Genome-wide search for candidate genes for yeast robustness improvement against formic acid reveals novel susceptibility (Trk1 and positive regulators) and resistance (Haa1-regulon) determinants

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Abstract

Background: Formic acid is an inhibitory compound present in lignocellulosic hydrolysates. Understanding the complex molecular mechanisms underlying Saccharomyces cerevisiae tolerance to this weak acid at the system level is instrumental to guide synthetic pathway engineering for robustness improvement of industrial strains envisaging their use in lignocellulosic biorefineries.

Results: This study was performed to identify, at a genome-wide scale, genes whose expression confers protection or susceptibility to formic acid, based on the screening of a haploid deletion mutant collection to search for these phenotypes in the presence of 60, 70 and 80 mM of this acid, at pH 4.5. This chemogenomic analysis allowed the identification of 172 determinants of tolerance and 41 determinants of susceptibility to formic acid. Clustering of genes required for maximal tolerance to this weak acid, based on their biological function, indicates an enrichment of those involved in intracellular trafficking and protein synthesis, cell wall and cytoskeleton organization, carbohydrate metabolism, lipid, amino acid and vitamin metabolism, response to stress, chromatin remodelling, transcription and internal pH homeostasis. Among these genes is HAA1 encoding the main transcriptional regulator of yeast transcriptome reprogramming in response to acetic acid and genes of the Haa1-regulon; all demonstrated determinants of acetic acid tolerance. Among the genes that when deleted lead to increased tolerance to formic acid, TRK1, encoding the high-affinity potassium transporter and a determinant of resistance to acetic acid, was surprisingly found. Consistently, genes encoding positive regulators of Trk1 activity were also identified as formic acid susceptibility determinants, while a negative regulator confers protection. At a saturating $K^+$ concentration of 20 mM, the deletion mutant trk1Δ was found to exhibit a much higher tolerance compared with the parental strain. Given that trk1Δ accumulates lower levels of radiolabelled formic acid, compared to the parental strain, it is hypothesized that Trk1 facilitates formic acid uptake into the yeast cell.

Conclusions: The list of genes resulting from this study shows a few marked differences from the list of genes conferring protection to acetic acid and provides potentially valuable information to guide improvement programmes for the development of more robust strains against formic acid.

Keywords: Formic acid tolerance, Formic acid toxicity, Chemogenomic analysis, Trk1, Haa1, Lignocellulosic hydrolysates, Yeast robustness

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Background
Formic acid (pKₐ = 3.74; octanol–water partition coefficient, LogP = −0.54 [1]) is the simplest monocarboxylic acid in nature. The worldwide production of this acid is in large part (35%) used to prevent fungal and bacterial growth in silage [2]. Formic acid is also among the inhibitors found in lignocellulosic hydrolysates, typically at concentrations around 30 mM although they are variable depending on the type of treatment used to prepare the hydrolysates [3–6]. A comprehensive understanding of the mechanisms underlying tolerance to formic acid is therefore important to guide the design of more robust industrial yeast strains able to more efficiently use lignocellulosic hydrolysates as growth medium in biorefineries [7].

The straightforward exploitation of Omic approaches combined with metabolic engineering and synthetic biology strategies in Saccharomyces cerevisiae is considered instrumental to guide the improvement of yeast strains for production of biofuels and added-value chemicals [8–14]. The application of Omic analyses to elucidate the genes and the pathways involved in yeast adaptive response and tolerance to stress induced by weak acids, as it is the case of acetic, propionic and lactic acids [18, 27], is regulated by Haa1, which is considered the main orchestrator of the reprogramming of yeast transcriptome in response to acetic acid [28]. Indeed, Haa1 regulates a large regulon including 80% of the acidic acid-stress responsive genes, including those involved in transcription (e.g., MSN4, MCM1, FKH2 and COM2), multidrug resistance (MDR) transport (e.g., TOP2, TOP3 and AQR1), cell wall remodelling (e.g., YGP1 and SPI1), nucleic acid processing (e.g., SAP30) and in lipid (e.g., YCP1 and SLR2) and carbohydrate metabolism (HRK1) [15, 28]. Considering the central role of Haa1 in yeast adaptive response and tolerance to acetic acid and other low-chain fatty acids, the manipulation of the Haa1-signalling pathway either by increasing the expression of HAA1, based on the expression of extra copies of the gene and/or the use of more efficient promoters [29–33], or by the insertion of beneficial mutations in the coding sequence [33, 34], was successfully attempted.

