons or slightly deleterious amino acid mutations. Weak background selection can also distort the allele-frequency spectrum of neutral mutations towards rare variants [56,57]. Thus, selection against weakly deleterious mutations can by itself account for reduced levels of neutral diversity associated with increased rates of accumulation of slightly deleterious amino-acid mutations [32,56], without invoking any beneficial mutations.

In *D. miranda*, the correlation between  $K_a$  and  $\pi_s$  is stronger than in D. melanogaster. This would suggest a larger fraction of slightly deleterious amino-acid mutations in the roam of weak background selection at some genes in D. miranda, causing a stronger reduction in  $N_e$ and  $\pi_s$  and higher rates of accumulation of deleterious amino-acid mutations. Again, a distribution of fitness effects against deleterious amino-acid mutations may in principle explain the pattern, if a larger fraction of deleterious amino-acid mutations in D. melanogaster is selected against efficiently. That is, only few amino-acid mutations with a relatively small range of negative selection coefficients cause weak background selection in D. melanogaster, while the majority of deleterious amino-acid mutations are selected against effectively. In contrast, more slightly deleterious amino-acid mutations segregate in D. miranda, resulting in a larger variance in the amount of weak background selection among genes. It is also possible that there is more heterogeneity in rates of recombination among the loci sampled in D. miranda, since physical and genetic map positions are not known for the loci investigated. Recombination rate variation may result in heterogeneous levels of background selection along a chromosome, and thus cause the local  $N_e$  (and the efficacy of selection) to vary among regions. Indeed, there is evidence for recombination rate heterogeneity in D. pseudoobscura, where mild "recombination hotspots" were discovered [58]. Unfortunately, no genetic map exists in D. miranda, preventing us from directly investigating the effect of recombination rate heterogeneity on levels of polymorphisms in this species. However, as Andolfatto [17] points out, there are several empirical arguments against weak background selection causing the observed correlation between  $K_a$  and  $\pi_{s'}$  such as no general elevation of  $K_a$  in regions of the Drosophila genome with reduced recombination rates [42,59], and no effect of gene density on rates of protein evolution [17].

### More complicated models of selection

In a series of papers, Gillespie examines the role of population size in population genetical models of molecular evolution, using extensive computer simulations [60,61]. Gillespie has defined three domains based on their rates of substitutions, which he terms the Ohta domain (the rate of substitution decreases with increasing population size), the Kimura domain (the rate of substitution remains close to the mutation rate) and the Darwin domain (the rate of substitution increases with increasing population size). Not surprisingly, he finds that nearly neutral deleterious mutation models all fall within the Ohta domain where the rate of evolution is inversely proportional to population size. He also finds that the normal-shift model (a model of positive selection) appropriately falls within the Darwin domain, but that the rate of substitution does not linearly increase with populations size and is substantially reduced relative to the expectation under the independence among sites model. Surprisingly, Gillespie also finds that the fluctuating selection, neutral, and overdominance model all lead to the Kimura domain, where the rate of molecular evolution is independent of the population size. In addition, adaptive evolution can actually cause the rate of substitution of deleterious alleles at a linked locus to increase with increasing population size [60,62]. Thus, the associations between  $N_e$  and rates of evolution might be complex, and intuitions drawn from very simple models of positive and negative selection might not apply to natural populations. Future work will be needed to assess how more complicated selection models, including selection from standing variation or mutation selection balance [63,64], and interactions between beneficial and deleterious mutations will influence rates of molecular evolution and variation.

### Conclusion

Adaptive protein evolution is common in several Drosophila species investigated, but little is known about underlying selection coefficients of beneficial amino acid mutations. If average selection intensities are very weak, as suggested by some studies, even modest changes in the effective population size between species may have drastic impacts on rates of adaptation between lineages. Here, I estimate that a similar fraction (~50%) of amino-acid mutations is being driven to fixation by positive selection in two species of *Drosophila* that differ roughly 5-fold in their effective population sizes. Genes with higher rates of amino-acid evolution show lower levels of neutral diversity in both species, a pattern predicted by recurrent adaptive protein evolution. Thus, while adaptive amino-acid evolution is common in the genus *Drosophila*, modest changes in population size appear to have little influence on protein adaptation.

### Methods

### Survey of coding regions

A total of 91 X-linked coding regions were surveyed in this study with a sample size of 14 *D. miranda* alleles. The following strains of *D. miranda* were used in the analysis, with their population origin given in parenthesis: 0101.3, 0101.4, 0101.5, 0101.7 (Port Coquitlam, BC, Canada); 0101.9, MA28, MA32, MA03.1, MA03.2, MA03.3, MA03.4, MA03.5, MA03.6 (Mather, CA, USA); SP138, SP235, SP295 (Spray, OR, USA); MSH22, MSH38 (Mt. St. Helena, CA, USA).

