

Research Article

Quantitative genome-wide analysis of yeast deletion strain sensitivities to oxidative and chemical stress

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Abstract

Understanding the actions of drugs and toxins in a cell is of critical importance to medicine, yet many of the molecular events involved in chemical resistance are relatively uncharacterized. In order to identify the cellular processes and pathways targeted by chemicals, we took advantage of the haploid *Saccharomyces cerevisiae* deletion strains (Winzeler *et al.*, 1999). Although ~4800 of the strains are viable, the loss of a gene in a pathway affected by a drug can lead to a synthetic lethal effect in which the combination of a deletion and a normally sublethal dose of a chemical results in loss of viability. We carried out genome-wide screens to determine quantitative sensitivities of the deletion set to four chemicals: hydrogen peroxide, menadione, ibuprofen and mefloquine. Hydrogen peroxide and menadione induce oxidative stress in the cell, whereas ibuprofen and mefloquine are toxic to yeast by unknown mechanisms. Here we report the sensitivities of 659 deletion strains that are sensitive to one or more of these four compounds, including 163 multichemical-sensitive strains, 394 strains specific to hydrogen peroxide and/or menadione, 47 specific to ibuprofen and 55 specific to mefloquine. We correlate these results with data from other large-scale studies to yield novel insights into cellular function. Copyright © 2004 John Wiley & Sons, Ltd.

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1 Introduction

2
3 The yeast deletion strains, generated by the *Sac-*
4 *charomyces* Genome Deletion Project (Winzeler
5 *et al.*, 1999), are an ordered set of yeast strains in
6 which each open reading frame has been systemati-
7 cally replaced with a kanamycin cassette. Screening
8 these strains for sensitivity to chemical compounds
9 can uncover synthetic lethal effects, in which the
10 combination of a compound and a deletion leads
11 to lethality. Deletion sets were previously screened
12 for sensitivity to compounds including rapamycin,
13 mycophenolic acid, the proteasome inhibitor PS-
14 341, nystatin, methyl methanesulphonate (MMS),
15 wortmannin, amaridione and gentamycin (Chan
16 *et al.*, 2000; Desmoucelles *et al.*, 2002; Fleming

17 *et al.*, 2002; Giaever *et al.*, 2002; Chang *et al.*,
18 2002; Hanway *et al.*, 2002; Zewail *et al.*, 2003;
19 SenGupta *et al.*, 2003; Blackburn and Avery,
20 2003). Although these studies uncovered novel
21 genes, they had several limitations. Sensitivities
22 were generally determined for only a single com-
23 pound or class, such that strains with sensitivity
24 to unrelated chemicals could not be distinguished
25 from strains with specific sensitivity to a single
26 class of compounds. Often sensitivities were mea-
27 sured on solid plates (typically scored as no growth,
28 poor growth, normal growth), allowing the identi-
29 fication of only 30–100 strains. This focus on the
30 most sensitive strains misses processes that may
31 be more subtly affected by a chemical, which may
32 be ultimately more revealing. These qualitative

1 data were also not easily comparable with other
2 genomic data. The use of microarrays that detect
3 20-mer identifiers that have been PCR-amplified
4 from competitive growth assays of pooled strains
5 generated quantitative data (Fleming *et al.*, 2002;
6 Giaever *et al.*, 2002) but is costly and involves
7 indirect measurements that substitute for growth
8 assays.

9 With these issues in mind, we carried out quan-
10 titative screens of the haploid *MAT α* deletion set
11 in liquid cultures, so as to identify strains with
12 modest but reproducible sensitivity. In addition,
13 we screened with multiple diverse chemicals to
14 compare and contrast the cellular processes tar-
15 geted. We used two compounds, hydrogen per-
16 oxide and menadione, that are of a similar class
17 and have well-characterized targets in both yeast
18 and mammals. These compounds are of special
19 interest as they induce oxidative stress in the cell,
20 which is associated with a range of human dis-
21 eases. Subsets of deletion strains have previously
22 been screened with oxidants (Higgins *et al.*, 2001;
23 Begley *et al.*, 2002) but a genome-wide screen has
24 not been reported. We also screened with ibuprofen,
25 a compound that has known targets in humans, the
26 cyclooxygenase proteins, but not in yeast, which
27 lack these proteins. The fourth compound we used
28 was mefloquine, an antimalarial agent that is toxic
29 to yeast and has an unknown antimalarial mecha-
30 nism of action.