Formic acid was found to be co-utilized with glucose by S. cerevisiae in glucose-limited cultures (7.5 g L⁻¹) under aerobic conditions to generate NADH molecules for respiratory dissimilation [35, 36]. This weak acid is rapidly converted into CO₂ and water by formate dehydrogenases (FDH) encoded by FDH1 and FDH2 genes with NADH molecules being produced in the process, and this activity was proposed to contribute to formic acid detoxification [36–38]. In mammalian and plant cells, formate is believed to bind cytochrome c oxidase (complex VI of the electron transport chain), which catalyses the reduction of molecular oxygen to water using cytochrome c as the electron donor [39, 40]. The inhibition of this last step of the electron transport chain hampers proton gradient maintenance at physiological values and ultimately ATP synthesis [41]. In mammalian cells, this process was found to be accompanied by an increase of ROS production (i.e., superoxide anions and hydroxyl radicals) in the mitochondria, leading to the oxidative damage of proteins, lipids and DNA [42–45]. With the exception of a proteomic analysis [20], little has been done to understand the cytotoxic effects of formic acid and the response mechanisms in S. cerevisiae. This study is a first attempt to identify, in a comprehensive manner, genes involved in yeast tolerance and susceptibility to formic acid at a genome-wide scale. Among the selected determinants identified through the chemogenomic analysis performed is the Haa1 regulon, for the first time demonstrated to be required for tolerance to formic acid. Quite unexpectedly, the high-affinity potassium transporter Trk1 [46] and the positive regulators of its activity emerged as susceptibility determinants to this acid. Trk1 activity is positively regulated by the Serine/threonine
protein kinases Sat4 and Hal5 [47], and negatively regulated by the Serine/threonine protein phosphatase Ppz1 [48, 49]. The activity of the Trk1 transporter is also positively regulated by the activity of Hal3, a negative regulatory subunit of the protein phosphatase Ppz1 [48]. Contrasting with the results from this study, TRK1 was found to confer protection against acetic acid in yeast [15]. Moreover, yeast susceptibility to acetic acid was found to be attenuated by growth medium supplementation with K⁺ ions [15]. Considering the results obtained in this study, the unexpected role of Trk1 in S. cerevisiae tolerance to formic acid was examined.

**Methods**

**Strains and growth media**

The haploid parental strain S. cerevisiae BY4741 (MATα, his3Δ1, leu2Δ0, met15Δ0, ura3Δ0) and the derived collection of single deletion mutants, in which each non-essential gene was individually deleted, were obtained from EUROSCARF (Frankfurt, Germany). Yeast cells were batch cultured in YPD medium containing 2% (w/v) glucose (Merck), 2% (w/v) yeast extract (VWR International) or in MM4 medium containing 1.7 g L⁻¹ Yeast Nitrogen Base (YNB) w/o amino acids or ammonium (Difco), 20 g L⁻¹ glucose, 2.65 g L⁻¹ (NH₄)₂SO₄ (Scharlau), supplemented with 20 mg L⁻¹ methionine, 30 mg L⁻¹ lysine, 60 mg L⁻¹ leucine, 40 mg L⁻¹ tryptophan, 20 mg L⁻¹ histidine and 20 mg L⁻¹ uracil (all from Sigma-Aldrich). Cell cultures were cultivated at 30 °C with orbital agitation (250 rev min⁻¹). To test the growth of wild-type BY4741 and trk1Δ- or trk2Δ-derived strains under potassium limitation, an ammonium phosphate-derived medium was used, containing 0.492 g L⁻¹ MgSO₄·7H₂O (Merck), 2 mg L⁻¹ niacin, 2 mg L⁻¹ pyridoxine, 2 mg L⁻¹ thiamine, 2 mg L⁻¹ pantothenate, 0.02 mg L⁻¹ biotin, 20 mg L⁻¹ methionine, 60 mg L⁻¹ leucine, 20 mg L⁻¹ histidine and 20 mg L⁻¹ uracil supplemented with the desired concentration of KCl (all from Sigma). A 3 M formic acid stock solution (Sigma-Aldrich) was prepared in water and the pH of the solution adjusted to 4.0 or to 4.5 with NaOH depending on the growth medium supplementation. Solid media were prepared by addition of 20 g L⁻¹ agar (IberAgar) to the liquid media.

