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## Manganese-induced cellular disturbance in the baker's yeast, *Saccharomyces cerevisiae* with putative implications in neuronal dysfunction

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Manganese (Mn) is an essential element, but in humans, chronic and/or acute exposure to this metal can lead to neurotoxicity and neurodegenerative disorders including Parkinsonism and Parkinson's Disease by unclear mechanisms. To better understand the effects that exposure to  $Mn^{2+}$  exert on eukaryotic cell biology, we exposed a non-essential deletion library of the yeast *Saccharomyces cerevisiae* to a sub-inhibitory concentration of  $Mn^{2+}$  followed by targeted functional analyses of the positive hits. This screen produced a set of 43 sensitive deletion mutants that were enriched for genes associated with protein biosynthesis. Our follow-up investigations demonstrated that Mn reduced total rRNA levels in a dose-dependent manner and decreased expression of a  $\beta$ -galactosidase reporter gene. This was subsequently supported by analysis of ribosome profiles that suggested Mn-induced toxicity was associated with a reduction in formation of active ribosomes on the mRNAs. Altogether, these findings contribute to the current understanding of the mechanism of Mn-triggered cytotoxicity. Lastly, using the Comparative Toxicogenomic Database, we revealed that Mn shared certain similarities in toxicological mechanisms with neurodegenerative disorders including amyotrophic lateral sclerosis, Alzheimer's, Parkinson's and Huntington's diseases.

All trace elements play an important role in the balance of life on our planet. The ability of cells to effectively utilize these elements depends strongly on their concentration, chemical speciation and fractionation<sup>1</sup>. Manganese (Mn) is the twelfth most abundant element in the earth's crust. Natural levels of Mn range from  $1-200 \,\mu\text{g/L}$  in fresh water and  $410-6700 \,\text{mg/kg}$  (dry weight) in sediment<sup>2</sup>. In aquatic environments,  $\text{Mn}^{2+}$  is the most dominant and stable water-soluble species when the pH and redox potential are kept low<sup>2</sup>. The Mn<sup>3+</sup> ion is soluble only in complex form and Mn<sup>4+</sup> has very limited solubility<sup>3</sup>. Different Mn species can interconvert via oxidative or reductive processes depending on the redox environment<sup>1,3</sup>. Additionally, it is known that Mn is an vital trace mineral in nutrition<sup>4</sup>. Locally, levels of Mn can rise significantly in certain areas due to geogenic factors or anthropogenic activities such as mining<sup>5-8</sup>. Higher levels of Mn can have negative consequences for environmental health.

Epidemiological and toxicological studies suggest that Mn can be detrimental to specific biological processes and beneficial to the others in a concentration-dependent manner. This is also influenced by developmental stage, disease state<sup>9,10</sup> cell type<sup>11</sup>, and/or the organism itself. Cell models from various organs including the liver, kidney and brain, suggest that neurotoxicity is the principal effect of this metal<sup>11</sup>. However, the underlying mechanism(s) are unclear and remain the subject of current studies<sup>12</sup>. Some investigations provide strong evidence that Mn can disturb the vital flow of genetic information from DNA to RNA to protein<sup>13–16</sup>. Recently; an interesting *in vitro* 

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study demonstrated that  $Mn^{2+}$  had similar effects that  $Fe^{2+}$  and  $Mg^{2+}$  on rRNA folding and it can replace  $Mg^{2+}$  as the dominant divalent cation during translation of mRNA to functional protein<sup>17</sup>.