31 **Materials and methods**

32 **Reagents and strains**

33 Haploid yeast deletion strains BY4742 (*MAT α* ;
34 *his3 Δ 1*; *leu2 Δ 0*; *lys2 Δ 0*; *ura3 Δ 0*) generated
35 by the *Saccharomyces* Genome Deletion Project
36 ([http://www-sequence.stanford.edu/group/yeast-
37 deletion-project/deletions3.html](http://www-sequence.stanford.edu/group/yeast-deletion-project/deletions3.html)) were obtained
38 from Research Genetics (Huntsville, AL). Meflo-
39 quine was a gift from Dr William Ellis at the Walter
40 Reed Army Institute of Research. All other chem-
41 icals were from Sigma.

42 **Screening**

43 Titrations were initially carried out in the BY4742
44 parent strain to identify a concentration of chemical
45 causing ~80–95% of control growth after 20 h.
46 These concentrations, equivalent to 2 mM H₂O₂,

47 67 μ M menadione, 50 μ M ibuprofen or 235 μ M
48 mefloquine, were then used for assays.

49 Strains were grown individually overnight at
50 30 °C in YEPD in 96-well plates. Plates were vor-
51 texed, then strains were pinned in duplicate using a
52 Biomek 2000 robot (Beckman) into 96-well plates
53 containing complete-synthetic media with no added
54 chemical, followed by plates containing a specific
55 chemical. Plates were briefly vortexed, then incu-
56 bated at 30 °C for approximately 20 h. Growths
57 were determined by measurement of OD₆₀₀ of non-
58 agitated 96-well plates using a Wallac Victor plate
59 reader.

60 **Growth calculations**

61 Growth ratios were calculated by dividing the
62 OD₆₀₀ measurement of untreated strains by the
63 measurement of the duplicate chemical-treated
64 strains. An arbitrary constant (the background
65 OD₆₀₀ of 0.033) was included in measurements, so
66 as to avoid the presence of a zero denominator for
67 strains with no growth in the presence of chemi-
68 cals. Each growth ratio was divided by the median
69 growth ratio of each plate to adjust for plate-to-
70 plate variation in chemical concentration. Ratios for
71 very poor-growing strains (OD₆₀₀ < 0.1 for both
72 chemical and untreated plates) were not calculated.
73 Strains with median growth ratios from at least 3
74 assays of 1.5 or greater (or 2 assays for hydro-
75 gen peroxide screens) were rearranged into new 96-
76 well plates and at least three additional screens
77 with each chemical were carried out. Summary
78 growth ratios reported for sensitive strains (Sup-
79 plemental Table 2) are equal to the median growth
80 ratios from between 3–9 independent experiments.
81 Strains with a median ratio < 1.5 after the first set of
82 screens did not undergo rescreening. Slow-growing
83 strains are those that have an average growth in the
84 absence of chemical that is greater than 2 standard
85 deviations from the median growth of all strains.
86 These are indicated as ‘slow-growers’ in Supple-
87 mental Table 2.

88 **Data Sets**

89 Raw data can be downloaded at: [http://depts.
90 washington.edu/sfields/deletion/index.html](http://depts.washington.edu/sfields/deletion/index.html).

