1	Title:
---	--------

2 Active compensation for changes in *TDH3* expression mediated by direct regulators of *TDH3* in

- 3 Saccharomyces cerevisiae
- 4

5 Authors:

- 6 Pétra Vande Zande^{1,3} and Patricia J. Wittkopp^{1,2}
- 7
- 8 Affiliations:

¹ Department of Molecular, Cellular, and Developmental Biology, University of Michigan, Ann

- 10 Arbor, MI, USA
- ² Department of Ecology and Evolutionary Biology, University of Michigan, Ann Arbor, MI,
- 12 USA

³Current address: Department of Microbiology and Immunology, University of Minnesota,

14 Minneapolis, MN, USA

15 Corresponding author: Patricia J Wittkopp, wittkopp@umich.edu

16 Abstract

17 Genetic networks are surprisingly robust to perturbations caused by new mutations. This

18 robustness is conferred in part by compensation for loss of a gene's activity by genes with

19 overlapping functions, such as paralogs. Compensation occurs passively when the normal

20 activity of one paralog can compensate for the loss of the other, or actively when a change in one

21 paralog's expression, localization, or activity is required to compensate for loss of the other. The

22 mechanisms of active compensation remain poorly understood in most cases. Here we

23 investigate active compensation for the loss or reduction in expression of the *Saccharomyces*

24 *cerevisiae* gene *TDH3* by its paralogs *TDH1* and *TDH2*. *TDH1* and *TDH2* are upregulated in a

25 dose-dependent manner in response to reductions in *TDH3* by a mechanism requiring the shared

transcriptional regulators Gcr1p and Rap1p. Other glycolytic genes regulated by Rap1p and

27 Gcr1p show changes in expression similar to *TDH2*, suggesting that the active compensation by

28 *TDH3* paralogs is part of a broader homeostatic response mediated by shared transcriptional

29 regulators.

1 Introduction

2 Biological systems are often robust to genetic and environmental perturbations (Félix and 3 Barkoulas 2015; Gibson and Lacek 2020). This robustness is conferred in part by the presence of 4 multiple genes in the genome with overlapping functions (Ohya et al. 2005; DeLuna et al. 2008; 5 Diss et al. 2014). Such genes often arise through duplication events that give rise to two or more 6 paralogous genes (Wagner 2000; Gu et al. 2003). As described in Diss et al. (2014), paralogous 7 genes can contribute to phenotypic robustness through either passive or active mechanisms. In 8 passive paralogous compensation, the normal activity of one of the paralogs is sufficient to 9 minimize the phenotypic impact of losing the activity of the other paralog. By contrast, active 10 paralogous compensation occurs when the activity of one paralog changes in response to loss of 11 activity of the other paralog, reducing the phenotypic impact of this loss. For example, a gene 12 may respond to loss of a paralogous gene's function by increasing its expression level, producing 13 more protein capable of performing the function of the mutated gene.

14

15 Multiple examples of active compensation by upregulation of a paralog have been identified 16 (Rudnicki et al. 1992; DeLuna et al. 2010; Denby et al. 2012; Dong et al. 2016; Dohn and Cripps 17 2018; Rodriguez-Leal et al. 2019), but the molecular mechanisms responsible for such 18 transcriptional compensation remain largely unknown. One notable exception is loss of the CLV1 19 receptor kinase in Arabidopsis thaliana that is compensated for by the upregulation of related 20 receptor kinases BAM1, BAM2, and BAM3. Under normal circumstances the BAM genes are 21 negatively regulated by CLV1, and loss of CLV1 removes this transcriptional repression, 22 resulting in upregulation of the BAM genes that compensates for the loss of CLV1 (Nimchuk et 23 al. 2015). This active compensation for loss of CLV1 is not conserved in tomato or maize, but

1 other steps in the *CLV* signaling pathway show evidence of active or passive compensation 2 within these species (Rodriguez-Leal et al. 2019). For example, in tomato, upregulation of 3 SICLE9 in response to loss of SICLV3 reduces the phenotypic impact of the SICLV3 mutation, 4 although the mechanism causing this upregulation is unclear (Rodriguez-Leal et al. 2019). 5 6 Large-scale synthetic genetic interaction studies in the baker's yeast Saccharomyces cerevisiae 7 have also shown that paralogs with overlapping function are frequently able to compensate for 8 each other (Li et al. 2010; Kuzmin et al. 2020). Up-regulation of paralogous genes with 9 overlapping functions when one paralog is deleted has been reported in S. cerevisiae, and 10 paralogs with partially overlapping regulatory motifs are more likely to be dispensable than those 11 without overlap suggesting compensation for their loss (Kafri et al. 2005). To explain these 12 observations, a model has been proposed in which two paralogous enzymes that catalyze the 13 same metabolic step and are coregulated by the same transcription factor form a network motif in 14 which the accumulation of their metabolite, due to loss of one paralog, leads to upregulation of 15 the other paralog, and thus active compensation (Kafri et al. 2005). There are many examples of 16 feedback circuits from yeast to mammals with the potential to function this way, making the 17 model potentially of wide relevance to many biological systems (Kafri et al. 2006). To the best 18 of our knowledge, however, the proposed dependency on a shared regulator for active 19 compensation by upregulation of paralogous genes has yet to be demonstrated empirically. 20 21 The Saccharomyces cerevisiae TDH1, TDH2, and TDH3 genes are paralogs with overlapping 22 protein function and partially overlapping regulation that might make them likely to show active

23 compensation. All three of these proteins act as glyceraldehyde-3-phosphate dehydrogenases

1 (GAPDHs) (McAlister and Holland 1985a; Linck et al. 2014), catalyzing a central step in both 2 glycolysis and gluconeogenesis. The TDH2 and TDH3 proteins are most similar to each other, retaining 94% amino acid sequence identity (Holland and Holland 1980; Engel et al. 2014), 3 4 whereas the TDH1 and TDH3 proteins have 89% amino acid sequence identity (Holland et al. 5 1983; Engel et al. 2014). TDH2 and TDH3 are expressed during exponential growth at different 6 levels, and *TDH1* is expressed primarily during stationary phase (Delgado et al. 2001; Bradley et 7 al. 2019). Deletion of TDH3 reduces fitness to ~90% of wild type whereas deletion of TDH1 or 8 TDH2 alone has little to no effect (McAlister and Holland 1985b; Costanzo et al. 2010). The 9 $tdh l \Delta/tdh 3\Delta$ double mutant shows a negative genetic interaction in which the double mutant is 10 more deleterious than expected relative to the predicted additive effects of the two single mutant 11 fitness measures (McAlister and Holland 1985b), and the $tdh2\Delta/tdh3\Delta$ double mutant showed an 12 even stronger negative interaction, growing at only 7% of wild type levels (Costanzo et al. 2010). 13 These nonadditive impacts on fitness suggest that the functional overlap of these paralogs allows 14 them to compensate for each other. 15