The addition of MnCI<sub>2</sub> (5 mM) to highly-purified membrane rat-liver fractions caused a 30% increase in the polysome-binding capacity of stripped rough endoplasmic reticulum (ER) membranes, while four- to five-fold increases were observed with smooth ER membranes<sup>15</sup>. Previous studies in yeast suggest that the Mn<sup>2+</sup> inhibits protein synthesis, disrupts nuclear DNA replication, and demonstrates mutagenic activity when under selective pressure<sup>13,14</sup>. Overwhelming evidence indicates that when stressed or undergoing environmental adaptation, cells accumulate non-synonymous mutations<sup>18</sup>. Studies investigating Mn-trafficking in humans suggest that Mn-induced Parkinsonism can result from mutations in *SLC30A10*, *ATP13A2* or *ZnT10*<sup>19,20</sup>. Also, a His  $\rightarrow$  Asn reversion mutant in ZnT10 conferred Mn transport activity and loss of zinc transport activity<sup>20</sup>. ZnT10 codes for a protein that is localized to the plasma membrane and is involved in zinc subcellular homeostasis<sup>20</sup>, while SLC30A10 codes for a surface-localized Mn efflux transporter that reduces cellular intake of Mn and protects against Mn-induced toxicity in neurons and worms<sup>19</sup>. The synthesis of these proteins is controlled by ribosomal activity in connection with the ER<sup>21</sup>. The ER is a large, continuous membrane-bound organelle with distinct domains and numerous contact sites with the plasma membrane, Golgi, mitochondria, and other cellular components including the SNARE (soluble N-ethylmaleimide-sensitive fusion protein attachment protein receptors) complex that participates in the ER formation, fusion and function<sup>22</sup>. Protein synthesis is a crucial process for all living cells. Due to its central importance to cell survival and high energy requirements, protein synthesis is firmly regulated and strongly connected to other cellular processes, including the cell cycle and metabolic pathways<sup>23,24</sup>. Also, the mechanisms that govern the protein synthesis are highly-conserved through the course of evolution from higher to lower eukaryotes, as well as prokaryotes. In line with this, several aggregation-prone yeast proteins have human homologues that are implicated in protein misfolding associated diseases, suggesting that similar mechanisms may apply in both organisms and that yeast can serve as a good model organism to study such processes<sup>25</sup>. Studies using ribosome profiling and/or polysome profiling and classic gene expression analyses have provided new insights into the identification of novel genes that can affect this process as well as the mechanism of protein synthesis itself, which is often considered the endpoint of gene expression<sup>26,27</sup>.

Compound genome-wide toxicity is best studied using a systems biology approach, which can decipher the role(s) of individual components of complex biological systems under certain conditions by examining interactions on a global scale. To this end, large-scale chemical-genomic studies using yeast have been employed to identify individual chemical-genetic interactions (CGIs) and generate interaction profiles to infer mechanism(s) of action<sup>28,29</sup>. A category of these interactions occurs when the deletion of a single gene causes significant sensitivity or resistance to a target compound. Such interactions can suggest a functional relationship between the deleted gene and cell's responses to the target compound. By screening for chemical-genetic interactions across the genome, significant insights into genotoxicity pathways can be drawn. In a similar context, protein-protein interaction (PPI) networks also provide a useful resource to better understand the mechanism of toxicity. PPIs underlay nearly all biological processes, including cell-to-cell interactions, and metabolic and developmental controls. Depending on structural properties and functional characteristics, PPIs can range from transient interactions that generally participate in signalling pathways tothemore permanent interactions required to form stable protein complexes. It has been revealed that over 80% of proteins do not operate alone but in complexes<sup>30,31</sup>. PPIs can be studied in vitro, in vivo, and in silico<sup>31</sup>.

