

# Evidence for widespread adaptive evolution of gene expression in budding yeast

Hunter B. Fraser<sup>a,1</sup>, Alan M. Moses<sup>b</sup>, and Eric E. Schadt<sup>c</sup>

<sup>a</sup>Department of Biology, Stanford University, Stanford, CA 94305; <sup>b</sup>Department of Cell and Systems Biology, University of Toronto, Toronto, ON M5S 3B2, Canada; and <sup>c</sup>Pacific Biosciences, Menlo Park, CA 94025

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Changes in gene expression have been proposed to underlie many, or even most, adaptive differences between species. Despite the increasing acceptance of this view, only a handful of cases of adaptive gene expression evolution have been demonstrated. To address this discrepancy, we introduce a simple test for lineage-specific selection on gene expression. Applying the test to genome-wide gene expression data from the budding yeast *Saccharomyces cerevisiae*, we find that hundreds of gene expression levels have been subject to lineage-specific selection. Comparing these findings with independent population genetic evidence of selective sweeps suggests that this lineage-specific selection has resulted in recent sweeps at over a hundred genes, most of which led to increased transcript levels. Examination of the implicated genes revealed a specific biochemical pathway—ergosterol biosynthesis—where the expression of multiple genes has been subject to selection for reduced levels. In sum, these results suggest that adaptive evolution of gene expression is common in yeast, that regulatory adaptation can occur at the level of entire pathways, and that similar genome-wide scans may be possible in other species, including humans.

Changes in gene expression have long been theorized to play a major role in evolution (1, 2) and, more recently, have become a major focus of many studies on the evolution of development (3–8). In fact, it has recently been proposed that regulatory evolution “is pervasive and constitutes the primary fuel of the continuous morphological diversification of lineages and traits (3).” However, the strength of evidence supporting this view has been questioned (9) on the grounds that only a few unambiguous cases of regulatory adaptation have been demonstrated and that this small number has mostly been limited to just two model organisms, *Drosophila* fruit flies (4–6) and stickleback fish (7, 8) (we note that although many gene regulatory changes have been shown to affect phenotypes, very few of these have been shown to be adaptive). It is clear that what is needed to resolve this issue is a systematic, genome-scale approach to inferring regulatory adaptations, because only then can the question of their pervasiveness be rigorously addressed.

Although numerous studies of selection pressures acting on genome-wide gene expression levels have been reported (10), nearly all have found only negative selection and/or neutrality, consistent with the intuition that random changes to any functional system (including gene expression) will tend to be deleterious, and thus selected against. This is most likely because these studies were designed to detect the “average” mode of selection acting on new mutations that affect gene expression (*SI Text*). If adaptive mutations are rare, and usually occur in genes where most regulatory mutations are deleterious (and thus subject to negative selection)—as seems likely to be the case—then the average selection pressure on regulatory mutations will be dominated by negative selection, so methods measuring this average will have little power to reveal the occasional instances of positive selection.

An alternative is to specifically focus on what selective pressures have acted on differences that have accumulated between lineages or species. This approach was taken by Orr (11) in an elegant test of selection on quantitative traits: if alleles increas-

ing the value of a trait are preferentially found in one lineage as compared to another, then neutrality can be rejected in favor of positive selection. Gene expression levels can be treated as quantitative traits (12), but, unfortunately, too few gene expression quantitative trait loci (eQTL) are known for any single gene to have any power to reject neutrality in Orr’s test. However, the sheer number of gene expression traits that can be measured provides a solution: by analyzing the directionality of hundreds or thousands of eQTL simultaneously, one can estimate a lower bound on the fraction that has been subject to lineage-specific selection.

## Results and Discussion

### A Systematic Test for Lineage-Specific Selection on Gene Expression.

For a gene whose expression is controlled by two independent eQTL (caused by distinct polymorphisms), under neutrality their directions of effect should be independent (11). In other words, in a genetic cross between parents A and B, knowledge that the allele from parent A at one of the gene’s eQTL leads to higher expression of the target gene does not provide any information about the effect of parent A’s allele at the second eQTL. In contrast, if the target gene has been selected for altered expression in the two lineages leading to A and B, then it is likely that A alleles at both eQTL will act in the same direction; thus, knowing that allele A at one eQTL increases expression indicates that the same is likely true at the other eQTL. A test of independence between pairs of eQTL controlling the same genes can therefore reveal if neutrality can be rejected en masse, and if so, approximately what fraction of genes show the effects of lineage-specific selection.