The *D. pseudoobscura* genome sequence was used to provide estimates of divergence [65]. For a subset of 51 loci, the orthologous *D. affinis* allele was surveyed (strain 14012-0141.01 or 14012-0141.02). All genes were selected randomly with respect to gene function. Information about the specific loci surveyed and primers used can be found in Additional File 1.

Each ~1200 base pair region was PCR-amplified from genomic DNA extracted from single male flies, and primers and nucleotides were removed using Exonuclease I and Shrimp Alkaline Phosphatase. Cleaned products were sequenced on both strands with the original PCR primers and internal sequencing primers, using Big-Dye (Version 3, Applied Biosystems) and run on an ABI 3730 capillary sequencer. Sequence traces were edited using Sequencher (Gene Codes) software and multiple sequence alignments were generated using MUSCLE <u>http://www.drive5.com/muscle/</u> with protein-alignment-assisted adjustments to preserve reading frames. Sequences have been deposited in Genbank under accession numbers (XXXX-XXXX).

For comparison with *D. melanogaster*, I used a published dataset of 12 individuals sequenced from a Zimbabwe, Africa population and their divergence to *D. simulans* [17].

### Polymorphism and divergence analysis

The estimated number of synonymous sites, nonsynonymous sites, average pairwise diversity ( $\pi$ ), average pairwise divergence to *D. pseudoobscura*  $(D_{xy})$ , as well as counts of the number of polymorphisms (S) and the summary of the frequency distribution of polymorphism frequencies, Tajima's D (Tajima 1989), were calculated using a library of Perl scripts ("Polymorphorama") written by the author and P. Andolfatto. The number of nonsynonymous and synonymous sites were estimated using the method of [66]. Average pairwise diversity ( $\pi$ ) and divergence ( $D_{xy}$ ) estimates were corrected for multiple hits using a Jukes-Cantor correction [67]. Multiply hit sites were included in all analyses but insertion-deletion polymorphisms and polymorphic sites overlapping alignment gaps were excluded. For lineage-specific estimates of divergence, I reconstructed a D. miranda - D. pseudoobscura ancestor sequence (ANC) by maximum likelihood, using D. affinis as an outgroup, as implemented in the codeml program of PAML. Locus-specific estimates of levels of diversity and divergence can be found in Additional File 1. To estimate codon bias selection at each gene, the frequency of optimal codons (as inferred from *D. pseudoobscura*, see [30]) is used.

The fraction of amino acid mutations driven by positive selection,  $\alpha$ , is estimated using three slightly different approaches based on the MK test [7], as implemented in the DoFEv2 software package (kindly provided by A. Eyre-Walker). The number of divergent sites were corrected for multiple hits using a Jukes-Cantor correction. I also exclude singleton mutations, to minimize the downward bias in inferring  $\alpha$  due to segregating deleterious amino acid mutations.

### Estimating recurrent hitchhiking parameters

Following [17], I use the relationship between synonymous site diversity ( $\pi_s$ ) and amino acid divergence ( $K_a$ ) to quantify recurrent selection parameters. I use the analytical approximation of [13], to jointly estimate the strength of selection (s) and the rate of adaptive substitution per site per generation ( $\lambda$ ). The expected nucleotide diversity at neutral sites is

$$E(\pi) = \frac{\theta \rho}{\rho + k\gamma \lambda}, \qquad (1)$$

where  $\theta$  is the population mutation rate,  $\rho$  is the recombination rate per site per generation, k is a constant  $\cong 0.075$ , and  $\gamma$  (=  $2N_e s$ ) is the intensity of positive selection (where  $N_e$  is the effective population size of the species and s is the strength of selection). Like [17], I assume that the rate of selective sweeps in the neighborhood of a focal neutral site is determined by the local rate of amino acid substitution at a gene  $K_{a'}$  and that some constant fraction of amino acid divergence at each locus,  $\alpha$ , was driven to fixation by positive selection. Therefore, the rate of selective sweeps due to recurrent adaptive amino acid substitutions at a locus is  $\lambda = \alpha K_a/2T$ , where *T* is the divergence time in generations between *D. miranda* and *D. pseudoobscura*. Equation (1) can be re-written as

$$E(\pi) = \frac{\theta \rho}{\rho + k2N_e s(\alpha K_a/T)},$$
(2)

and equation 2 allows levels of neutral diversity to be directly related to the extent of adaptive amino acid divergence at each locus (i.e.  $\alpha K_a$ ).