Connections between environmental toxin exposure and several human diseases have stimulated increased investigation into the toxicity of environmental contaminants using different model organisms<sup>32,33</sup>. Despite the evolutionary distance between yeast and humans, the underlying molecular players of numerous important pathways including programmed cell death, cell cycle progression and gene expression are conserved between the two species, allowing for the study of neurotoxins using highly-developed omics approaches in yeast<sup>34</sup>. Mn is one such compound that is applicable for large-scale screening in yeast. However, the range of intra-cellular Mn concentrations with physiological relevance or toxicity is quite large. Particularly, various studies done in yeast suggest that concentrations can range from between 2–100 nmol of  $Mn/(10 \times 10^9 \text{ cells})$ , or 0.04–2.0 mM Mn (assuming a single yeast cell has a volume of 50 femtoliters), without any impact on cell growth<sup>35</sup>. However, at levels below or above this, Mn induces toxicity stimulating cellular responses, including upregulating or downregulating cell surface and intra-cellular transport systems<sup>35</sup>. Consequently, yeast has been used to study events associated with Mn homeostasis, neurotoxic cell death, and neurodegeneration<sup>34-37</sup>. Generally, these studies have used Mn concentrations above of 2 mM, but have hardly explored the large network of physiological pathways that involve Mn, and hence the role of Mn in these processes remains unclear. In the current study, we provide evidence to connect Mn toxicity to the gene expression pathway in yeast. The impairment of protein biosynthesis by  $Mn^{2+}$  revealed in this study improves our current understanding of Mn-induced neurotoxicity and neurodegenerative disorders such as including amyotrophic lateral sclerosis (ALS), Alzheimer's disease (AD), Parkinson's disease (PD) and Huntington's disease (HD).

#### Results

To identify pathways that are influenced by Mn exposure, we screened for gene deletion strains that demonstrate increased sensitivity to  $Mn^{2+}$  using the yeast non-essential gene deletion array (yGDA), Fig. 1A. These types of screens can provide a CGI profile for a target toxin and contribute to our knowledge of the cell's global stress responses to that toxin. To this end, we performed sensitivity analysis by screening approximately 4700 gene deletion strains, under two conditions (presence and absence of  $MnCl_2$ ), for a total of approximately 28,000 individual analyses. Sensitivity was investigated by determining the relative colony growth size in the presence/absence of the target compound. In this way, we identified 68 gene deletion mutants with significantly altered growth profiles (Supplementary Material, Table SM1), of which 43 were confirmed to display high sensitivity to a sub-inhibitory concentration (1.35 mM) of Mn (a high concentration of a bioactive/toxic compound where growth of a wildtype



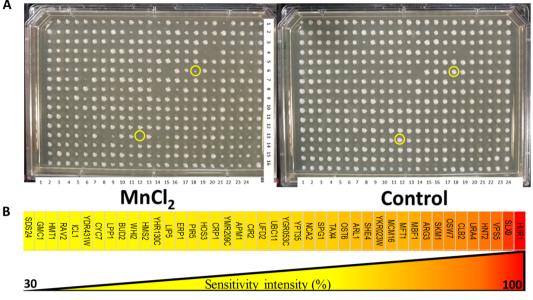


Figure 1. Representative illustration of Mn-induced disruption in yeast gene deletion array after exposure to MnCl<sub>2</sub> (1.35 mM) for 24 hours. Mutants that showed a relative reduction in growth (sensitivity) of 30% or more were selected as hits (p < 0.05). Examples of hit stains are indicated using yellow circles.

(WT) strain is not completely inhibited), Fig. 1B. These genes represent a CGI profile for Mn sensitivity. They often represent "double hits" where the gene deletion and Mn treatment target compensating pathways generating an aggravated effect. The hits identified here were then subjected to further analysis.

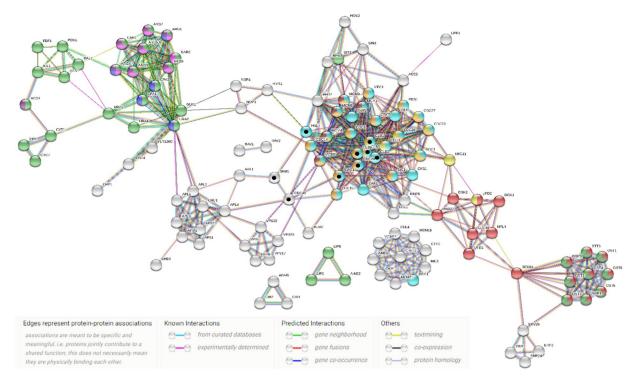
Functional proteomic and Gene Ontology (GO) analysis of sensitive mutants identifies multiple **pathways including protein synthesis.** To have a comprehensive coverage of the hits identified in our sensitivity screen, the String database was used to expand the obtained CGI profile for Mn on the basis of PPI data<sup>38</sup>. String uses physical interactions and functional associations to study a defined set of proteins and expand it by including associated proteins. In this way, the network of functional interactors for Mn was increased to approximately 600 edges (p-value < 1.0e-16), of which more than 85% are known interactions. For example, approximately 87% of the interactions have been experimentally verified and almost 98% are from curated databases. A schematic representation of these interactors is shown in Fig. 2.