**High-throughput screening of the deletion mutant collection**

To screen the EUROSCARF deletion mutant collection for susceptibility or tolerance to formic acid, strains were grown for 16 h in MM4 medium in 96-well plates as described before [15, 16]. Using a 96-pin replica platter, the cell suspensions were spotted onto the surface of MM4 solid medium acidified with HCl to pH 4.5 and supplemented, or not, with formic acid to a final concentration of 60, 70 or 80 mM. Depending on the severity of growth inhibition, plates were incubated at 30 °C for 2 or 3 days. Two datasets containing genes identified as determinants of resistance (Additional file 1, Fig. 1a) or of susceptibility (Additional file 2, Fig. 1b) to formic acid were obtained. Both datasets were clustered according to biological process Gene Ontology (GO) assignments using the MIPS functional catalogue (http://mips.helmholtz-muenchen.de/funcatDB; over-representation of functional categories was considered for a p value ≤0.01) and this analysis was complemented using the information available in Saccharomyces Genome Database (SGD) (http://www.yeastgenome.org). The simultaneous occurrence of genes from the same dataset in a shared
metabolic pathway or signalling pathway was determined using the Kyoto Encyclopedia for Genes and Genomes (KEGG) Mapper Search pathway tool (http://www.genome.jp/kegg/tool/map_pathway1.html).

Susceptibility assays to formic acid of selected strains
The susceptibility of selected S. cerevisiae BY4741-derived deletion mutants was compared with the parental strain in shake flasks or petri dishes in MM4 medium (pH 4.0) or in solid MM4 medium (pH 4.5). To test the strain susceptibility to formic acid (30 mM) in liquid MM4 medium, mid-exponential cells pre-grown in MM4 medium (pH 4.0) to an optical density at 600 nm (OD_{600}) of 0.8 ± 0.05 were used to inoculate the same basal medium, either or not, supplemented with 30 mM formic acid, with an initial OD_{600} of 0.05 ± 0.005. Growth curves were followed based on the increase of the OD_{600} and by determining the number of colony-forming units (CFU) per ml of cell suspension in solid YPD medium. To test the susceptibility of selected mutants to formic acid in solid MM4 medium (pH 4.5), mid-exponential cells grown in MM4 liquid medium (pH 4.5) to a final OD_{600} of 0.8 ± 0.05 were diluted to an OD_{600} of 0.05 ± 0.005 and spotted onto solid medium supplemented or not with formic acid (50 and 80 mM). Plates were incubated for 3 days at 30 °C.

The susceptibility of wild-type BY4741 and trk1Δ and trk2Δ mutants to formic acid was also compared by spot assays performed in the presence of increasing concentrations of potassium. The solid ammonium phosphate-derived medium (at pH 4.5) was supplemented with KCl (stock solution of 2 M) to final concentrations of 0.5, 2 and 20 mM and supplemented or not with formic acid at the indicated concentrations. The cells used to inoculate the agar plates were grown until an OD_{600} of 0.4 in liquid ammonium phosphate-derived medium (at pH 4.5) supplemented with 20 mM of KCl. Cells were diluted in sterile H_{2}O to an OD_{600} of 0.05, and this solution was used to prepare 1:3 and 1:15 diluted suspensions. Four microliters of each cell suspension were spotted onto solid media and the plates incubated at 30 °C for 5 days, depending on the severity of growth inhibition.