16 Here, we investigate the molecular mechanisms responsible for this compensation. We find that 17 expression of both TDH1 and TDH2 are upregulated when TDH3 expression is reduced, and 18 downregulated when TDH3 expression is increased, suggesting that both paralogs provide active 19 compensation for changes in TDH3 expression. However, TDH2 was not upregulated in strains 20 carrying mutations in direct regulators Rap1p or Gcr1p that decreased TDH3 expression, 21 suggesting that both Rap1p and Gcr1p are required for the compensatory upregulation of this 22 paralog. For *TDH1*, compensatory changes in expression were seen in the Gcr1p but not Rap1p 23 mutants, suggesting that there are differences in the molecular mechanisms providing

1	compensatory changes in expression of the two paralogs. This involvement of Rap1p and/or
2	Gcr1p in the upregulation of TDH1 and TDH2 provides empirical support for the model
3	proposed by Kafri et al. (2005) in which active compensation by paralogous genes is facilitated
4	by one or more shared regulators and feedback loops. This compensation is not limited to
5	paralogous genes, however; we also see upregulation of other genes with shared regulators
6	encoding proteins that function in the same metabolic pathway when mutations in the TDH3
7	promoter reduce its expression but not in cells with reduced TDH3 expression caused by
8	mutations in Gcr1p or Rap1. Consequently, this study shows how shared regulators controlling
9	expression of multiple (paralogous and non-paralogous) genes that function in the same
10	biochemical pathway can provide mutational robustness through active compensation from other
11	members of the pathway, contributing to homeostasis.
12	
13	Results
14	
15	Active compensation for loss of TDH3 by paralogs TDH1 and TDH2
16	To determine whether the compensation for loss of TDH3 activity by TDH1 and/or TDH2 might
17	be mediated by changes in their expression, we examined TDH1 and TDH2 expression in a

18 TDH3 deletion strain of S. cerevisiae ($tdh3\Delta$) previously analyzed using RNA-seq (Vande Zande

19 et al. 2022). We found that both genes showed significantly higher expression in the $tdh3\Delta$ strain

20 than in the unmutated wild-type strain (Figure 1A, Wald test P-value for $TDH1 = 2x10^{-5}$, P-value

for TDH2 = 0.04). To determine whether the degree of upregulation correlates with the extent to

22 which TDH3 expression is altered, we used additional RNA-seq data from the same study to

23 examine *TDH1* and *TDH2* expression in strains of *S. cerevisiae* carrying changes in the *TDH3*

1 promoter that cause more moderate alterations in *TDH3* expression. Three of these strains carry 2 a single point mutation in the TDH3 promoter that drives either 20%, 50%, or 85% of wild-type 3 TDH3 expression (Vande Zande et al. 2022). A fourth strain carries a duplication of the TDH3 4 gene with each copy carrying a single promoter mutation, resulting in a strain expressing TDH3 5 at 135% of wild-type levels. We found that *TDH2* expression was negatively correlated with 6 TDH3 expression among these strains, with TDH2 showing both increased expression when 7 TDH3 expression was decreased and reduced expression when TDH3 expression was increased 8 (Figure 1B). TDH1, on the other hand, showed more of a threshold-like relationship with TDH3 9 expression: TDH1 expression was strongly increased in the TDH3 null strain, but only mildly 10 (and similarly) increased in the mutant strains expressing TDH3 at 20%, 50%, and 85% of wild-11 type levels (Figure 1C). Like TDH2, TDH1 expression decreased in the strain overexpressing 12 TDH3 (Figure 1C). Taken together, these data provide evidence of active compensation when TDH3 expression is altered, with expression of its paralogs TDH1 and TDH2 changing in ways 13 14 expected to minimize the impacts of these TDH3 mutations on fitness. 15 16 Active compensation might be caused by direct regulators of TDH3 17 For historical reasons (Duveau et al. 2017), the control strain and TDH3 mutant strains profiled 18 for expression using RNA-seq in Vande Zande et al (2022) all carried a reporter gene composed 19 of the wild-type TDH3 promoter allele driving expression of a yellow fluorescent protein (P_{TDH3} -20 *YFP*). Surprisingly, we found that expression of this reporter gene was increased when native 21 TDH3 expression was decreased by mutations in its promoter and decreased by the duplication 22 of TDH3 with promoter mutations causing over-expression of TDH3 (Figure 2A). This negative

23 correlation between expression of the native *TDH3* gene harboring *cis*-acting mutations and

expression driven by a wild-type allele of the *TDH3* promoter suggests that factors regulating
 expression of *TDH3* itself might be involved in the mechanism of active compensation.

3

4 The transcription factors Rap1p and Gcr1p regulate expression of TDH3 (Huie et al. 1992; Yagi 5 et al. 1994) as well as expression of other glycolytic genes, including *TDH1* and *TDH2* 6 (MacIsaac et al. 2006; Hu et al. 2007; Venters et al. 2011; Lickwar et al. 2012). In fact, the 7 mutations altering expression of TDH3 in the mutant strains expressing TDH3 at 20%, 50%, and 8 85% of wild-type expression levels all altered either Rap1p or Gcr1p binding sites in the TDH3 9 promoter (Figure 2B, Duveau et al. 2017; Vande Zande et al. 2022). We thus wondered whether 10 transcription of RAP1 and/or GCR1 was changed in the strains with TDH3 promoter mutations. 11 Using the same RNA-seq dataset described above, we found that GCR1 was upregulated linearly 12 in response to reductions in TDH3 expression caused by mutations in the TDH3 promoter 13 whereas expression of *RAP1* was not (Figure 2C). If anything, expression of *RAP1* was slightly 14 and similarly reduced in all mutants with reduced *TDH3* expression (Figure 2C). These 15 observations suggest that changes in expression of *TDH1* and *TDH2* in response to changes in 16 expression of TDH3 might be caused by homeostatic feedback mechanisms involving direct 17 regulators of TDH3.