Enrichment of cellular pathways represented by the expanded list of proteins is shown in Table 1. As expected, proteins associated with cellular development and protein metabolism were highly enriched<sup>39</sup>. Particularly, the ER associated activities have been highly connected to Mn toxicity<sup>21,40-43</sup>. However, a direct connection between protein synthesis and Mn toxicity has not been previously reported. This led us to further investigate the influence of Mn toxicity on protein biosynthesis.

To study if Mn may also affect gene expression at the translation level, total RNA levels were analyzed. In response to the presence of Mn, we observed decreased levels of rRNA molecules (Fig. 3A). After treating the cells with 1.5 mM and 3.0 mM Mn for 45 minutes, total rRNA levels are reduced in a dose-dependent manner. We repeated this experiment by increasing the duration of Mn treatment to 3 and 24 hours. We observed similar results indicating that total levels of rRNA molecules seem to be reduced in response to Mn. Next, we investigated ribosome profiles of cells in response to Mn treatment (Fig. 3B). We observed a reduction in the pool of polysomes in response to treatment with 3 mM Mn for 1 hour, in addition to an increase in the pool of 80S ribosomes. Reduction in polysomes is interpreted as a decrease in the number of ribosomes that are active and engaged in synthesizing proteins. An increase in 80S monosomes is generally regarded as stalled initiation of translation. Treatment of the cells with Mn for 24 hours, resulted in additional reduction in polysomes in comparison to control conditions.

Lastly, using an expression vector we investigated the expression of  $\beta$ -galactosidase, used as a reporter, in response to Mn. In a dose-dependent manner, the presence of  $Mn^{2+}$  reduced the expression of  $\beta$ -galactosidase (Fig. 3C). Importantly, this trend differs significantly when other divalent ions such as  $Ca^{2+}$ ,  $Mg^{2+}$  and  $Zn^{2+}$ are used suggesting that the decreased rate of translation is unique to  $Mn^{2+}$  stress and not a general byproduct (Supplementary Material, Fig. SM2). Altogether, these follow-up investigations connect Mn toxicity to the process of protein biosynthesis, which were identified as an enriched cellular process in our GDA analysis.

Manganese-induced disturbance of processes that converge to protein biosynthesis in yeast, which mimics molecular pathways associated with neurodegeneration. It has been postulated that the ER has various active domains and membrane contact sites that are required for multiple cellular processes including protein and lipid biosynthesis, calcium regulation, and the exchange of macromolecules<sup>22</sup>. In this study, multiple approaches including GDA and PPI analysis (Figs 1 and 2), GO ontology enrichment (Table 1),



**Figure 2.** The inferred and enriched PPI network from 43 genes that sensitize yeast to Mn when deleted. Analysis performed using the String database. Network properties are as follows: The minimum required interaction score, to be included at the predicted network, was accepted with a threshold on the high confidence equal 0.7; Number of nodes: 143; Number of edges: 594; Expected number of edges: 287; Average (avg) node degree: 8.31; avg. local clustering coefficient: 0.652; PPI enrichment p-value: <1.0e-16. Nodes and edges represent proteins and PPIs, respectively. Red nodes (protein processing in endoplasmic reticulum); blue nodes (metabolic pathways); dark green nodes (N-Glycan biosynthesis); cyan nodes (cell cycle); yellow nodes (ubiquitin-mediated proteolysis); orange nodes (meiosis); maroon nodes (DNA replication); purple nodes (amino acid biosynthesis); magenta nodes (arginine and proline metabolism); lime green nodes (alanine, aspartate and glutamate metabolism). The protein with black points in the center represent the MAPK signaling pathway. Proteins that are not connected to at least one partner are not shown.