Effect of formic acid in the transcriptional level from Haa1-regulated genes
Real time RT-PCR was used to compare mRNA levels from a number of Haa1-target genes (TPO2, TPO3, COM2, HKR1, SAP30 and SLUR2) in BY4741 and BY4741/haa1Δ genetic backgrounds, cultivated in MM4 medium (pH 4.0) supplemented or not with 30 mM of formic acid, as described above for formic acid susceptibility assays, except that the initial OD_{600} of the growth curves which was set at 0.4 ± 0.05. Cells incubated for 30 min in presence or absence of 30 mM of formic acid were harvested by centrifugation at 5000g, 4 °C, for 3 min and the pellet immediately frozen in liquid nitrogen and stored at −80 °C until used. Total RNA was extracted from these pellets using the hot phenol method [50], treated with DNAaseI (Invitrogen) according to the manufacturer instructions, and 1 μg of the treated RNA was used in the reverse transcription step (Taqman® reverse transcription reagents). Primers used for the PCR amplification of the selected genes (Additional file 3) were designed using the Primer Express Software (Applied Biosystems), and 62.5 ng of the synthesized cDNA were used as template for the amplification step. ACT1 gene was used as the endogenous control. Values of mRNA determined for BY4741 cells cultivated in the absence of the acid were used as normalization factor, being the mRNA levels from the different genes determined for the same RNA sample set as 1.

Cellular accumulation assays for [14C]formic acid
BY4741 and BY4741/trk1Δ cells, pre-grown in MM4 medium (pH 4.0), were used to inoculate fresh medium with an initial OD of 0.1 and cultivated at 30 °C with orbital agitation (250 rev min⁻¹) until an OD_{600} of 0.3–0.5 was reached. An appropriate volume of cell suspension was filtered and cells resuspended in 5 ml of fresh MM4 medium (pH 4.0) with an OD_{600} of 0.5 ± 0.05 and incubated for 10 min at 30 °C (150 rev min⁻¹) before the accumulation experiment was performed. The experiment started after the addition of cold formic acid (final concentration of 30 mM) and 2.5 μL of [14C]formic acid ([14C]sodium formate, 1 mCi ml⁻¹, ARCO163A, American Radiolabeled Chemicals). At the indicated time points, 200 μL of the cell suspension were filtered through glass microfiber filters (Whatman GF/C) and washed twice with ice-cold TM buffer containing 100 mM MES and 41 mM Tris buffers (both from Sigma, pH of 4.0 adjusted with HCl). The filters containing the adsorbed cells were placed into scintillation vials containing 5 ml of scintillation cocktail (Ultima Gold MV, PerkinElmer) and the radioactivity of the samples measured in a Beckman LS 5000TD scintillation counter. The radioactivity of 100 μL of the culture supernatant was also measured at each time point. The accumulation ratio of intracellular/extracellular [14C]formic acid at the indicated time points was calculated considering that the internal volume (Vₐ) of cells of both strains was equal to 2.5 μL per mg of dry weight [23]. The difference between the means determined for wild-type and trk1Δ cells were considered statistically significant for p values <0.05 using a one-way ANOVA.
Results

Genome-wide identification of *S. cerevisiae* genes that confer tolerance to formic acid

The EUROSCARF collection, containing approximately 5000 single deletion mutant strains devoid of all non-essential *S. cerevisiae* genes, was screened to identify genes contributing to tolerance to formic acid-induced stress, based on the identification of those mutants exhibiting increased susceptibility to 60, 70 or 80 mM of formic acid at pH 4.5, when compared to the parental strain (Additional file 1). This chemogenomic analysis allowed the identification of a total of 172 tolerance genes (Additional file 1). Two levels of susceptibility were considered, depending on the severity of growth inhibition of the deletion mutants when compared to the wild-type strain, as illustrated in Additional file 4. All genes that were found to be determinants of tolerance to formic acid (despite the level of susceptibility conferred by the deletion of the gene) are indicated in Additional file 1. These genes were grouped using the MIPS functional catalogue (http://mips.helmholtz-muenchen.de/proj/functDB). The different functional categories identified as being over-represented (p value ≤0.01) in the dataset, when compared to the genome and the list of genes and the number of genes in each category, are depicted in Fig. 1a and in Additional file 1.