18

Mutations in RAP1 and GCR1 disrupt compensatory expression changes of TDH1 and TDH2
If Rap1p and/or Gcr1p are involved in the upregulation of TDH1 and TDH2 upon reduction of
TDH3 expression, we expect that strains with mutations in Rap1p or Gcr1p causing a reduction
in TDH3 expression would not show the same compensatory upregulation of TDH1 and TDH2.
That is, if the upregulation of TDH3 paralogs requires Rap1p or Gcr1p, then mutations in these

proteins that disrupt their ability to drive TDH3 expression at wild-type levels should also impair
their ability to upregulate expression of other genes in response to reduced TDH3. To test this
hypothesis, we examined RNA-seq data from 9 mutant strains of S. cerevisiae each carrying 1-6
mutations in the RAP1 (4 mutants) or GCR1 (5 mutants) gene previously shown to affect TDH3
expression (Duveau et al. 2021). These data were collected in parallel with the expression data
for the TDH3 mutants (Vande Zande et al. 2022). One GCR1 mutant strain (GCR1.162) carried a
single nucleotide deletion resulting in an early stop codon, suggesting it was likely to be a null
mutation. This mutant expressed TDH3 at only 7% of wild-type expression levels (Figure 3A).
The other GCR1 mutant alleles were more likely to be hypo- (GCR1.339, GCR1.281, GCR1.37)
or hypermorphs (GCR1.241), causing <i>TDH3</i> expression to range from \sim 22% to \sim 105% of wild
type levels (Figure 3A). RAP1 null mutants are lethal (Giaever et al. 2002), suggesting that all of
the RAP1 mutants examined were either hypo- or hypermorphs. These RAP1 mutants showed
<i>TDH3</i> expression ranging from $\sim 20\%$ to $\sim 115\%$ of wild-type levels (Figure 3A).
Consistent with Rap1p and Gcr1p mediating compensatory changes in paralog gene expression,
we found that the TDH2 gene was not upregulated in either the Rap1p or Gcr1p mutants that
decreased TDH3 expression (Figure 3B). TDH2 expression was also not reduced in mutants
causing overexpression of TDH3 (Figure 3B). These observations indicate that both Rap1p and
Gcr1p are required for the compensatory changes in TDH2 expression seen in strains carrying
mutations in the TDH3 promoter. Changes in expression of the P_{TDH3} -YFP reporter gene seen in
the TDH3 mutants (Figure 2A) were also absent in the RAP1 and GCR1 mutants altering TDH3
expression (Figure 3C), again implying that Gcr1p and Rap1p were required for these changes.

23 Expression of *TDH1*, on the other hand, showed compensatory increases in expression in *GCR1*

1	mutants that lowered TDH3 expression (Figure 2D), suggesting that Gcr1p is not required for the
2	upregulation of <i>TDH1</i> in response to reduced expression of <i>TDH3</i> . Rap1p might be required for
3	this active compensation, however, because neither of the RAP1 mutants decreasing TDH3
4	expression showed a compensatory upregulation of TDH1 (Figure 2D). These data support a
5	model in which Gcr1p is involved in the active compensation for changes in TDH3 expression
6	via TDH2, but not TDH1, with Rap1p involved in the compensatory changes in expression of
7	both genes.
8	

10

9 Compensatory expression changes are also seen for other, non-paralogous, metabolic genes

11 Rap1p and Gcr1p are transcription factors that regulate expression of many metabolic genes 12 (Uemura et al. 1997; Piña et al. 2003), thus active compensation for altered TDH3 expression 13 mediated by Rap1p and Gcr1p might affect more than just paralogous genes. Indeed, the eight 14 genes encoding enzymes that function in the glycolytic pathway at steps immediately 15 surrounding the step controlled by the TDH proteins have all been annotated as targets of Gcr1p 16 and Rap1p based on either gene expression or chromatin immunoprecipitation experiments (Hu 17 et al. 2007; Venters et al. 2011; Lickwar et al. 2012). We therefore examined the expression of 18 these genes (Figure 4A) in the TDH3, RAP1, and GCR1 mutants described above. We found that 19 the genes *PFK2*, *PGK1*, and *ENO1* were significantly upregulated in the *thd3* Δ null mutant and 20 their expression showed an inverse relationship with *TDH3* expression in the other TDH3 21 mutants examined (Figure 4B). Similar to TDH2, these compensatory changes in expression 22 were absent when TDH3 expression was altered by mutations in RAP1 or GCR1 rather than the 23 TDH3 promoter (Figure 4C). The genes PFK1, ENO2, FBA1, TPI1, and GPM1 showed smaller 24 changes in expression in the TDH3 mutants and no statistically significant upregulation in the

thd3∆ null mutant (Figure 4D). In the *RAP1* and *GCR1* mutants that altered *TDH3* expression,
 these genes showed expression similar to *TDH3* rather than compensatory changes in expression
 (Figure 4E). These expression patterns are consistent with the regulation of these glycolytic
 genes by Gcr1p/Rap1p as well as their active compensation for changes in *TDH3* expression
 being mediated through homeostatic feedback mechanisms involving Gcr1p and Rap1p.

6

7 Discussion

8 Many genes with overlapping functions can compensate for each other's loss, contributing to the 9 genetic robustness of biological systems, but the mechanisms by which this compensation arises, 10 operates, and is maintained over evolutionary time continues to be unclear (He and Zhang 2006; 11 VanderSluis et al. 2010; Kuzmin et al. 2022). In this study, we show that changes in TDH3 12 expression trigger feedback mechanisms that depend on the activity of transcription factors 13 Rap1p and Gcr1p to offset the effects of these changes. Strains bearing *cis*-regulatory mutations 14 in the TDH3 promoter that decrease its expression presumably fail to upregulate TDH3 because 15 the transcription factor binding sites for Rap1p or Gcr1p are disrupted in these alleles (or because 16 the locus is absent in the null mutant), yet expression of other genes regulated by Gcr1p and 17 Rap1p is increased, including the TDH3 paralogs TDH2 and TDH1 and even a reporter gene 18 driven by a wild-type TDH3 promoter. In other words, reduction in TDH3 expression results in 19 active compensation by upregulation of its paralogs, though seemingly through somewhat 20 different mechanisms for TDH1 and TDH2 (Figure 5).