Average recombination rates in D. pseudoobscura are higher than those observed in D. melanogaster; average recombination rates across the X chromosome in D. melanogaster equal 3.3 cM/Mb [68], while the average recombination rate across the X chromosome in D. pseudoobscura is 8.3 cM/Mb [69]. Estimating  $T = (\overline{K}_s - q)/2m$  and  $N_e = \theta/3\mu$  require an estimate of the neutral mutation rate,  $\mu$ . I assume that  $\hat{m} = 5.8 \times 10^{-9}$  per generation, the estimated average rate for single nucleotide mutations from D. melanogaster mutation-accumulation lines [70]. With these parameter estimated and  $\pi_s$ and  $K_{a}$  for 92 loci, a least-squares method is used to find the values of  $\theta$  and  $\alpha$ s that minimize the sum of the squared deviations between observed  $\pi_s$  and  $E(\pi)$  predicted by the model, using the R statistical package.

### **Authors' contributions**

DB designed the study, analysed the data, and wrote the manuscript.

### **Additional material**

#### Additional file 1

Supplementary Materials. This document contains tables with sequences of PCR primers and internal sequencing primers used in this study and additional results referenced in the main text. Click here for file [http://www.biomedcentral.com/content/supplementary/1471-2148-8-334-S1.doc]

### Acknowledgements

I am grateful to Kevin Thornton and Peter Andolfatto for valuable discussions, and to Kevin Thornton and Stephen Wright for comments on the manuscript. I thank Emily Hom for technical assistance. This research is funded by NIH Grant GM076007 to D.B.

#### References

- 1. Smith NG, Eyre-Walker A: Adaptive protein evolution in Drosophila. *Nature* 2002, 415(6875):1022-1024.
- 2. Fay JC, Wyckoff GJ, Wu CI: Testing the neutral theory of molecular evolution with genomic data from Drosophila. *Nature* 2002, **415(6875):**1024-1026.
- 3. Andolfatto P: Adaptive evolution of non-coding DNA in Drosophila. *Nature* 2005.
- Sawyer S, Kulathinal R, Bustamante C, Hartl D: Bayesian analysis suggests that most amino acid replacements in Drosophila are driven by positive selection. J Mol Evol 2003, 57(Suppl 1):S154-164.
- Bustamante C, Fledel-Alon A, Williamson S, Nielsen R, Hubisz M, Glanowski S, Tanenbaum D, White T, Sninsky J, Hernandez R, et al.: Natural selection on protein-coding genes in the human genome. Nature 2005, 437(7062):1153-1157.
- Bustamante C, Nielsen R, Sawyer S, Olsen K, Purugganan M, Hartl D: The cost of inbreeding in Arabidopsis. Nature 2002, 416(6880):531-534.
- McDonald JH, Kreitman M: Adaptive protein evolution at the Adh locus in Drosophila. Nature 1991, 351(6328):652-654.
- 8. Welch J: Estimating the genomewide rate of adaptive protein evolution in Drosophila. *Genetics* 2006, **173(2):8**21-837.
- Haddrill P, Bachtrog D, Andolfatto P: Positive and negative selection on noncoding DNA in Drosophila simulans. Mol Biol Evol 2008 in press.
- Maside X, Charlesworth B: Patterns of molecular variation and evolution in Drosophila americana and its relatives. *Genetics* 2007, 176(4):2293-2305.
- Begun DJ, Aquadro CF: Levels of naturally occurring DNA polymorphism correlate with recombination rates in Drosophila melanogaster. Nature 1992, 356(6369):519-520.
- 12. Charlesworth B Background selection and patterns of genetic diversity in Drosophila melanogaster. Genet Res 1996, 68(2):131-149.
- Wiehe TH, Stephan W: Analysis of a genetic hitchhiking model, and its application to DNA polymorphism data from Drosophila melanogaster. Mol Biol Evol 1993, 10(4):842-854.
- 14. Eyre-Walker A: **The genomic rate of adaptive evolution.** *Trends Ecol Evol* 2006.
- 15. Macpherson J, Sella G, Davis J, Petrov D: On the genomewide spatial correspondence between adaptation and neutral diversity in Drosophila. *Genetics* 2007 in press.
- Li H, Stephan W: Inferring the demographic history and rate of adaptive substitution in Drosophila. PLoS Genet 2006, 2(10):e166.
- Andolfatto P: Hitchhiking effects of recurrent beneficial amino acid substitutions in the Drosophila melangoaster genome. *Genome Res* 2007 in press.
- Kimura M: The Neutral Theory of Molecular Evolution. Cambridge: Cambridge University Press; 1983.
- Nielsen R, Bustamante C, Clark A, Glanowski S, Sackton T, Hubisz M, Fledel-Alon A, Tanenbaum D, Civello D, White T, et al.: A scan for positively selected genes in the genomes of humans and chimpanzees. PLoS Biol 2005, 3(6):e170.
- 20. Charlesworth J, Eyre-Walker A: The rate of adaptive evolution in enteric bacteria. *Mol Biol Evol* 2006, **23(7):**1348-1356.
- Nielsen R, Yang Z: Estimating the distribution of selection coefficients from phylogenetic data with applications to mitochondrial and viral DNA. Mol Biol Evol 2003, 20(8):1231-1239.
- 22. Yi S, Bachtrog D, Charlesworth B: A survey of chromosomal and nucleotide sequence variation in Drosophila miranda. *Genetics* 2003, **164(4):**1369-1381.
- Bachtrog D, Andolfatto P: Selection, recombination and demographic history in Drosophila miranda. Genetics 2006, 174(4):2045-2059.
- Bartolome C, Maside X, Yi S, Grant A, Charlesworth B: Patterns of Selection on Synonymous and Nonsynonymous Variants in Drosophila miranda. *Genetics* 2005, 169(3):1495-1507.
- 25. Bartolomé C, Charlesworth B: Evolution of amino-acid sequences and codon usage on the Drosophila miranda neosex chromosomes. *Genetics* 2006, **174(4):**2033-2044.
- 26. Tajima F: Statistical method for testing the neutral mutation hypothesis by DNA polymorphism. Genetics 1989, 123(3):585-595.