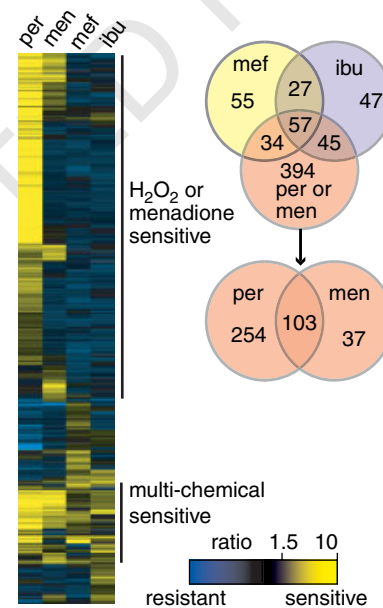
1 Results and discussion

2 Experimental design

3 We first assayed growth of the parent strain to
 4 determine a concentration of each chemical that
 5 resulted in 80–95% cell survival after ~20 h. We
 6 then assayed growth of each deletion strain in the
 7 presence or absence of each compound using these
 8 concentrations. Ratios were calculated that repre-
 9 sent the growth of each strain untreated divided
 10 by growth of the strain treated with chemical,
 11 such that a higher ratio indicates greater sensitiv-
 12 ity. Slow-growing strains tended to yield higher
 13 ratios, both because relatively smaller differences
 14 in growth have a greater significance in a ratio, and
 15 because these already compromised strains may
 16 have difficulty dealing with additional chemical
 17 stress. Indeed, ~88% of the 200 poorest-growing
 18 strains had a ratio of >1.5 for at least one chemical,
 19 and ~37% of the 200 had previously been identi-
 20 fied as chemical-, radiation- or UV-sensitive (Chan
 21 *et al.*, 2000; Desmoucelles *et al.*, 2002; Fleming
 22 *et al.*, 2002; Giaever *et al.*, 2002; Chang *et al.*,
 23 2002; Hanway *et al.*, 2002; Bennett *et al.*, 2001).
 24 Notably, we saw a strong correlation with slow-
 25 growing strains and strains that were sensitive to
 26 oxidative stress, with ~80% of the 200 poorest
 27 growing strains sensitive to H₂O₂ and/or mena-
 28 dione (data not shown). This result may reflect
 29 the relationship between peroxide sensitivity and
 30 the growth state of the strains, as exponentially-
 31 growing cells are more sensitive than stationary-
 32 phase cells (Jamieson, 1992).

33 When the strains were ordered by chromosomal
 34 position of the deleted gene, we observed that
 35 some adjacent strains (~75 pairs) showed similar
 36 chemical sensitivities. Of these, 30 pairs consisted
 37 of one strain with a deletion in a hypothetical
 38 open reading frame (ORF) that was considered
 39 unlikely by synteny analysis (Kellis *et al.*, 2003)
 40 and that overlapped or was adjacent to a known
 41 or likely ORF. The chemical sensitivity due to
 42 deletion of the hypothetical ORF can most likely
 43 be attributed to full or partial deletion of the known
 44 ORF or its regulatory region, and so these strains
 45 with unlikely ORFs were eliminated from the
 46 dataset (Supplemental Table 1a). An additional 16
 47 strains (Supplemental Table 1b) also had deletions
 48 in unlikely ORFs (Kellis *et al.*, 2003) but were not
 49 removed, as they did not have a neighboring strain
 50 with a similar sensitivity pattern.
 51

52 659 strains (Supplemental Table 2) showed sensi-
 53 tivity to at least one chemical, as indicated by
 54 a median growth ratio of >1.5 (Figure 1). 163
 55 strains showed sensitivity to at least two chemi-
 56 cals, excluding those sensitive only to H₂O₂ and
 57 menadione. These multichemical-sensitive (MCS)
 58 strains fell into several classes, and included dele-
 59 tions in chromatin, transcription, cell structure and
 60 vacuolar functions. Additional strains will likely be
 61 characterized as MCS upon screening with other
 62 chemicals. When we compared the 659 sensitive
 63 strains with other annotated deletion phenotypes,
 64 we observed that ~200 overlap with strains previ-
 65 ously characterized as having a growth defect with
 66 chemicals (Chan *et al.*, 2000; Desmoucelles *et al.*,
 67 2002; Fleming *et al.*, 2002; Giaever *et al.*, 2002;
 68 Chang *et al.*, 2002), or radiation (Bennett *et al.*,
 69 2001) or on a particular medium (Giaever *et al.*,
 70 2002; Steinmetz *et al.*, 2002) (Figure 2). Much of
 71 the overlap is due to H₂O₂-sensitive strains that
 72 have a growth defect on non-fermentable carbon
 73 sources (Steinmetz *et al.*, 2002).
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95 **Figure 1.** Chemical-sensitive deletion strains. Hierarchi-
 96 cal clustering of 659 chemical-sensitive strains with growth
 97 ratios >1.5 shown in yellow. Columns show sensitivity
 98 to hydrogen peroxide (per), menadione (men), meflo-
 99 quine (mef) and ibuprofen (ibu). Strains were hierarchi-
 100 cally clustered using Cluster and visualized using Tree-
 101 View (<http://rana.lbl.gov/EisenSoftware.htm>). Venn
 102 diagrams of sensitive strains show specific sensitivity to
 each chemical