21

The upregulation of *TDH2* by Gcr1p/Rap1p might be achieved by increased expression of the *GCR1* gene in response to reduced *TDH3* expression. Transcriptional upregulation is not the only
mechanism of activation of transcription factors (Hahn and Young 2011), but *GCR1* has been

1	shown to be both transcriptionally and post-transcriptionally regulated by glucose availability
2	(Hossain et al. 2016) and we observed increased GCR1 expression in mutants with decreased
3	TDH3 expression, demonstrating that activity of this transcription factor is transcriptionally
4	regulated under some circumstances. RAP1, on the other hand, performs roles in telomere
5	maintenance and activation of ribosomal protein genes in addition to the activation of glycolytic
6	genes (Sussel and Shore 1991; Shore 1994), and is not known to be transcriptionally responsive
7	to metabolic changes. Because Rap1p and Gcr1p act in a complex to activate target gene
8	expression, with Gcr1p being the major activator of the complex (Piña et al. 2003), we propose
9	that upregulation of GCR1 transcription upon reduction in TDH3 expression is primarily
10	responsible for the upregulation of the Rap1p/Gcr1p complex's target genes, while still being
11	dependent on functional Rap1p for upregulation of its target genes.
12	
13	Active compensation by TDH1 appears to occur via a different mechanism, as indicated by its
14	more threshold-like response to reduction in TDH3 expression and its upregulation in strains
15	bearing mutations in GCR1. These differences in how TDH1 and TDH2 respond to reduction in
16	TDH3 expression may not be surprising since the expression pattern of TDH1 has diverged from
17	that of the other two paralogs (McAlister and Holland 1985a). TDH1 has been shown to be
18	upregulated under various stress conditions causing slow growth (Linck et al. 2014), and might
19	therefore be upregulated by a mechanism related to the slower growth of mutants with reduced
20	TDH3 expression level rather than feedback specifically involving Gcr1p, although it does
21	appear to be at least somewhat dependent on Rap1p function.
22	

1 The fact that the upregulation of *TDH1* and *TDH2* does not completely eliminate the fitness 2 effect of deleting TDH3 suggests that pleiotropic effects of the compensation mechanism itself 3 may carry a fitness cost (Kovács et al. 2021) and/or that the functions of these paralogs have 4 diverged to some extent and cannot completely compensate for each other. Such partial 5 subfunctionalization is thought to occur relatively frequently (Harrison et al. 2007; Kuzmin et al. 6 2020), and suggests that the maintenance of these paralogs by natural selection is not exclusively 7 due to their ability to compensate for each other. Although *TDH3* is best known for its roles in 8 glycolysis and gluconeogenesis, it has also been implicated in transcriptional silencing (Ringel et 9 al. 2013), RNA-binding (Shen et al. 2014) and antimicrobial defense (Branco et al. 2014), 10 functions which may not be able to be compensated for by TDH1 or TDH2 despite their high 11 levels of protein conservation. More work assessing the 'non-canonical' or 'moonlighting' 12 (Espinosa-Cantú et al. 2015; Chauhan et al. 2017; Singh and Bhalla 2020) functions of the 13 GAPDHs in S. cerevisiae is needed to reveal the extent of subfunctionalization between these 14 three paralogs.

15

16 The redundancy of paralogous genes, while imparting robustness to biological systems, 17 simultaneously makes them unstable evolutionarily given that mutations in one gene are masked 18 by the presence of the other gene. Yet, paralogous genes with overlapping function are 19 maintained over long evolutionary timescales (Kafri et al. 2006; Tischler et al. 2006; Ihmels et 20 al. 2007; Dean et al. 2008; DeLuna et al. 2008; Kafri et al. 2008; Hanada et al. 2009; Li et al. 21 2010; Kuzmin et al. 2020). Divergence in gene regulation and/or protein function might 22 contribute to the maintenance of all three TDH paralogs over evolutionary time; however, in 23 general, it remains to be seen how often the ability of paralogs to actively compensate for each

12

other and contribute to genetic robustness is actively selected for or simply a side effect of their
ancestrally shared regulators with sensitivity to feedback mechanisms. Decoding the molecular
mechanisms responsible for active compensation among paralogous genes in other systems will
help address this issue, revealing how living systems can thrive despite the inevitable changes in
the environment and their genotype.

6

7 Materials and Methods

8 *Strains used in this study*

9

10 The *S. cerevisiae* strains used in this study are haploid strains derived from S288C and include

11 the 5 *cis*-regulatory mutants affecting expression of *TDH3* containing changes in the *S*.

12 *cerevisiae TDH3* promoter and the 9 *trans*-regulatory mutants affecting expression of *TDH3* that

each carry 1-6 mutations in either the *RAP1* or *GCR1* gene described in Vande Zande et al. 2022.

14 Construction of the *cis*-regulatory mutant strains, including the $tdh3-\Delta$ strain, is described in

15 (Duveau et al. 2017), and construction of the strains bearing mutations in the *RAP1* or *GCR1*

16 genes is described in (Duveau et al. 2021). The collection numbers and specific mutations in

17 each strain, as well as their impacts on *TDH3* expression, are detailed in Table S1.

18 *Gene expression data*

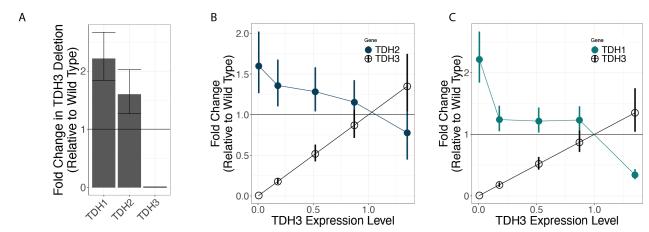
19 RNA-sequencing data presented in this paper is a subset of the data described Vande Zande et al.