Haa1 and the Haa1-regulon are involved in response and tolerance to formic acid

Among the tolerance genes identified based on the deletion mutant collection screening, those encoding the transcription factor Haa1 and genes of the Haa1-regulon (direct or indirect target genes for Haa1 regulation under acetic acid stress) were selected for further studies. In fact, their prominent role in yeast adaptive response to acetic acid and other short-chain fatty acids has been proposed. To confirm the putative role of Haa1 and of genes of the Haa1-regulon in yeast response and tolerance to formic acid, the susceptibility to this weak acid of the parental strain and of several individual deletion mutants with genes of the Haa1-regulon deleted, in particular, *tpo2Δ*, *tpo3Δ*, *com2Δ*, *sur2Δ*, *hrk1Δ* and *sap30Δ*, was compared based on formic acid-induced increase of the duration of the latency period for these mutant strains when cultivated in MM4 medium (pH 4.0) supplemented with 30 mM of formic acid (Fig. 2b). With the exception of *TPO2* gene (data not shown), all the Haa1-regulated genes tested were shown to contribute significantly to yeast tolerance to formic acid, exerting a significant effect by decreasing the duration of formic acid-induced lag-phase (Fig. 2b). As described for acetic acid [15], a particularly marked effect of *HRK1* and *SAP30* deletion in the increase of formic acid susceptibility was observed, being even higher than the phenotype registered for cells with the *HAA1* deleted (Fig. 2b).

The transcriptional levels from the Haa1-target genes *TPO3*, *COM2*, *SUR2*, *HRK1* and *SAP30* were also compared in parental strain and *haa1Δ* mutant during early response to formic acid (Fig. 2c) to test this weak acid effect in the hypothesized increase of mRNA levels from Haa1-target genes and its dependence on Haa1. To compare the mRNA levels from the above referred genes, the parental and *haa1Δ* cells were cultivated in MM4 medium at pH 4.0 and collected after 30 min of incubation in medium supplemented, or not, with 30 mM of formic acid (Fig. 2c). Transcription levels from selected Haa1-target genes under formic acid stress were found to be significantly higher compared with those in unstressed parental cells, while this formic acid-induced transcriptional activation of the target genes was drastically reduced in cells with the *HAA1* gene deleted, supporting the idea that Haa1 is an activator of these genes increased transcription in response to formic acid stress (Fig. 2c). The mRNA levels from the *SAP30* gene in unstressed *haa1Δ* cells were found to be higher than those registered in the parental strain but no likely justification can be put forward for this result at this time.

Genome-wide identification of *S. cerevisiae* genes whose expression increases susceptibility to formic acid

The chemogenomic analysis carried out also led to the identification of 41 genes whose individual deletion results in increased tolerance to formic acid of each single mutant when compared to the parental strain, as illustrated in Additional file 4. According to the MIPS functional catalogue, no significant enrichment in GO terms (p value ≤0.01) could be identified, probably due to the high variety of functions associated to this small gene dataset. For this reason, the identified determinants of susceptibility to formic acid were manually grouped according to their description in SGD (www.yeast-genome.org) into the following categories: “carbohydrate and energy metabolism”, “amino acids metabolism”, “ion homeostasis”, “response to stress”, “protein synthesis”, “intracellular trafficking”, “protein sorting” and “chromatin remodelling, nucleic acid metabolism and transcription” (Additional file 2 and Fig. 1b). Among the genes found to contribute to increased yeast susceptibility to formic acid, two genes are highlighted: the gene *CYC3*, encoding a cytochrome c heme lyase, and the *ARN2* gene, encoding a transporter of siderophore–iron complexes involved in iron uptake.