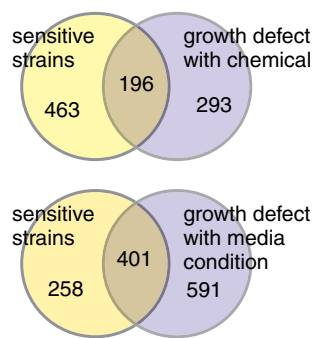


Figure 2. Correlation with other deletion strain studies. The first Venn diagram shows correlation of our sensitive strains (yellow circle) with screens with nystatin (Giaever *et al.*, 2002), MMS (Chang *et al.*, 2002), PS-341 (Fleming *et al.*, 2002), MPA (Desmoucelles *et al.*, 2002), rapamycin (Chan *et al.*, 2000) or γ -irradiation (Bennett *et al.*, 2001) (purple circle). The second diagram shows correlation with strains showing growth defects on fermentable or non-fermentable carbon sources, in complete-synthetic media, at pH 8, in 1 M NaCl, or in various drop-out media (Giaever *et al.*, 2002; Steinmetz *et al.*, 2002) (purple)

1 Strains with sensitivity to oxidative stress

2 Cells are exposed to reactive oxygen species (ROS)
3 by free radical-generating compounds and as a normal
4 by-product of aerobic respiration, which gener-
5 ates ROS in the mitochondria. Without neutraliza-
6 tion, these ROS can extensively damage proteins,
7 lipids and nucleic acids. To prevent this, aerobic
8 organisms have evolved extensive primary and
9 secondary defences, including antioxidant enzymes
10 that neutralize ROS and mechanisms for repairing
11 DNA and eliminating damaged molecules.

12 We identified 394 strains, upon removal of MCS
13 strains, that were significantly sensitive to the oxi-
14 dants H₂O₂ or menadione (Figure 3). Although
15 both H₂O₂ and menadione generate ROS, they
16 act differently: H₂O₂ can be reduced by met-
17 als via the Fenton reaction to form hydroxyl
18 radicals, whereas menadione can form superox-
19 ide, H₂O₂ and semiquinone radicals. The different
20 effects of these breakdown products are reflected
21 by the sensitivity profiles, with 103 strains sen-
22 sitive to both oxidants, 254 specific to H₂O₂
23 and 37 to menadione. The *ctr1*, *lys7* and *sod1*
24 strains were extremely sensitive to menadione, a
25 superoxide generator, but not to H₂O₂ (Figure 3).
26 *Ctr1*, a plasma-membrane copper transporter, trans-
27 ports copper to *Lys7*, which shuttles copper to the
28 Cu/Zn superoxide dismutase, *Sod1*, which neutral-
29 izes highly reactive superoxide ions.

52 Many strains deficient in known genes involved
53 in protection from oxidative stress were sensitive
54 to H₂O₂ and/or menadione. The strains deleted
55 for *SKN7* and *YAP1*, encoding transcription factors
56 that initiate a global response to oxidative
57 stress, were two of the most sensitive to H₂O₂.
58 Strains deficient in antioxidant functions, including
59 thioredoxin peroxidase (*tsal*), glutathione perox-
60 idase (*hyr1*), glutaredoxin (*grx5*), cytochrome C
61 peroxidase (*ccp1*) and thioredoxin II (*trx2*), were
62 also sensitive to H₂O₂ and/or menadione. Both
63 the glutathione and thioredoxin antioxidant path-
64 ways require NADPH, generated by the pentose
65 phosphate pathway, for their reducing power. Dele-
66 tions affecting enzymes of this pathway, including
67 ribulose-phosphate 3-epimerase (*Rpe1*), glucose-
68 6-phosphate 1-dehydrogenase (*Zwf1*) and trans-
69 ketolase (*Tkl1*), have been observed to be sen-
70 sitive to H₂O₂ (Juhnke *et al.*, 1996) and were
71 strongly sensitive to oxidants in our screens.
72 Thirteen oxidant-sensitive strains contain deletions
73 in DNA repair genes, including those encoding
74 the apurinic/apyrimidinic (AP) endonuclease *APN2*
75 and the DNA glycosylase/AP lyase *NTG1*, and
76 genes involved in the *RAD52* pathway of double-
77 strand break repair (*RAD52*, *RAD50*, *MRE11* and
78 *XRS2*).