20 2022 and are available at GEO accession GSE175398. That dataset consists of RNA-sequencing

- 21 data for *cis*-regulatory mutants and a larger set of *trans*-regulatory mutants affecting *TDH3*
- expression. Details of data collection and processing are available in (Vande Zande et al. 2022)
- and are summarized here. Briefly, yeast cells were grown to mid log phase in glucose media,

1	pelleted, and frozen at -80C. polyA RNA was extracted from frozen cell pellets using oligodT
2	magnetic beads. RNA libraries were prepared for sequencing using a $\frac{1}{3}$ volume TruSeq RNA
3	Sample Preparation v2 kit (Illumina) and sequenced on a HiSeq 4000 by the University of
4	Michigan Sequencing Core. Each genotype (all mutants and non-mutated reference strains) was
5	assayed in quadruplicate with each replicate consisting of a unique random array of genotypes
6	and controls in a 96 well plate.
7	Statistical analysis
8	All statistical analysis was performed in R, version 3.5.2). As described in Vande Zande et al.
9	2022, RNA-seq reads were pseudomapped to the S. cerevisiae transcriptome (Ensemble, release
10	38, retrieved from ftp://ftp.ensemblgenomes.org/pub/release-
11	38/fungi/fasta/saccharomyces_cerevisiae/cdna/), and DeSeq2 (Love et al. 2014) was used to
12	estimate log ₂ fold changes and significance values reported in the text. Code used in the analysis
13	and to generate figures in this manuscript is available at Github (URL:
14	https://github.com/pvz22/Compensation_TDH3).
15 16 17	Acknowledgements
18	We thank Abigail Lamb for constructive feedback on the manuscript, Mo Siddiq and Holly
19	Scheer for technical and intellectual support, and other members of the Wittkopp Lab for helpful
20	discussions and feedback on drafts of this manuscript. This work was supported by the National
21	Institutes of Health (grant number T32GM07544 to P.V.Z. and grant numbers R35GM118073
22	and R01GM108826 to P.J.W.) and the National Science Foundation (MCB-1929737 to P.J.W.).
23 24 25	





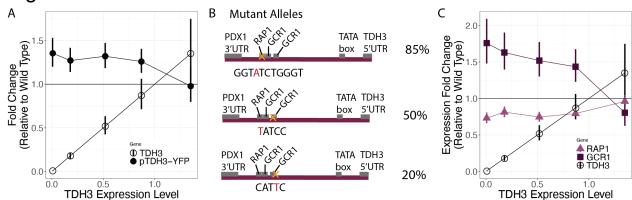


4 Figure 1: *TDH1* and *TDH2* actively compensate for changes in *TDH3* expression

5 (A) Changes in expression of TDH1, TDH2, and TDH3 in response to the deletion of TDH3 are 6 shown, measured as fold change in expression relative to a wild type. Error bars represent one 7 standard error of the mean. Statistical significance of expression changes was assessed using Wald tests in DESeq2, with the P-value for $TDH1 = 2x10^{-5}$, TDH2 = 0.04, and $TDH3 = 7x10^{-107}$. 8 9 (B) Changes in expression of *TDH3* and *TDH2* are shown for strains with *cis*-acting mutations 10 causing 0%, 20%, 50%, 85%, and 135% of wild type TDH3 expression. Error bars show one 11 standard error of the mean. (C) Changes in expression of TDH3 and TDH1 are shown for strains with *cis*-acting mutations causing 0%, 20%, 50%, 85%, and 135% of wild type TDH3 12 13 expression. Error bars show one standard error of the mean.

14 15

16 Figure 2



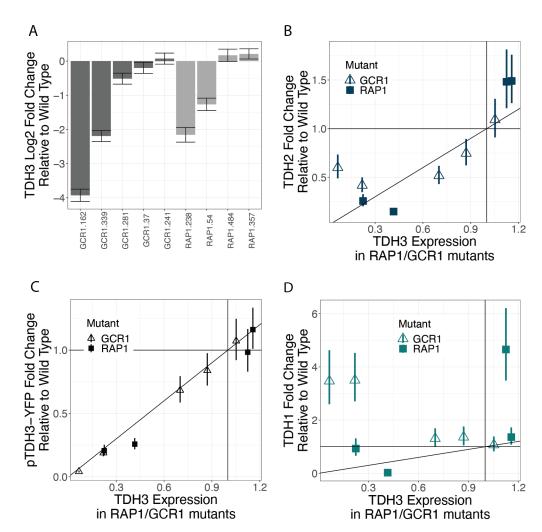
17 18 Figure 2: Feedback regulating TDH3 expression is mediated by RAP1 and GCR1 TFBSs 19 (A) Changes in expression of TDH3 and a reporter gene with a wild type TDH3 promoter driving 20 expression of YFP (P_{TDH3} -YFP) are shown for strains with *cis*-acting mutations causing 0%, 21 20%, 50%, 85%, and 135% of wild type TDH3 expression. Error bars show one standard error 22 of the mean. (B) Schematics and sequences of the TDH3 promoter in mutant strains bearing 23 mutations in binding sites for Rap1p and Gcr1p that result in *TDH3* expression levels of 20%, 24 50%, and 85% relative to wild type are shown. No schematic is shown for the mutant strain 25 expressing TDH3 expression at 135% of wild type levels, which contains two copies of the 26 TDH3 gene separated by a copy of the URA3 gene, with both copies of TDH3 containing a

1 mutation in the binding site for Rap1p (GGTGTCTGaGT). (C) Changes in expression of RAP1,

2 *GCR1*, and *TDH3* are shown for strains with *cis*-acting mutations causing 0%, 20%, 50%, 85%,

and 135% of wild type *TDH3* expression, measured as fold change in expression relative to a

4 wild type. Error bars represent one standard error of the mean.



5 Figure 3



Figure 3: Mutations in RAP1 and/or GCR1 disrupt compensation by TDH2 and TDH1

8 (A) Changes in expression of *TDH3* in response to various mutations in either *GCR1* (dark grey)
 9 or *RAP1* (light grey), measured as log₂ fold change in expression relative to a wild type. Specific

9 or RAP7 (light grey), measured as log₂ fold change in expression relative to a wild type. Specific 10 mutation identities in each strain are described in Table S1. Error bars represent one standard

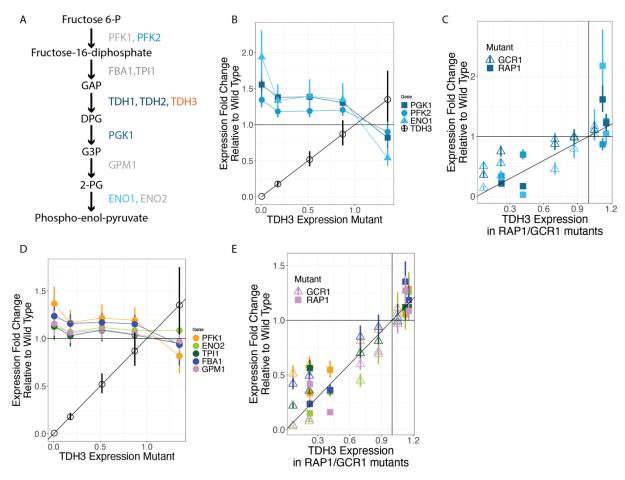
11 error of the mean. Fold changes in expression of *TDH3* and *TDH2* (B) a reporter gene with a

12 wild type *TDH3* promoter driving expression of YFP (P_{TDH3} -YFP) (C), and TDH1 (D), are shown

13 for strains with mutations in either *RAP1* (squares) or *GCR1* (empty triangles). Error bars show

14 one standard error of the mean.