From the EUROSCARF collection screening, genes *SAT4* and *HAL5*, two positive regulators of Trk1 activity, were found to confer susceptibility to yeast. Based on this result, it was considered of interest to systematically
compare the susceptibility to formic acid of an individual mutant with the TRK1 gene deleted and of mutants with the positive (HAL3, SAT4 or HAL5) and negative (PPZ1) regulators [47, 51] of its activity individually deleted (Fig. 3a, b). Surprisingly, results indicate that the TRK1 gene, encoding the high-affinity potassium transporter [46], as well as genes SAT4 and HAL5 are determinants of susceptibility to formic acid (Additional file 2, Fig. 3a), suggesting a detrimental effect of the biological activity of Trk1 in yeast protection to formic acid. Consistent with this hypothesis, the mutant with the gene encoding the negative regulator of Trk1, Ppz1, deleted is more susceptible to formic acid than the parental strain, whereas the mutant deleted for the gene encoding the negative regulator of Ppz1, Hal3, is more tolerant to the acid (Fig. 3a, b).

However, the deletion of TRK2, coding for the low-affinity potassium transporter, had no detectable effect on yeast susceptibility to formic acid (Fig. 3a). Since the screening of the deletion mutant phenotypes was performed at a non-limiting K+ concentration (8 mM), to understand the conjugated effect of potassium availability and the presence of Trk1 or Trk2 in yeast tolerance to formic acid, the susceptibility to formic acid of wild-type BY4741 cells and TRK1 or TRK2 deleted mutants was compared by spot assays at K+ concentrations ranging from 0.5 to 20 mM of KCl (Fig. 4). At the higher concentration of 20 mM of KCl, ectopic uptake of K+ is sufficient to fulfil cellular requirements [52]. Results show that the deletion of the TRK1 gene increases, at the highest K+ concentration tested, the tolerance of yeast cells to high concentrations of formic acid, allowing growth at 40 and 50 mM under the experimental conditions used (Fig. 4). However, the effect of TRK2 gene deletion was not detected at any of the K+ concentrations tested (Fig. 4). Based on these results, it was hypothesized that the high-affinity K+ transporter, Trk1, besides its main biological function, may also facilitate the uptake of formic acid/formate into the yeast cell. This hypothesis is consistent with the higher accumulation of radiolabeled [14C]formic acid in the parental strain compared with trk1Δ cells (Fig. 3c).
From the chemogenomic analysis performed in this study, several genes belonging to the functional categories “intracellular trafficking and protein sorting”, “chromatin remodelling, nucleic acid metabolism and transcription” and “intracellular pH homeostasis” were found to be over-represented in the dataset of the genes required for yeast adaptation and tolerance to formic acid. These categories were also found to be enriched among the genes required for yeast maximal tolerance to acetic and propionic acids [15, 16]. Vacuolar protein sorting-associated genes have been implicated in multidrug resistance (MDR) [53], and acetic acid-triggered intracellular acidification was shown to lead to trafficking defects, hampering vesicle shuffling from endosome to vacuole [54]. Since formic acid is believed to share part of the cytotoxic effects associated to acetic and propionic acids, in particular the induction of intracellular acidification, the protective effect conferred by the genes grouped in those categories against formic acid was not surprising.

Genes involved in oxidative stress response were also found to confer tolerance to formic acid, consistent with recent evidences indicating that formic acid induces yeast apoptosis, accompanied by the increase of ROS production [20]. Also, the expression of the ARN2 gene, encoding a transporter for siderophore-iron complexes involved in iron uptake, was found to increase yeast susceptibility to formic acid possibly due to iron ability to catalyse ROS production via Fenton reaction. Collectively, these results indicate that formic acid induces oxidative stress and cell damage.