- Li W: Molecular evolution. Sunderland Massachusetts: Sinauer Associates, Inc., Publishers; 1997.
- Akashi H, Schaeffer SW: Natural selection and the frequency distributions of "silent" DNA polymorphism in Drosophila. *Genetics* 1997, 146(1):295-307.
- Bulmer M: The selection-mutation-drift theory of synonymous codon usage. Genetics 1991, 129(3):897-907.
- Bachtrog D: Reduced selection for codon usage bias in Drosophila miranda. J Mol Evol 2007, 64(5):586-590.
- Bierne N, Eyre-Walker A: The genomic rate of adaptive amino acid substitution in Drosophila. Mol Biol Evol 2004, 21(7):1350-1360.
- 32. Charlesworth B: The effect of background selection against deleterious mutations on weakly selected, linked variants. Genet Res 1994, 63(3):213-227.
- 33. Eyre-Walker A: Changing Effective Population Size and the McDonald-Kreitman Test. Genetics 2002, 162(4):2017-2024.
- Begun D, Holloway A, Stevens K, Hillier L, Poh Y, Hahn M, Nista P, Jones C, Kern A, Dewey C, et al.: Population genomics: wholegenome analysis of polymorphism and divergence in Drosophila simulans. PLoS Biol 2007, 5(11):e310.
- 35. Maynard Smith J, Haigh J: The hitch-hiking effect of a favourable gene. Genet Res 1974, 23:23-35.
- Kaplan N, Hudson R, Langley C: The "hitchhiking effect" revisited. Genetics 1989, 123(4):887-899.
- Kim Y, Stephan W: Detecting a local signature of genetic hitchhiking along a recombining chromosome. Genetics 2002, 160(2):765-777.
- 38. Przeworski M: The signature of positive selection at randomly chosen loci. Genetics 2002, 160(3):1179-1189.
- Shapiro J, Huang W, Zhang C, Hubisz M, Lu J, Turissini D, Fang S, Wang H, Hudson R, Nielsen R, et al.: Adaptive genic evolution in the Drosophila genomes. Proc Natl Acad Sci USA 2007, 104(7):2271-2276.
- Braverman J, Hudson R, Kaplan N, Langley C, Stephan W: The hitchhiking effect on the site frequency spectrum of DNA polymorphisms. Genetics 1995, 140(2):783-796.
- Kim Y: Effect of strong directional selection on weakly selected mutations at linked sites: implication for synonymous codon usage. Mol Biol Evol 2004, 21 (2):286-294.
- Betancourt AJ, Presgraves DC: Linkage limits the power of natural selection in Drosophila. Proc Natl Acad Sci USA 2002, 99(21):13616-13620.
- Bierne N, Eyre-Walker A: Variation in synonymous codon use and DNA polymorphism within the Drosophila genome. J Evol Biol 2006, 19(1):1-11.
- Marais G, Domazet-Loso T, Tautz D, Charlesworth B: Correlated evolution of synonymous and nonsynonymous sites in Drosophila. J Mol Evol 2004, 59(6):771-779.
- Stoletzki N, Eyre-Walker A: Synonymous codon usage in Escherichia coli: selection for translational accuracy. Mol Biol Evol 2007, 24(2):374-381.
- 46. Fisher RA: The Genetical Theory of Natural Selection. Oxford: Oxford University Press; 1930.
- 47. Kimura M, Ota T: Protein polymorphism as a phase of molecular evolution. *Nature* 1971, 229(5285):467-469.
- Andolfatto P: Contrasting patterns of X-linked and autosomal nucleotide variation in Drosophila melanogaster and Drosophila simulans. Mol Biol Evol 2001, 18(3):279-290.
- Akashi H: Molecular evolution between Drosophila melanogaster and D. simulans: reduced codon bias, faster rates of amino acid substitution, and larger proteins in D. melanogaster. Genetics 1996, 144(3):1297-1307.
- Akashi H: Inferring weak selection from patterns of polymorphism and divergence at "silent" sites in Drosophila DNA. *Genetics* 1995, 139(2):1067-1076.
- 51. Orr HA: Adaptation and the cost of complexity. Evolution 2000, 54(1):13-20.
- 52. Orr H: The genetic theory of adaptation: a brief history. Nat Rev Genet 2005, 6(2):119-127.
- 53. Silander O, Tenaillon O, Chao L: Understanding the evolutionary fate of finite populations: the dynamics of mutational effects. *PLoS Biol* 2007, 5(4):e94.
- Charlesworth B, Morgan MT, Charlesworth D: The effect of deleterious mutations on neutral molecular variation. *Genetics* 1993, 134(4):1289-1303.