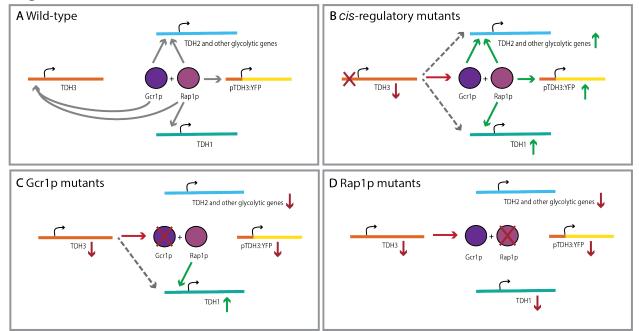
Figure 4 1



2 3 Figure 4: Multiple enzymes in the glycolysis pathway are upregulated upon reduction in 4 TDH3 expression in a RAP1/GCR1 dependent manner. (A) A simple schematic of the 5 glycolytic pathway surrounding the metabolic step catalyzed by TDH1,2, and 3, showing other 6 enzymes catalyzing adjacent reactions. Enzymes that are significantly upregulated upon 7 reduction in TDH3 are in blue. Enzymes in this pathway that were not significantly upregulated 8 are shown in grey. (B) Expression fold changes relative to wild type of the genes PGK1, PFK2, 9 ENO1, and TDH3 in yeast strains with varying levels of TDH3 expression due to mutations in 10 the native TDH3 promoter, as estimated by RNA-sequencing data. Error bars are one standard 11 error of the mean. (C) Expression fold changes relative to wild type of the genes PGK1, PFK2, 12 ENO1, and TDH3, colored as in B, in the 9 yeast strains with varying levels of TDH3 expression 13 due to mutations in the genes encoding RAP1 or GCR1, as estimated by RNA-sequencing data. 14 Error bars are one standard error of the mean. (D) Expression fold changes relative to wild type 15 of the genes PFK1, ENO2, TPI1, FBA1, GPM1, and TDH3 in yeast strains with varying levels of 16 TDH3 expression due to mutations in the native TDH3 promoter, as estimated by RNA-17 sequencing data. Error bars are one standard error of the mean. (E) Expression fold changes 18 relative to wild type of the genes PFK1, ENO2, TPI1, FBA1, GPM1 and TDH3, colored as in D, 19 in 9 yeast strains with varying levels of TDH3 expression due to mutations in the genes

- 1 encoding RAP1 or GCR1, as estimated by RNA-sequencing data. Error bars are one standard
- 2 error of the mean.
- 3

4 Figure 5



5

6 Figure 5: Model for active compensation by feedback and shared regulation

7 (A) In a wild-type cell, the Gcr1p and Rap1p complex regulate expression levels of *TDH2* and *3*,

- 8 and Rap1p regulates expression of *TDH1*. (B) When the native promoter of *TDH3* is mutated,
- 9 TDH3 levels decrease, leading to an upregulation of TDH2 and an intact TDH3 promoter driving
- 10 YFP via Gcr1p and Rap1p, and TDH1 via Rap1p. (C) When Gcr1p is mutated, levels of all its
- 11 direct targets are reduced. Lower levels of *TDH3* lead to an upregulation of *TDH1* via Rap1p.
- 12 (D) When Rap1p is mutated, levels of all its direct targets are reduced. Despite lower levels of
- 13 *TDH3* expression, the paralogs are not upregulated due to lack of functional Rap1p.
- 14

15 References

- 16
- Bradley PH, Gibney PA, Botstein D, Troyanskaya OG, Rabinowitz JD. 2019. Minor Isozymes
 Tailor Yeast Metabolism to Carbon Availability. *mSystems* [Internet] 4. Available from:
 http://dx.doi.org/10.1128/mSystems.00170-18
- Branco P, Francisco D, Chambon C, Hébraud M, Arneborg N, Almeida MG, Caldeira J,
 Albergaria H. 2014. Identification of novel GAPDH-derived antimicrobial peptides
 secreted by Saccharomyces cerevisiae and involved in wine microbial interactions. *Appl. Microbiol. Biotechnol.* 98:843–853.
- Chauhan AS, Kumar M, Chaudhary S, Patidar A, Dhiman A, Sheokand N, Malhotra H, Raje CI,
 Raje M. 2017. Moonlighting glycolytic protein glyceraldehyde-3-phosphate
 dehydrogenase (GAPDH): an evolutionarily conserved plasminogen receptor on
 mammalian cells. *FASEB J.* 31:2638–2648.