The deletion of CYC3, encoding the enzyme that catalyses the insertion of an heme group into the apo-form of cytochrome c [55], was found to confer susceptibility to formic acid. In yeast, CYC3 deletion leads to increased H$_2$O$_2$ levels and consequently to increased oxidative stress [56]. However, our results suggest that the deletion of the CYC3 gene is beneficial for yeast tolerance to formic acid. Since formate is believed to bind cytochrome c oxidase (complex VI of the electron transport chain),
specifically inhibiting cytochrome c oxidase activity [39, 40, 45], this effect may affect the re-oxidation of cytochrome c with consequences for the performance of CYC3-expressing cells.

Two genes (GPD2 and GPP2) involved in glycerol biosynthesis were also identified as determinants of tolerance to formic acid. Changes in the saturation degree of fatty acid acyl chains, phospholipids and plasma membrane ergosterol content are believed to affect cell permeability to weak acids [15, 16, 59]. The increased saturation degree of fatty acids acyl chains leads to a more packed membrane structure that is more impermeable to weak acids [60]. Changes in the ergosterol content of plasma membrane influence its permeability and fluidity, and can even affect the activity of membrane transporters including those involved in multidrug resistance [59, 61].

Several genes involved in amino acid biosynthesis were also found to confer increased tolerance to formic acid, suggesting that this acid may cause a depletion of their pool, as reported for acetic acid [26, 62]. On the other hand, it is important to mention that weak acids inhibit amino acid uptake, by affecting the activity of the amino acids permeases, thus exacerbating the influence of the auxotrophic marks present in the parental strain in the susceptibility phenotypes [62, 63]. Since S. cerevisiae BY4741 and the derived deletion mutant collection have several auxotrophic markers, it is possible that the susceptibility phenotypes observed with strains where genes encoding proteins involved in amino acids homeostasis and synthesis are deleted are an artefact related with those auxotrophic markers.

Among the determinants of resistance identified in this chemogenomic analysis is the VAM6 gene, encoding a guanine nucleotide exchange factor that is an activator of the Tor Complex 1 (TORC1) [64] and two genes encoding targets of TORC1 (SCH9 and RTG2). The TORC1 pathway is activated in response to carbon and amino acid starvation and hyperosmotic and redox stresses (reviewed in [65]) and also regulates apoptosis in acetic acid-challenged cells [26]. Our results suggest that the TORC1 pathway may also mediate yeast response to formic acid, possibly in response to amino acid starvation or osmotic or oxidative stress-induced stimuli [21, 26].

The HAA1 gene, encoding the main orchestrator of S. cerevisiae global response to acetic acid [15], was demonstrated to be a determinant of tolerance to formic acid, as well as the deletion of Haal-target genes TPO3, YGP1, SAP30 and HRK1. Moreover, the transcriptional levels from the above mentioned Haal-target genes increase in response to formic acid and this transcriptional
activation is dependent on Haa1, suggesting that the Haa1-regulon is also activated in response to formic acid stress.

A concentration of 30 mM of formic acid (at pH 4.0) was found to cause a latency period identical to the latency period induced by a higher concentration of acetate acid (60 mM) (see Additional file 5). Considering the $pK_a$ (3.74) and LogP ($-0.54$) constants for formic acid (at pH 4.0), the higher toxicity of formic acid compared to acetate acid strongly suggests that there are mechanisms underlying formic acid toxicity that are specific to this weak acid. Among these hypothesized mechanisms specific to formic acid (C1) toxicity or tolerance that emerged from this work is a mechanism that has not been observed before for weak acids in general, not even for acetic acid (C2): the hypothesized uptake of formic acid through the high-affinity potassium transporter, Trk1. This unexpected proposed mechanism is supported by a number of evidences gathered during this study. Among them is the increased accumulation of radiolabeled formic acid in cells devoid of TRK1. The involvement of the Trk1 transporter in facilitating formic acid uptake is consistent with the role of genes encoding the positive (SAT4, HAL3 and HAL5) and negative (PPZ1) regulators of Trk1 biological activity, in decreased or increased tolerance to formic acid, respectively. The lack of detectable effect of TRK2 deletion in yeast tolerance to formic acid is also consistent with this hypothesized role of Trk1 as a facilitator of formic acid uptake into the cell given that Trk1 is a low-affinity K$^+$ transporter, whereas Trk1 is a high-affinity K$^+$ transporter. Remarkably, S. cerevisiae TRK-potassium transporters have been described as mediators of currents of different anions, including Cl$^-$ $\gg$ formate $\gg$ gluconate $\gg$ acetate $\gg$ phosphate (order of selectivity for several slightly permeant anions at pH$_0$ = 5.5) [66]. Our results also indicate that when the growth media has saturating concentrations of K$^+$ (20 mM), the deletion of TRK1 can be explored to increase yeast robustness against formic acid stress.