79 The largest group of strains with specific sensi-
80 tivity to H₂O₂ contains deletions in genes for
81 mitochondrial functions, including protein synthe-
82 sis, respiration and mitochondrial genome mainte-
83 nance. Although the mitochondria generate most
84 of the endogenous ROS in the cell through the
85 electron transport chain, loss of mitochondrial func-
86 tion is associated with sensitivity to oxidative stress
87 (Grant *et al.*, 1997). It has been speculated that a
88 process for neutralizing ROS or repairing oxidative
89 damage exists that requires energy generated by the
90 mitochondria (Grant *et al.*, 1997).

91 Seventy-seven strains sensitive to H₂O₂ or men-
92 adione contained a deletion in an uncharacter-
93 ized gene, as annotated in the *Saccharomyces*
94 Genome Database. The 21 strains most sensitive
95 to H₂O₂ included nine with deletions in genes
96 for uncharacterized proteins at the time we ini-
97 tially analysed the data. Recently, two of these nine
98 were characterized with important roles in medi-
99 ating oxidative stress responses: YBR216C (YBP1),
100 which interacts with Yap1 and is required for the
101 oxidative stress response to peroxides (Veal *et al.*,
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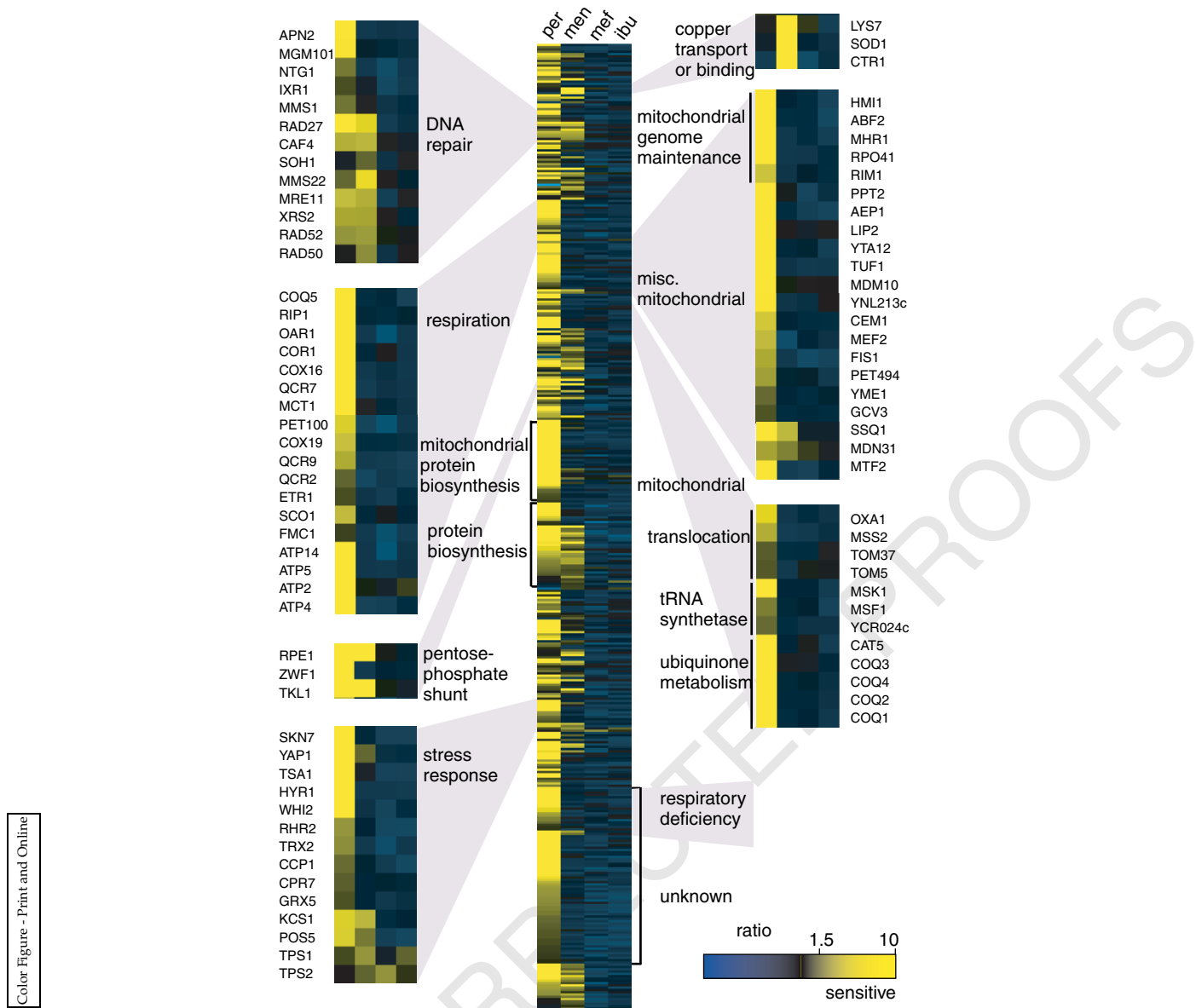