The vast majority of genes affected by multiple eQTL have at least one *trans*-acting, and one (presumably) *cis*-acting eQTL (although we refer to these as *cis*-acting, the assumption of a *cis*-mechanism is not necessary for our test; *SI Text*). There are two possible categories—allele A leads to higher or lower expression than allele B—for both *cis* and *trans* eQTL, leading to four classes in a  $2 \times 2$  contingency table (Fig. 1). When A alleles have the same direction of effect on a gene in both *cis* and *trans* (and thus B alleles do as well), this is termed “reinforcing”; when the two A alleles have opposite effects, they are “opposing”. Directional selection in either lineage will tend to result in *cis/trans* changes in the same direction in the same lineage (Fig. S1) and an excess of reinforcing cases. The number of genes affected by two eQTL arising in two different lineages—which can give rise to either reinforcing or opposing *cis/trans* pairs, depending

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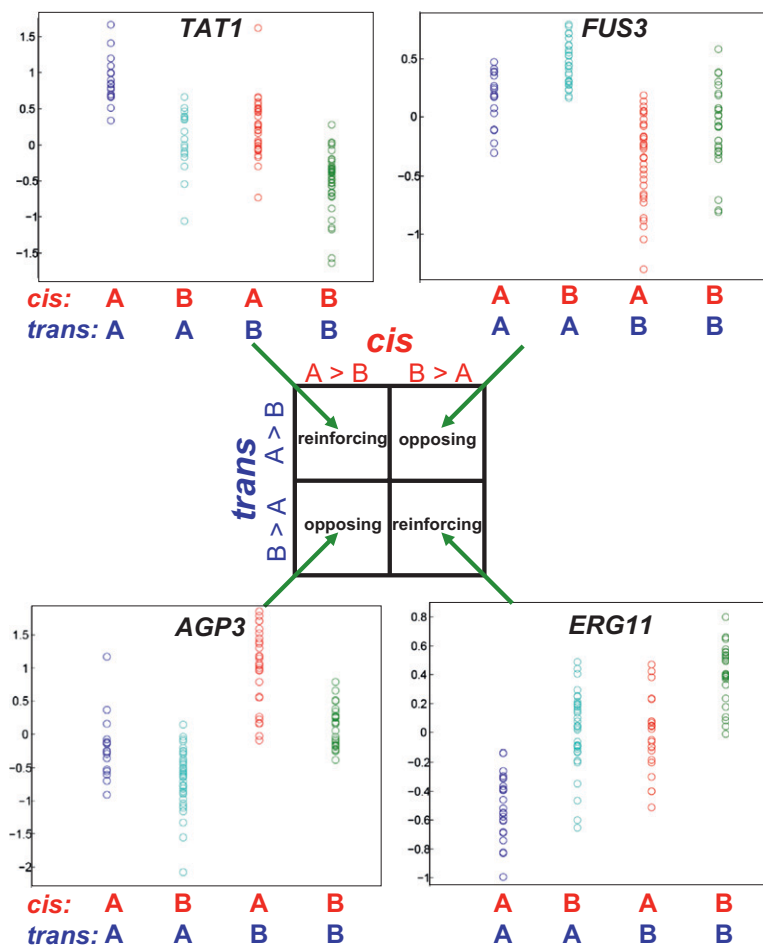
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<sup>1</sup>To whom correspondence should be addressed: hbfraser@stanford.edu.

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**Fig. 1.** A test of lineage-specific selection. For genes whose expression is affected by both *cis* and *trans* eQTL, there exist four classes of *cis/trans* effect directions and two general categories: reinforcing (where parent A's alleles at *cis* and *trans* eQTL have the same direction of effect on the target gene) and opposing (where A alleles at *cis* and *trans* eQTL have opposite directions of effect on the target gene). An excess of the former implies lineage-specific selection—either positive or relaxed negative selection—whereas an excess of the latter implies stabilizing selection. An example of a gene belonging to each class is shown, using gene expression data from *S. cerevisiae* (14) analyzed in detail below; for each gene, four possible combinations of *cis/trans* genotypes exist, and the expression levels of individuals with each combination are shown (A alleles are from BY, B alleles are from RM; “A > B” indicates the A allele leads to higher expression). See also Fig. S1 for the possible evolutionary scenarios leading to each class of the 2 × 2 table.

on the eQTL directionality (Fig. S1)—is expected to be approximately equal in all four classes (assuming the absence of massive convergent evolution) (SI Text), and thus will not affect the outcome of the test. Even though a single reinforcing case is not at all inconsistent with neutrality, a systematic excess of reinforcing cases can forcefully reject this null hypothesis. A standard  $\chi^2$  test of independence on the 2 × 2 table constitutes the test.