**Conclusion**

This study provides the first genome-wide identification of determinants and mechanisms of formic acid toxicity and tolerance in yeast. Among the relevant insights obtained, the role of the Haal transcription factor and the Haa1-regulon in the adaptive response and tolerance to formic acid and the biological activity of Trk1 and of its positive regulators in increasing yeast susceptibility to formic acid are highlighted. Collectively, the indications obtained are considered useful to guide the design of fermentation media (increasing K$^+$ concentration) and the genetic manipulation of yeast cell to obtain more robust strains (engineering the Haa1 regulon) for second-generation bio-ethanol production in lignocellulosic biorefineries. The deletion of the TRK1 gene and of genes encoding Trk1 positive regulators is also suggested for maximal yeast tolerance to formic acid at concentrations of K$^+$ for which ectopic uptake of K$^+$ is sufficient to fulfill cellular requirements.

**Additional files**

**Additional file 1: Table S1.** List of genes whose expression increases S. cerevisiae tolerance to formic acid based on the screening of the EURO-SCARF deletion mutant collection (the elimination of the indicated genes increases yeast susceptibility to formic acid). The severity of growth inhibition is indicated by “++” or “+” and the level was attributed according to the criteria described in Additional file 3.

**Additional file 2: Table S2.** List of genes whose expression increases S. cerevisiae susceptibility to formic acid based on the screening of the EURO-SCARF deletion mutant collection (the elimination of the indicated genes increases yeast tolerance to formic acid).

**Additional file 3: Table S3.** Primers used in this study.

**Additional file 4: Figure S1.** Description of the criteria used to define the different levels of susceptibility to formic acid of the deletion mutant strains. Wild-type and deletion mutant strains were spotted onto solid MM$^+$ medium (pH 4.5) supplemented with increasing concentrations of formic acid (60, 70 and 80 mM). Strains that did not grow in the presence of 70 mM of formic acid were considered susceptible strains (S), two levels of susceptibility where defined when mutant growth was reduced (+), or completely abolished (++), when cultivated in the presence of 60 mM of formic acid. Strains that grew in medium supplemented with 80 mM of formic acid were considered resistant strains (R).

**Additional file 5: Table S4.** Comparison of lag-phase duration of the parental strain BY4741 cells cultivated in the presence of equitoxic concentrations of short-chain monocarboxylic acids that cause a latency phase of approximately 17 h. The duration of the lag-phases was determined in cultures of non-adapted BY4741 cells cultivated in MM$^+$ medium (pH 4.0) after sudden exposure to equitoxic concentrations of the listed weak acids (CT, in bold). [HA] concentration of the weak acid protonated at pH 4.0; LogP, logarithm of the partition coefficient of the weak acid between octanol and water.

**Abbreviations**

ROS: Reactive oxygen species; FDH: Formate dehydrogenase; SGD: Saccharomyces Genome Database; KEGG: Kyoto encyclopedia for genes and genomes; GO: Gene ontology; MDR: MultiDrug resistance; MAP: Mitogen-activated protein; LogP: Coefficient of octanol–water partition; TORC1: Tor complex 1.

**Authors’ contributions**

SFH, NPM and ISC conceived and designed the experiments. SFH carried out the experimental work, prepared the figures and contributed to the writing of the manuscript under the scientific supervision of ISC, who coordinated the experimental work, prepared the figures and contributed to the writing of the manuscript. All authors read and approved the final manuscript.

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**Competing interests**

The authors declare that they have no competing interests.

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