1 Costanzo M, Baryshnikova A, Bellay J, Kim Y, Spear ED, Sevier CS, Ding H, Koh JLY, Toufighi 2 K, Mostafavi S, et al. 2010. The Genetic Landscape of a Cell. Science 327. 3 Dean EJ, Davis JC, Davis RW, Petrov DA. 2008. Pervasive and persistent redundancy among 4 duplicated genes in yeast. PLoS Genet. 4:e1000113. 5 Delgado ML, O'Connor JE, Azorı N I, Renau-Pigueras J, Gil ML, Gozalbo D. 2001. The 6 glyceraldehyde-3-phosphate dehydrogenase polypeptides encoded by the 7 Saccharomyces cerevisiae TDH1, TDH2 and TDH3 genes are also cell wall proteins. 8 *Microbiology* 147:411–417. 9 DeLuna A, Springer M, Kirschner MW, Kishony R. 2010. Need-based up-regulation of protein 10 levels in response to deletion of their duplicate genes. PLoS Biol. 8:e1000347. 11 DeLuna A, Vetsigian K, Shoresh N, Hegreness M, Colón-González M, Chao S, Kishony R. 12 2008. Exposing the fitness contribution of duplicated genes. Nat. Genet. 40:676–681. 13 Denby CM, Im JH, Yu RC, Pesce CG, Brem RB. 2012. Negative feedback confers mutational 14 robustness in veast transcription factor regulation. Proc. Natl. Acad. Sci. U. S. A. 15 109:3874-3878. 16 Diss G, Ascencio D, DeLuna A, Landry CR. 2014. Molecular mechanisms of paralogous 17 compensation and the robustness of cellular networks. J. Exp. Zool. B Mol. Dev. Evol. 18 322:488-499. 19 Dohn TE, Cripps RM. 2018. Absence of the Drosophila jump muscle actin Act79B is 20 compensated by up-regulation of Act88F. Dev. Dyn. 247:642-649. 21 Dong OX, Tong M, Bonardi V, El Kasmi F, Woloshen V, Wünsch LK, Dangl JL, Li X. 2016. TNL-22 mediated immunity in Arabidopsis requires complex regulation of the redundant ADR1 23 gene family. New Phytol. 210:960-973. 24 Duveau F, Toubiana W, Wittkopp PJ. 2017. Fitness Effects of Cis-Regulatory Variants in the 25 Saccharomyces cerevisiae TDH3 Promoter. Mol. Biol. Evol. 34:2908-2912. 26 Duveau F, Vande Zande P, Metzger BP, Diaz CJ, Walker EA, Tryban S, Siddig MA, Yang B, 27 Wittkopp PJ. 2021. Mutational sources of trans-regulatory variation affecting gene 28 expression in Saccharomyces cerevisiae. *Elife* [Internet] 10. Available from: 29 http://dx.doi.org/10.7554/eLife.67806 30 Engel SR, Dietrich FS, Fisk DG, Binkley G, Balakrishnan R, Costanzo MC, Dwight SS, Hitz BC, 31 Karra K, Nash RS, et al. 2014. The reference genome sequence of Saccharomyces 32 cerevisiae: then and now. G3 4:389–398. 33 Espinosa-Cantú A, Ascencio D, Barona-Gómez F, DeLuna A. 2015. Gene duplication and the 34 evolution of moonlighting proteins. Front. Genet. 6:227. 35 Félix M-A, Barkoulas M. 2015. Pervasive robustness in biological systems. Nat. Rev. Genet. 36 16:483-496. 37 Giaever G. Chu AM. Ni L. Connelly C. Riles L. Véronneau S. Dow S. Lucau-Danila A. Anderson 38 K, André B, et al. 2002. Functional profiling of the Saccharomyces cerevisiae genome. 39 Nature 418:387-391.

- Gibson G, Lacek KA. 2020. Canalization and Robustness in Human Genetics and Disease.
 Annu. Rev. Genet. 54:189–211.
- Gu Z, Steinmetz LM, Gu X, Scharfe C, Davis RW, Li W-H. 2003. Role of duplicate genes in genetic robustness against null mutations. *Nature* 421:63–66.
- Hahn S, Young ET. 2011. Transcriptional regulation in Saccharomyces cerevisiae: transcription
 factor regulation and function, mechanisms of initiation, and roles of activators and
 coactivators. *Genetics* 189:705–736.
- 8 Hanada K, Kuromori T, Myouga F, Toyoda T, Li W-H, Shinozaki K. 2009. Evolutionary
 9 persistence of functional compensation by duplicate genes in Arabidopsis. *Genome Biol.* 10 *Evol.* 1:409–414.
- Harrison R, Papp B, Pál C, Oliver SG, Delneri D. 2007. Plasticity of genetic interactions in metabolic networks of yeast. *Proc. Natl. Acad. Sci. U. S. A.* 104:2307–2312.
- He X, Zhang J. 2006. Transcriptional reprogramming and backup between duplicate genes: is it
 a genomewide phenomenon? *Genetics* 172:1363–1367.
- Holland JP, Holland MJ. 1980. Structural comparison of two nontandemly repeated yeast
 glyceraldehyde-3-phosphate dehydrogenase genes. *J. Biol. Chem.* 255:2596–2605.
- Holland JP, Labieniec L, Swimmer C, Holland MJ. 1983. Homologous nucleotide sequences at
 the 5' termini of messenger RNAs synthesized from the yeast enolase and
 glyceraldehyde-3-phosphate dehydrogenase gene families. The primary structure of a
 third yeast glyceraldehyde-3-phosphate dehydrogenase gene. *J. Biol. Chem.* 258:5291–
 5299.
- Hossain MA, Claggett JM, Edwards SR, Shi A, Pennebaker SL, Cheng MY, Hasty J, Johnson
 TL. 2016. Posttranscriptional Regulation of Gcr1 Expression and Activity Is Crucial for
 Metabolic Adjustment in Response to Glucose Availability. *Mol. Cell* 62:346–358.
- Hu Z, Killion PJ, Iyer VR. 2007. Genetic reconstruction of a functional transcriptional regulatory
 network. *Nat. Genet.* 39:683–687.
- Huie MA, Scott EW, Drazinic CM, Lopez MC, Hornstra IK, Yang TP, Baker HV. 1992.
 Characterization of the DNA-binding activity of GCR1: in vivo evidence for two GCR1binding sites in the upstream activating sequence of TPI of Saccharomyces cerevisiae. *Mol. Cell. Biol.* 12:2690–2700.
- Ihmels J, Collins SR, Schuldiner M, Krogan NJ, Weissman JS. 2007. Backup without
 redundancy: genetic interactions reveal the cost of duplicate gene loss. *Mol. Syst. Biol.* 3:86.
- Kafri R, Bar-Even A, Pilpel Y. 2005. Transcription control reprogramming in genetic backup
 circuits. *Nat. Genet.* 37:295–299.
- Kafri R, Dahan O, Levy J, Pilpel Y. 2008. Preferential protection of protein interaction network
 hubs in yeast: evolved functionality of genetic redundancy. *Proc. Natl. Acad. Sci. U. S.* A. 105:1243–1248.
- 39 Kafri R, Levy M, Pilpel Y. 2006. The regulatory utilization of genetic redundancy through