Perhaps the most attractive aspect of the test is its lack of any assumptions about population demography or a subset of neutral sites. Nearly all previous tests of selection (on both gene expression and protein coding regions) (SI Text) require information from neutral sites to assess when neutrality can be rejected, which can lead to incorrect inferences (e.g., interpreting  $dN/dS > 1$  as positive selection when synonymous sites are negatively selected) (13). Many tests also are sensitive to population bottlenecks or assumptions about effective population sizes, mutation rates, etc. Because the present test (like Orr's; ref. 11) focuses only on the directionality of differences between lineages, it requires no such assumptions. In addition, it is insensitive to biases in the directionality (i.e., up- vs. down-regulation) of both new mutations and the subset of these that become fixed; biases in the directionality of parental alleles (e.g., if A alleles are more often up-regulate

genes); and technical biases in the experiment, such as false *cis* eQTL due to microarray hybridization differences between alleles (SI Text).

Despite its robustness, care must be taken in applying the test and interpreting the results. In addition to independence of the *cis* and *trans* eQTL for each gene, no two genes being tested can have their *cis* and *trans* eQTL caused by the same polymorphisms (although genes may share one eQTL polymorphism) (SI Text). Trait ascertainment bias is an issue addressed by Orr (11), but not usually applicable to gene expression traits (SI Text). Epistasis between eQTL could pose a problem for our method if extremely strong and widespread, but no epistatic interactions were extreme enough to affect our results for even a single gene (SI Text). Furthermore, although an excess of reinforcing cases does indicate lineage-specific selection, it cannot distinguish whether that lineage-specificity is due to positive selection or relaxed negative selection; to demonstrate adaptive evolution, independent evidence is needed (SI Text). Finally, the test can only detect an enrichment of either reinforcing or opposing cases over the other (e.g., if 20% of genes are subject to positive selection and 15% to stabilizing, the test will only detect the 5% excess of reinforcing cases caused by positive selection). There-

fore, it can only provide a conservative lower bound for estimates of genome-wide selection pressures on gene expression.

**Applying the Selection Test to Yeast.** We applied the test to gene expression data (14) from 112 haploid segregants of a genetic cross between two strains of the budding yeast *Saccharomyces cerevisiae*. Sequence divergence suggests the strains (named RM, a wine strain, and BY, a laboratory strain nearly identical to S288C) diverged approximately  $10^7$  generations ago, and although they are fully capable of mating with other lineages of *S. cerevisiae*, they have done so only several hundred times since their divergence (15). Because these therefore represent largely distinct lineages, adaptive differences may have accumulated in each. Previous studies have used these expression data to map thousands of eQTL (14) and also to show that negative selection acts on many *cis* eQTL (16).

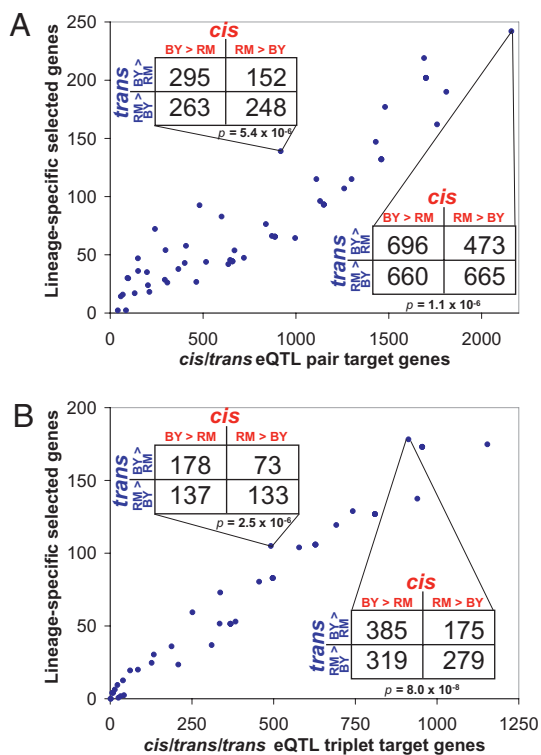
To map eQTL, we computed Pearson correlation coefficients (equivalent to two-sample *t* tests) between a set of 1,226 non-redundant genetic markers and expression levels of 6,215 genes. We tested a range of correlation cutoffs for the minimum strength of putative *cis* (defined as being within 50 kb of the gene itself) and *trans* (defined as being on a separate chromosome from the gene) eQTL. At each cutoff, we calculated the false discovery rate (FDR) by randomizing the genotypes 1,000 times and estimating the number of *cis/trans* eQTL pairs expected by chance. For each cutoff, a  $2 \times 2$  contingency table was also constructed, as described above. For example, at *cis*  $|r| > 0.2$  and