Figure 3. Strains sensitive to H₂O₂ and/or menadione. Strains were hierarchically clustered using Cluster, then grouped according to process and visualized using TreeView. Sensitive strains with a ratio > 1.5 are indicated in yellow. Columns represent H₂O₂ (per), menadione (men), mefloquine (mef) and ibuprofen (ibu) profiles. Shown at left and right sides are expanded views of profiles, organized by functional category

1 2003), and YKL086W (Srx1), a novel sulphire- 9
 2 doxin (Biteau *et al.*, 2003). Another of the nine 10
 3 proteins (YPR116W) is localized to the mitochon- 11
 4 dria (Kumar *et al.*, 2002), two (YDL091C, Rtn2) 12
 5 have their genes transcriptionally upregulated in 13
 6 response to H₂O₂ (Causton *et al.*, 2001), and 14
 7 three strains (*ydr065w*, *ydl114w*, *yhr168w*) have 15
 8 respiratory deficiencies, suggesting a mitochondrial 16
 association (Steinmetz *et al.*, 2002).

Ibuprofen- and mefloquine-sensitive deletion strains

Ibuprofen, an antiinflammatory, and mefloquine, an antimalarial drug, are widely used in humans but

are toxic to yeast. Ibuprofen inhibits the cyclooxygenase proteins in humans, which are not present in yeast, while mefloquine has an unknown mechanism of action. To examine the cellular processes targeted by these compounds with unknown mechanisms of action, we screened the deletion set with ibuprofen and mefloquine and identified strains that are specifically sensitive to each drug.

In the screen with ibuprofen, we identified 176 sensitive strains. Upon removal of MCS strains, 47 strains were specifically sensitive and of these, 28 could be placed into four functional categories (Figure 4), indicating the compound targets a specific set of cellular processes. Noticeably, deletion of any of seven genes involved in biosynthesis of tryptophan resulted in strong ibuprofen sensitivity. Since addition of tryptophan to the media increases resistance of yeast to both FK506 and isofluorane (Heitman *et al.*, 1993; Palmer *et al.*, 2002), this amino acid may have a general role in chemical resistance. An additional 10 strains specifically sensitive to ibuprofen are deleted for genes encoding transporters or regulators of transporters. Three strains, *alf1*, *gim5* and *yke2*, contain deletions in genes needed for tubulin folding, suggesting a cytoskeletal association. Nine strains, including *cog1* and *cog5* of the Golgi transport complex, contain deletions in genes involved in protein

processing, transport through the ER and Golgi or vacuolar transport. Other *cog* strains showed sensitivity to ibuprofen only, but at levels below the 1.5-fold cut-off, including *cog6* (ratio 1.42) and *cog7* (ratio 1.4). Studies on *Candida albicans* suggest that ibuprofen may cause significant damage to the plasma membrane (Pina-Vaz *et al.*, 2000). Deletions in genes involved in membrane protein processing may slow repair of the plasma membrane, resulting in increased lethality.