- 55. Hudson RR, Kaplan NL: Deleterious background selection with recombination. *Genetics* 1995, 141(4):1605-1617.
- Gordo I, Navarro A, Charlesworth B: Muller's Ratchet and the Pattern of Variation at a Neutral Locus. Genetics 2002, 161(2):835-848.
- 57. Charlesworth D, Charlesworth B, Morgan MT: The pattern of neutral molecular variation under the background selection model. Genetics 1995, 141(4):1619-1632.
- Cirulli ET, Kliman RM, Noor MA: Fine-scale crossover rate heterogeneity in Drosophila pseudoobscura. J Mol Evol 2007, 64(1):129-135.
- Haddrill P, Halligan D, Tomaras D, Charlesworth B: Reduced efficacy of selection in regions of the Drosophila genome that lack crossing over. Genome Biol 2007, 8(2):R18.
- Gillespie JH: The role of population size in molecular evolution. Theor Popul Biol 1999, 55(2):145-156.
- 61. Gillespie JH: Is the population size of a species relevant to its evolution? Evolution 2001, 55(11):2161-2169.
- 62. Bachtrog D, Gordo I: Adaptive evolution of asexual populations under Muller's ratchet. Evolution 2004, 58(7):1403-1413.
- Przeworski M, Coop G, Wall J: The signature of positive selection on standing genetic variation. Evolution 2005, 59(11):2312-2323.
- Orr HA, Betancourt AJ: Haldane's sieve and adaptation from the standing genetic variation. Genetics 2001, 157(2):875-884.
- Richards S, Liu Y, Bettencourt B, Hradecky P, Letovsky S, Nielsen R, Thornton K, Hubisz M, Chen R, Meisel R, et al.: Comparative genome sequencing of Drosophila pseudoobscura: chromosomal, gene, and cis-element evolution. Genome Res 2005, 15(1):1-18.
- Nei M, Gojobori T: Simple methods for estimating the numbers of synonymous and nonsynonymous nucleotide substitutions. *Mol Biol Evol* 1986, 3(5):418-426.
- Jukes TH, Cantor CR: Evolution of protein molecules. In Mammalian Protein Metabolism Edited by: Munro HN. New York: Academic Press; 1969:21-123.
- True J, Mercer J, Laurie C: Differences in crossover frequency and distribution among three sibling species of Drosophila. *Genetics* 1996, 142(2):507-523.
- Ortiz-Barrientos D, Chang A, Noor M: A recombinational portrait of the Drosophila pseudoobscura genome. Genet Res 2006, 87(1):23-31.
- Haag-Liautard C, Dorris M, Maside X, Macaskill S, Halligan D, Charlesworth B, Keightley P: Direct estimation of per nucleotide and genomic deleterious mutation rates in Drosophila. Nature 2007, 445(7123):82-85.