*trans*  $|r| > 0.35$  (Fig. 2A, Upper Left Inset), 958 genes were detected at an FDR = 4.1%, and the  $\chi^2$  test  $P = 5.4 \times 10^{-6}$ . This significant *P* value indicates that the null hypothesis of neutrality is rejected for these gene expression levels. To ascertain the validity of this *P* value, we performed three controls: two different randomization-based tests, in which data were permuted either before or after the eQTL mapping step, and also a negative control of *cis/trans* eQTL pairs that cannot have been due to selection because the *trans* eQTL resulted from mutations engineered by experimenters. Our observed excess of reinforcing eQTL pairs fell well outside both randomized distributions, whereas the negative control set did not, demonstrating the absence of unexpected biases in the data (and although it may appear that the deficit of cases is specific to the upper right quadrant, this is not actually the case) (SI Text).

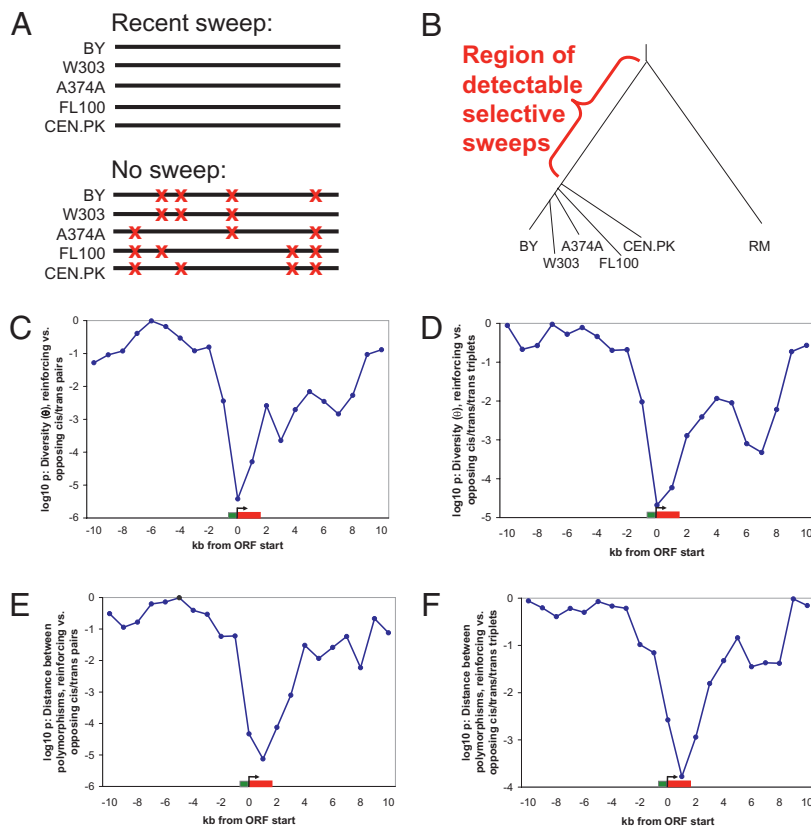
At each eQTL strength cutoff, we estimated both the number of “true positive” target genes—by subtracting the number expected by chance from that observed—as well as the number of genes subject to lineage-specific selection (i.e., the excess number of genes regulated by reinforcing *cis/trans* pairs). Plotting these against one another, a nearly linear relationship was observed (Fig. 2A), indicating that highly significant *cis/trans* eQTL pairs have approximately the same probability of being reinforcing as do weaker pairs. This probability is estimated by the slope of their relationship as 0.10, meaning that at least approximately 10% of *cis/trans* pairs have been subject to lineage-specific selection between these two yeast strains. This number reaches as high as 242 genes in this data set (Fig. 2A, Lower Right Inset), although this is surely an underestimate because the slope shows no signs of saturation and the test will also be rendered conservative by any stabilizing selection.