In the mefloquine screen, we found 173 sensitive strains, with 55 specifically sensitive upon removal of MCS strains. These show no clear pattern, and include deletions in genes associated with a range of activities. The deletion for the gene *STII*, which causes mefloquine resistance when overexpressed and encodes an Hsp90 cochaperone (Delling *et al.*, 1998), was sensitive to mefloquine only. Strains deleted for genes in the MAP-kinase pathway involved in maintenance of cell integrity, including *bck1*, *slt2* and *rlm1*, showed a strong phenotype with mefloquine, but at least two of these strains are sensitive to other agents as well (Chan *et al.*, 2000; Chang *et al.*, 2002; SenGupta *et al.*, 2003; Wantanabe *et al.*, 1985).

Correlation with other genome-wide studies

Yeast analyses have generated a vast amount of information regarding protein interactions, protein localizations, gene transcription and gene deletion phenotypes. We used the program Osprey (Breitkreutz *et al.*, 2003) to combine the chemical sensitivity data with data from large-scale two-hybrid screens (Ito *et al.*, 2001; Uetz *et al.*, 2000); 82 interacting pairs were identified among the proteins corresponding to the 659 sensitive deletion strains. Of these, 38 pairs had corresponding deletion strains with similar sensitivity profiles. These included two strongly H₂O₂-sensitive strains, corresponding to the proteins YBR216C and Yap1 (Figure 5a), and five ibuprofen-sensitive strains, including three with deletions in genes with unknown functions (Figure 5b). The phenotype data and association of YBR216C with Yap1, the oxidative stress-induced transcription factor, strongly implicated YBR216C as a novel component of the oxidative stress response, and this protein has recently been characterized with a role in the hydrogen peroxide response pathway (Veal *et al.*, 2003).

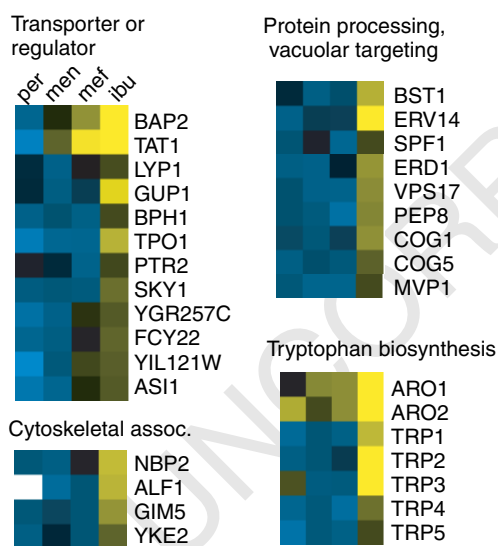


Figure 4. Ibuprofen-sensitive strains; 28 strains specifically sensitive to ibuprofen, as well as four additional strains with multiple chemical sensitivities and strong ibuprofen-sensitive phenotypes, are shown