- 1 responsive backup circuits. *Proc. Natl. Acad. Sci. U. S. A.* 103:11653–11658.
- Kovács K, Farkas Z, Bajić D, Kalapis D, Daraba A, Almási K, Kintses B, Bódi Z, Notebaart RA,
 Poyatos JF, et al. 2021. Suboptimal Global Transcriptional Response Increases the
 Harmful Effects of Loss-of-Function Mutations. *Mol. Biol. Evol.* 38:1137–1150.
- Kuzmin E, Taylor JS, Boone C. 2022. Retention of duplicated genes in evolution. *Trends Genet.* 38:59–72.
- Kuzmin E, VanderSluis B, Nguyen Ba AN, Wang W, Koch EN, Usaj M, Khmelinskii A, Usaj MM,
 van Leeuwen J, Kraus O, et al. 2020. Exploring whole-genome duplicate gene retention
 with complex genetic interaction analysis. *Science* [Internet] 368. Available from:
 http://dx.doi.org/10.1126/science.aaz5667
- Li J, Yuan Z, Zhang Z. 2010. The cellular robustness by genetic redundancy in budding yeast.
 PLoS Genet. 6:e1001187.
- Lickwar CR, Mueller F, Hanlon SE, McNally JG, Lieb JD. 2012. Genome-wide protein-DNA
 binding dynamics suggest a molecular clutch for transcription factor function. *Nature* 484:251–255.
- Linck A, Vu X-K, Essl C, Hiesl C, Boles E, Oreb M. 2014. On the role of GAPDH isoenzymes
 during pentose fermentation in engineered Saccharomyces cerevisiae. *FEMS Yeast Res.* 14:389–398.
- Love MI, Huber W, Anders S. 2014. Moderated estimation of fold change and dispersion for
 RNA-seq data with DESeq2. *Genome Biol.* 15:550.
- MacIsaac KD, Wang T, Gordon DB, Gifford DK, Stormo GD, Fraenkel E. 2006. An improved
 map of conserved regulatory sites for Saccharomyces cerevisiae. *BMC Bioinformatics* 7:113.
- McAlister L, Holland MJ. 1985a. Differential expression of the three yeast glyceraldehyde-3phosphate dehydrogenase genes. *J. Biol. Chem.* 260:15019–15027.
- McAlister L, Holland MJ. 1985b. Isolation and characterization of yeast strains carrying
 mutations in the glyceraldehyde-3-phosphate dehydrogenase genes. *J. Biol. Chem.* 260:15013–15018.
- Nimchuk ZL, Zhou Y, Tarr PT, Peterson BA, Meyerowitz EM. 2015. Plant stem cell maintenance
 by transcriptional cross-regulation of related receptor kinases. *Development* 142:1043–
 1049.
- Ohya Y, Sese J, Yukawa M, Sano F, Nakatani Y, Saito TL, Saka A, Fukuda T, Ishihara S, Oka
 S, et al. 2005. High-dimensional and large-scale phenotyping of yeast mutants. *Proc. Natl. Acad. Sci. U. S. A.* 102:19015–19020.
- Piña B, Fernández-Larrea J, García-Reyero N, Idrissi F-Z. 2003. The different (sur)faces of
 Rap1p. *Mol. Genet. Genomics* 268:791–798.

Ringel AE, Ryznar R, Picariello H, Huang K-L, Lazarus AG, Holmes SG. 2013. Yeast Tdh3
 (Glyceraldehyde 3-Phosphate Dehydrogenase) Is a Sir2-Interacting Factor That
 Regulates Transcriptional Silencing and rDNA Recombination.Pikaard CS, editor. *PLoS*

- 1 *Genet.* 9:e1003871.
- Rodriguez-Leal D, Xu C, Kwon C-T, Soyars C, Demesa-Arevalo E, Man J, Liu L, Lemmon ZH,
 Jones DS, Van Eck J, et al. 2019. Evolution of buffering in a genetic circuit controlling
 plant stem cell proliferation. *Nat. Genet.* 51:786–792.
- Rudnicki MA, Braun T, Hinuma S, Jaenisch R. 1992. Inactivation of MyoD in mice leads to up regulation of the myogenic HLH gene Myf-5 and results in apparently normal muscle
 development. *Cell* 71:383–390.
- 8 Shen X, De Jonge J, Forsberg SKG, Pettersson ME, Sheng Z, Hennig L, Carlborg Ö. 2014.
 9 Natural CMT2 variation is associated with genome-wide methylation changes and
 10 temperature seasonality. *PLoS Genet.* 10:e1004842.
- 11 Shore D. 1994. RAP1: A protean regulator in yeast. *Trends Genet.* 10:408–412.
- 12 Singh N, Bhalla N. 2020. Moonlighting Proteins. *Annu. Rev. Genet.* 54:265–285.
- Sussel L, Shore D. 1991. Separation of transcriptional activation and silencing functions of the
 RAP1-encoded repressor/activator protein 1: isolation of viable mutants affecting both
 silencing and telomere length. *Proc. Natl. Acad. Sci. U. S. A.* 88:7749–7753.
- Tischler J, Lehner B, Chen N, Fraser AG. 2006. Combinatorial RNA interference in
 Caenorhabditis elegans reveals that redundancy between gene duplicates can be
 maintained for more than 80 million years of evolution. *Genome Biol.* 7:R69.
- Uemura H, Koshio M, Inoue Y, Lopez MC, Baker HV. 1997. The role of Gcr1p in the transcriptional activation of glycolytic genes in yeast Saccharomyces cerevisiae.
 Genetics 147:521–532.
- Vande Zande P, Hill MS, Wittkopp PJ. 2022. Pleiotropic effects of trans-regulatory mutations on
 fitness and gene expression. *Science* 377:105–109.
- VanderSluis B, Bellay J, Musso G, Costanzo M, Papp B, Vizeacoumar FJ, Baryshnikova A,
 Andrews B, Boone C, Myers CL. 2010. Genetic interactions reveal the evolutionary
 trajectories of duplicate genes. *Mol. Syst. Biol.* 6:429.
- Venters BJ, Wachi S, Mavrich TN, Andersen BE, Jena P, Sinnamon AJ, Jain P, Rolleri NS,
 Jiang C, Hemeryck-Walsh C, et al. 2011. A comprehensive genomic binding map of
 gene and chromatin regulatory proteins in Saccharomyces. *Mol. Cell* 41:480–492.
- Wagner A. 2000. Robustness against mutations in genetic networks of yeast. *Nat. Genet.* 24:355–361.
- Yagi S, Yagi K, Fukuoka J, Suzuki M. 1994. The UAS of the yeast GAPDH promoter consists of
 multiple general functional elements including RAP1 and GRF2 binding sites. *J. Vet. Med. Sci.* 56:235–244.