An extension of the *cis/trans* test described above is to apply it to genes regulated by three eQTL: one *cis* and two independent *trans*. Because a reinforcing triplet is less likely to occur by chance than a reinforcing pair, this may reduce the level of background signal in the test. The appropriate comparison is between reinforcing triplets and triplets where the *cis* effect opposes both of the *trans* effects (genes regulated by two *trans* eQTL with opposite effects are not used in this test) (SI Text). Application of this test to a range of eQTL strength cutoffs resulted in an even more linear relationship than for eQTL pairs and greater significance of the  $\chi^2$  test (Fig. 2B, Lower Right Inset). Although the requirement for three eQTL per gene decreased the number of genes detected, it increased the slope of the relationship to 0.17, indicating that at least approximately 17% of *cis/trans/trans* triplets tested have been subject to lineage-specific selection.

**Identifying Regulatory Adaptations.** An important question is whether the extensive lineage-specific selection we detected reflects adaptive differences or simply relaxed selection on many genes. To address this, we analyzed a data set of genome-wide polymorphisms from 63 strains of *S. cerevisiae* (17). It is well established that adaptive evolution results in selective sweeps that leave a clear signature in genetic variation: complete sweeps erase all variation from a region, which is then only slowly reconstituted by new mutations (Fig. 3A). In contrast, relaxed purifying selection—the alternative explanation for the excess of reinforcing eQTLs (SI Text)—would, if anything, result in increased genetic variation. Polymorphism data were available for five closely related laboratory strains, including BY (Fig. 3B). Sweeps that occurred before the divergence of these strains may be detectable as regions of reduced genetic diversity among the five (unfortunately there were too few strains to apply other tests of selection that are based on allele frequency distributions). To compare genetic diversity (referred to here as  $\theta$ , but also known as  $\pi$  or  $\theta_n$ ) to the results from the test of lineage-specific selection, we calculated  $\theta$  in 2-kb windows centered at each gene



**Fig. 2.** Results of selection test in yeast. (A) Applying the selection test on many *cis/trans* strength cutoffs yielded a nearly linear relationship between the number of true positive eQTL-regulated genes and the excess number of reinforcing *cis/trans* pairs (lineage-specific selected genes). Cutoffs with up to FDR = 30% were included, although most cutoffs (74%) had FDR < 5%. (Insets)  $2 \times 2$  tables for two cutoffs, including  $\chi^2$  *P* values. “RM > BY” indicates that the RM allele at a particular eQTL is associated with higher expression of the target gene. (B) Same as A, for *cis/trans/trans* triplets. (Insets) Same as A, except that “RM > BY” for *trans* indicates that RM alleles at both *trans* eQTL regulating a target gene lead to higher expression.



**Fig. 3.** Population genetic analysis of lineage-specific selection. (A) The effects of a complete selective sweep on genetic variation. Each red “x” represents a polymorphism. (B) Phylogenetic tree of the five laboratory strains and RM (based on ref. 17). Power to detect sweeps is greatest just before the divergence of the laboratory strains; it drops off sharply after this (because sweeps will affect fewer strains) and more gradually (due to mutation accumulation) before it. Note branch lengths are not precisely to scale. (C) Results of Wilcoxon test in a sliding 2-kb window (step size = 1 kb) on the distribution of  $\theta$  values near target genes of reinforcing vs. opposing *cis/trans* eQTL pairs. The average ORF length is shown in red, and approximate promoter length is shown in green. Cutoffs used are *cis*  $|r| > 0.2$ , *trans*  $|r| > 0.35$  (corresponding to Fig. 2A, Upper Left Inset). (D) Same as C but for targets of *cis/trans/trans* triplets. Cutoffs used are *cis*  $|r| > 0.2$ , *trans*  $|r| > 0.3$  (Fig. 2B, Upper Left Inset). (E) Same as C but testing the distribution of distances in between successive laboratory strain polymorphisms. A point was sampled every 1 kb, the distance separating the two closest flanking polymorphisms to that point was calculated, and then compared for reinforcing vs. opposing *cis/trans* eQTL pairs. (F) Same as E but for targets of *cis/trans/trans* triplets.