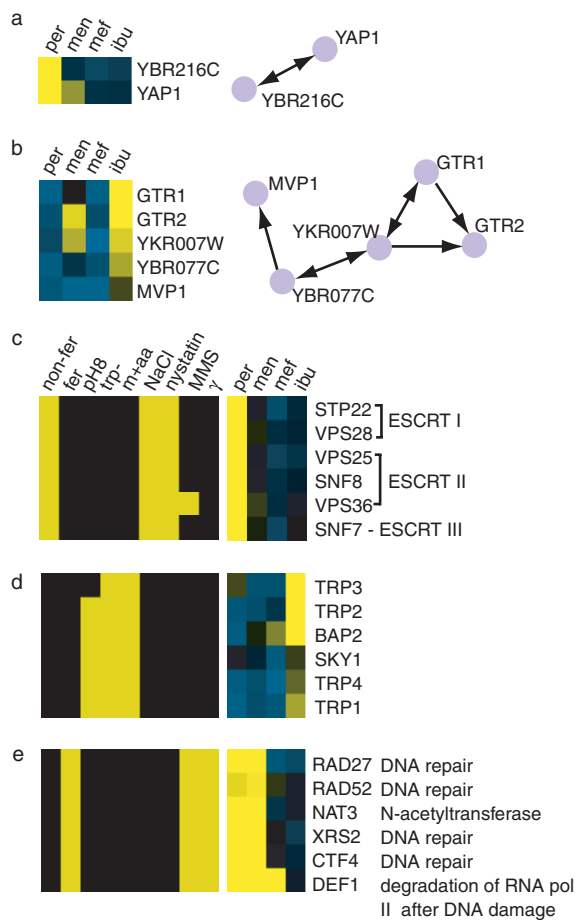


Figure 5. Correlation with genome-wide data. (a) Profiles of *yap1* and *ybr216c* deletion strains, with two-hybrid interaction map of corresponding proteins shown. Interactions were identified using Osprey (<http://biodata.mshri.on.ca:80/osprey/servlet/Index>). (b) *Gtr1/Gtr2* cluster. Profiles of deletion strains are shown next to interaction map. (c–e) Three clusters of deletion strains with similar phenotypes. Headings indicate experiments testing for growth defect on non-fermentable (non-fer) or fermentable carbon source (fer) (Steinmetz *et al.*, 2002); media of pH 8 (pH8), tryptophan drop-out media (*trp*⁻), minimal medium supplemented with histidine, leucine, uracil (m + aa), 1 M NaCl (NaCl), nystatin (Giaever *et al.*, 2002), methyl methanesulphonate (MMS) (Chang *et al.*, 2002) or γ -irradiation (γ) (Bennett *et al.*, 2001). Experiments were assigned a value of '1' or '0' indicating growth defect, and hierarchically clustered with peroxide (*per*), menadione (*men*), mefloquine (*mef*) and ibuprofen (*ibu*) data using Cluster

group of strains with sensitivity to NaCl and nystatin and poor growth on non-fermentable carbon sources clustered with H₂O₂-sensitive strains (Figure 5c). These strains all have deletions affecting proteins of the ESCRT pathway, which is involved in sorting of proteins in the late endosome into multivesicular bodies for degradation (Lemmon and Traub, 2000). Another group of six strains had phenotypes that clustered with ibuprofen-sensitive strains (Figure 5d). Four of the six encode proteins involved in tryptophan biosynthesis, one (*Bap2*) is an amino acid permease, and the last (*Sky1*) is a protein kinase. Based on these associations, *Sky1* may function in regulating amino acid uptake. Six other strains (Figure 5e) had phenotypes that clustered with strains sensitive to both H₂O₂ and menadione. Of these, five encode proteins involved in response to DNA damage.

Concluding remarks

The generation of a quantitative set of chemical sensitivity profiles for the *MAT α* yeast deletion collection allows us to categorize genes with similar deletion phenotypes into functional groups on a level not possible with qualitative measurements. By combining quantitative measurements with multiple repetitions (typically six screens for each chemical), we were able to identify subtle but reproducible growth defects. The raw data can be reanalysed, e.g. using cut-offs other than the 1.5 ratio used in this analysis, or using a difference measurement rather than a ratio, which would remove slow-growing strains.

Our screens were carried out in the BY4742 *MAT α* set of deletion strains. Analysis of the BY4743 diploid deletion strains has indicated widespread (~8%) aneuploidy (Hughes *et al.*, 2000), and small mutations are also likely to be present throughout the strains. Additionally, we have found differences between the BY4742 *MAT α* strains and the BY4741 *MAT α* strains (unpublished data). As we screened only haploid strains, we were able to characterize only ~4800 strains out of over 6000. Further studies could include characterization of the essential gene deletions using the set of heterozygous diploid strains, as well as screening of the *MAT α* strains.

1 We used hierarchical clustering to compare our
2 deletion profiles with annotated deletion pheno-
3 types (Giaever *et al.*, 2002; Chang *et al.*, 2002;
4 Bennett *et al.*, 2001; Steinmetz *et al.*, 2002). One

1 By correlating our data from multiple chemical
2 screens, we are able to better understand the
3 specific functions perturbed by each chemical (such
4 as DNA damage with oxidative stress), as well as
5 the sources of multiple chemical sensitivity. Many
6 strains we identified as MCS had been previously
7 identified in screens with other chemicals, but their
8 sensitivity had been attributed to direct effects
9 of the chemical on its target. We also correlated
10 our data with other genomic screens, such as
11 protein interaction studies, finding that, as with
12 other genome-wide data, the value of this chemical
13 sensitivity data set is enhanced greatly by its
14 correlation to results from other large- and small-
15 scale studies.

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| 1 | QUERIES TO BE ANSWERED BY AUTHOR (SEE MARGINAL MARKS) | 52 |
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| 3 | IMPORTANT NOTE: Please mark your corrections and answers to these queries | 54 |
| 4 | directly onto the proof at the relevant place. Do NOT mark your corrections on this | 55 |
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