coding region’s 5’ end and repeated this every 1 kb for 10 kb in each direction (because *S. cerevisiae* is thought to lack long-range transcriptional regulation, the vast majority of *cis* eQTL are expected to be within several hundred bp of the ORF; therefore, this is testing for a signature of reduced genetic diversity at reinforcing *cis* eQTL). Comparing the distribution of  $\theta$  values for genes regulated by reinforcing vs. opposing *cis/trans* pairs, we observed a striking deficit of variation in the reinforcing class, which was strongest in the window centered on each gene’s 5’ end (Fig. 3C). This central window was highly significant (Wilcoxon  $p_w = 3.8 \times 10^{-6}$ ), suggesting that many of the *cis* eQTL among reinforcing pairs have been subject to recent selective sweeps in the laboratory strain lineage. Repeating the  $\theta$  distribution test for genes regulated by reinforcing vs. opposing eQTL triplets, a similar result was observed (Fig. 3D;  $p_w = 2.1 \times 10^{-5}$ ). Performing the same test using polymorphisms from strains far removed from BY and RM, no significant difference in  $\theta$  was seen in the central window ( $p_w = 0.83$ ; Fig. S2) or any other, indicating that the deficit of variation seen is specific to the relevant strains (and thus unlikely to be caused by any hidden factors, e.g., mutation cold spots, that might lead to a deficit of genetic variation if systematically differing between reinforcing and opposing eQTL targets) (SI Text).

The fraction of reinforcing *cis* eQTL that have experienced recent selective sweeps in the laboratory strain lineage can be estimated from the distributions of  $\theta$  values (Fig. S3). At the

eQTL cutoffs used above, we found that  $\theta$  was lower than expected by chance for approximately 78 genes (14.4% of reinforcing pairs), implying the action of selective sweeps in these regions. For eQTL triplets, approximately 56 genes (18.0% of reinforcing triplets) showed similar deficits of variation. At more permissive eQTL cutoffs, over 100 genes had lower  $\theta$  than expected. Because many sweeps may be too recent (after divergence of the five strains) or too ancient (because of mutation accumulation) to be detected, these are likely substantial underestimates of the extent of sweeps affecting gene expression in the laboratory strain lineage.

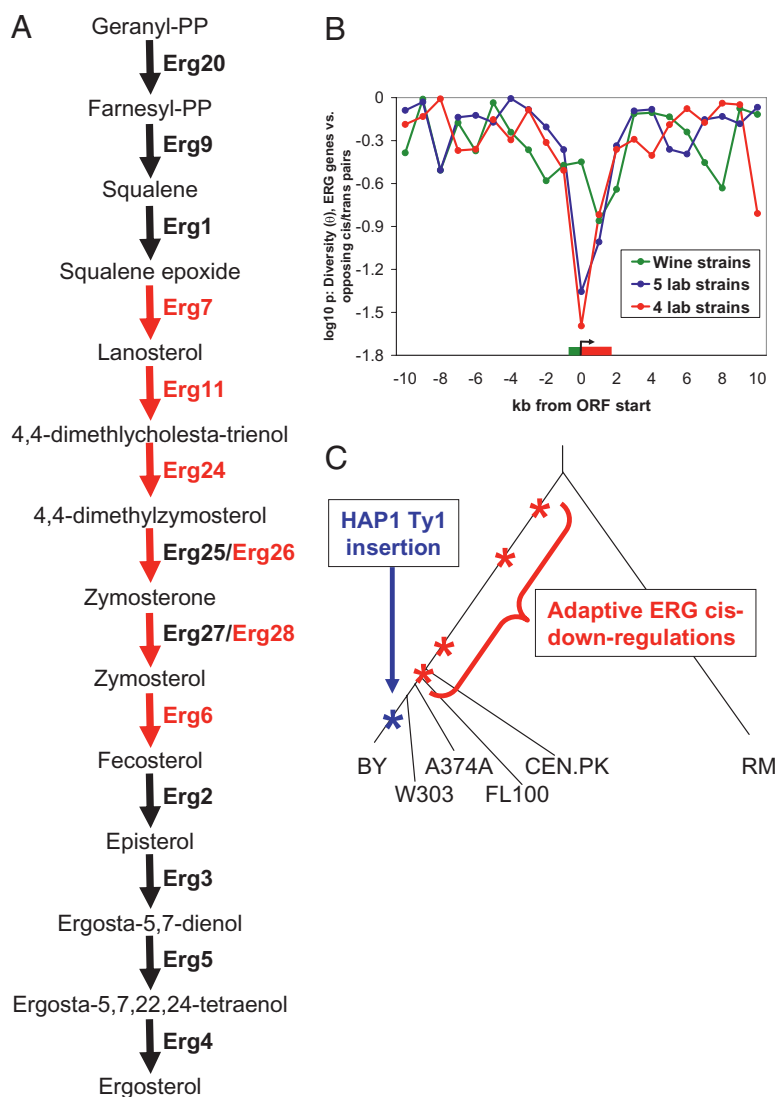
Analyzing  $\theta$  in the two classes of reinforcing eQTL (Fig. 1 and Fig. S1) separately is also informative. In this case, the appropriate set of opposing pairs for comparison is that with the same *cis* eQTL direction (SI Text). By keeping the *cis* eQTL direction constant in each comparison, the relationship between *trans* eQTL direction and  $\theta$  at each (unlinked) *cis* eQTL can be studied. The genes regulated by reinforcing eQTL with higher expression in BY showed a clear deficit in  $\theta$  (pairs  $p_w = 8.3 \times 10^{-5}$ , triplets  $p_w = 2.7 \times 10^{-4}$ ), whereas those with lower expression in BY had only a marginally significant deficit (pairs  $p_w = 0.013$ , triplets  $p_w = 0.031$ ). This suggests that most detectable sweeps of *cis*-acting variants in the laboratory strain lineage have increased the expression levels of their target genes (SI Text).

Another test of reduced diversity is to measure the distance between successive polymorphisms at different points in the

genome; a greater distance is expected in regions with recent sweeps (Fig. 3A). When this distance is often greater than the window size used in the  $\theta$  distribution test, this test may be a more sensitive method to detect sweeps. Applying this test in the same manner as the  $\theta$  distribution test, a similar pattern was seen: a greater distance separated polymorphisms near reinforcing *cis* eQTL than opposing ones for both eQTL pairs (Fig. 3E;  $p_w = 9.7 \times 10^{-6}$ ) and triplets (Fig. 3F;  $p_w = 1.2 \times 10^{-4}$ ), and maximal significance was observed within the ORFs, adjacent to the central window at each ORF's 5' end.

Similar population genetic analyses can be applied to 23 strains (mostly annotated as wine strains) (17) closely related to RM. All four tests ( $\theta$  and distance test on pairs and triplets) yielded similar results: there was a deficit of variation at the reinforcing target genes, although this was only marginally significant in each case ( $p_w < 0.05$  for each) (Fig. S4). Partial genome sequences exist for 10 wine strains (18) (plus a full sequence for RM), and applying the four tests to these data

revealed similarly weak but significant deficits of variation at reinforcing *cis* eQTL ( $p_w < 0.02$  for each) (Fig. S5). The number of sweeps detected in the wine strain lineage was approximately 50 (9.2% of reinforcing pairs; for triplets, approximately 33 were detected, or 10.6% of reinforcing triplets). There was no significant difference when analyzing the two classes of reinforcing eQTL (higher vs. lower expression in RM) separately, perhaps because the signal was weak even with the full set. Taken together, these results suggest that either there is less power to detect wine strain sweeps (despite having more genotyped wine strains), or fewer *cis* eQTL have been subject to positive selection in the wine lineage than in the laboratory lineage. It is possible that a difference in the extent of sweeps is due to effects of artificial selection in the laboratory on the laboratory strains, although this selection would have had to have been extremely intense because the time between the initial "laboratory domestication" and divergence of these strains was short (19).



**Fig. 4.** Selection on the ERG pathway. (A) Final steps of the ergosterol biosynthesis pathway. Targets of reinforcing *cis/trans* pairs are shown in red. Note Erg25 and Erg26 actually catalyze a series of four reactions, shown here collapsed into one arrow, and Erg28 is not an enzyme but an important regulator of the reaction shown. (B) Results of  $\theta$  distribution test, similar to Fig. 3C except using only the six ERG genes highlighted in A for the targets of reinforcing eQTL. (C) Phylogenetic tree of yeast strains, with the most parsimonious location of the HAP1 Ty1 insertion (blue) and possible times of ERG gene selective sweeps on down-regulating *cis*-regulatory variants (red). Note that other ERG gene sweeps may also have occurred more recently than shown; polymorphism data from additional laboratory strains will be needed to test this.

**Multiple Adaptations in the Ergosterol Biosynthesis Pathway.** To gain insights into specific adaptations, it is not sufficient to simply know how many gene expression levels have been subject to positive selection; the affected processes must be discovered as well. To this end, we searched the list of genes regulated by reinforcing *cis/trans* eQTL pairs for enrichments in Gene Ontology annotations. Eight genes from the ergosterol (ERG) biosynthesis pathway passed a stringent *cis*  $|r| > 0.2$ , *trans*  $|r| > 0.5$  cutoff (FDR < 0.001%); all eight had reinforcing eQTL with lower expression in BY, although only 47 genes in the entire genome satisfied this constraint (approximately 50-fold enrichment; hypergeometric  $P = 1.7 \times 10^{-12}$ ). Remarkably, six of these ERG genes are responsible for a series of reactions clustered in the pathway (Fig. 4A; the other two, *ERG8* and *HMGI*, catalyze steps preceding the reactions shown), suggesting that selection may have specifically targeted successive steps in this pathway.

Applying the  $\theta$  distribution test to these six genes, a marginally significant deficit of variation was seen in the five laboratory strains (Fig. 4B, blue line;  $p_w = 0.044$ ), but not the wine strains (Fig. 4B, green line;  $p_w = 0.35$ ), consistent with sweeps having occurred in the laboratory strain lineage. The *trans* eQTLs for all six genes map to the same marker on chromosome 12, and the likely causal polymorphism underlying this eQTL is already known, a Ty1 retrotransposon insertion in the activation domain of *HAP1*, a transcription factor known to regulate the ERG pathway. This insertion has been shown to substantially reduce the activity of *HAP1* and to alter regulation of the *HMGI* and *CYCI* promoters (20, 21). Surprisingly, the insertion is quite recent: it is not present in either W303 or CEN.PK (or any other of more than 70 partially sequenced yeast strains) (18), suggesting that it occurred in the BY-specific branch (Fig. 4C). Considering how recently this event occurred, we tested whether excluding CEN.PK (the most diverged laboratory strain) from the  $\theta$  analysis might increase the power by improving detection of sweeps that occurred after the divergence of this lineage. Although most reinforcing genes lose significance when excluding CEN.PK, the ERG genes became approximately twofold more significant (Fig. 4B, red line;  $p_w = 0.025$ ). In particular, one gene (*ERG28*) had four CEN.PK-specific polymorphisms but no

variants in any of the other four strains, consistent with a sweep occurring after CEN.PK's divergence. In sum, these results suggest that the expression of multiple ERG genes may have been subject to recent selective sweeps (Fig. 4C). Because these genes all have lower expression in BY than RM, they likely represent cases of adaptive down-regulations—in contrast to the majority of detectable sweeps in the laboratory lineage, which are associated with up-regulation. The selective advantage of lower ERG gene expression is unknown, but could be tied to one or more of the diverse roles that ergosterol plays in a wide range of processes (signal transduction, membrane fluidity, mating, etc.) (22).

It is especially intriguing that the expression levels of so many genes have been subject to positive selection in a species where so few genes show any evidence of positive selection on protein sequences (23–25)—even when the McDonald-Kreitman test (26) was applied to over 1,000 genes in a collection of over 70 strains, no cases of positive selection were identified (18). Although still preliminary, this striking contrast suggests that budding yeast may represent a case where most adaptation has occurred at the level of gene expression—similar to what was proposed for humans and chimpanzees over 30 years ago (2). It will be interesting to apply the test of lineage-specific selection introduced here to detect selection in other species, and—with some modifications—in outbred groups, such as human populations.

## Materials and Methods

A Pearson correlation (mathematically equivalent to a 2-sided *t* test because there are only two genotype classes in haploid yeast) was calculated for each gene-marker pair (coding genotypes as 0/1). For each gene, the strongest correlation in *cis* (defined as markers within 50 kb of the gene itself; although having a “local” eQTL is not proof of a *cis*-acting effect, the eQTL need not be *cis*-acting for the test of selection to be valid, it must only be caused by a polymorphism distinct from the local eQTLs of other genes that share the exact same *trans* eQTL) and the two strongest *trans* (defined as being on different chromosomes from the gene itself and from one another) were then recorded. Results from randomization tests are shown in Fig. S6.

Additional methods are explained in *SI Text*.

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