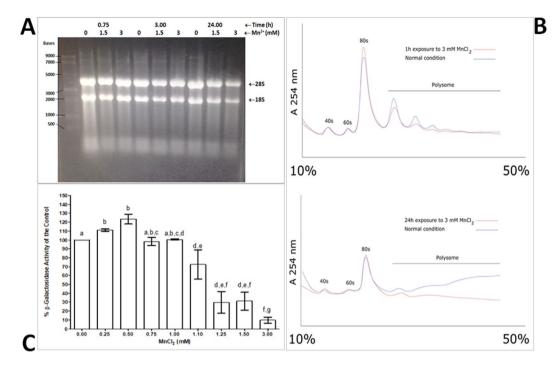
Cellular Processes	Pathway description	Number of observed genes	FDR
	Cell cycle	29	8.46E-21
Cell cycle	Meiosis	21	1.26E-11
	DNA replication	5	4.39E-03
	Protein processing in endoplasmic reticulum	17	1.78E-11
	N-Glycan biosynthesis	9	2.09E-07
Biosynthesis and Metabolism of Proteins	Arginine and proline metabolism	8	2.84E-06
biosynthesis and Metabolism of Proteins	Ubiquitin mediated proteolysis	7	6.42E-04
	Alanine aspartate and glutamate metabolism	5	4.12E-03
	Biosynthesis of amino acids	8	3.47E-02
Metabolism	Metabolic pathways	36	2.83E-06

**Table 1.** Cellular pathways enriched in the Mn-induced interaction network. This table was produced by performing GO analysis on the PPI network associated with genes influenced by Mn exposure (Fig. 1). This network was generated using the String database.

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total rRNA analysis, ribosome profiling and a  $\beta$ -galactosidase reporter assay (Fig. 3), together suggest that the Mn induces a significant perturbation of protein biosynthesis and associated pathways.

To augment this finding and more-closely study individual participants, we selected several genes linked to processes that converge on protein biosynthesis and then analyzed their relative transcription levels using qPCR (Fig. 4). Indeed, the presence of Mn induced alterations in the expression of these genes. For example, we observed decreased expressionof key translation initiation factor eIF4A (*TIF1*) and upregulation of the essential translation elongation factor eIF-5A (*HYP2*). Additionally, several other genes associated with translation and/



**Figure 3.** Influence of Mn on protein biosynthesis. (**A**) rRNA levels are reduced in response to Mn (1.5 and 3 mM), for 0.75, 3 and 24 hours. Total rRNA (1 µg) run on a 1.2% agarose gel. (**B**) Ribosome profile analysis suggests that the number of active polysomes are reduced in response to Mn 3 mM, for 1 and 24 hours. (**C**) The relative expression of  $\beta$ -galactosidase is reduced in response to the presence on increasing concentrations of Mn. Bars represent the mean value of at least 3 independent experiments and error bars represent (mean ± SEM). Differences were stipulated by ANOVA one-way, followed by a Bonferroni post-test. Letters indicate statistically significant differences among treatments (p < 0.05).

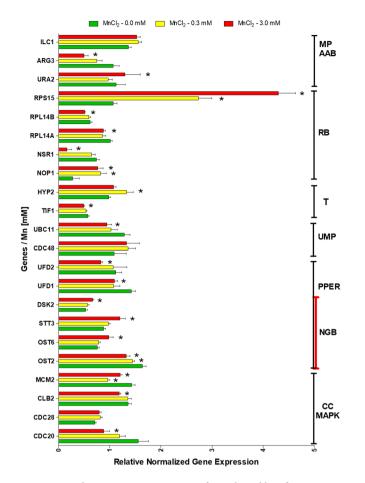
or ribosome biogenesis had significantly altered levels of transcription including the downregulation of *NSR1*, *NOP1* and up-regulation of the gene *RPS15*. However, protein biosynthesis is a complex process that involve other pathways. For instance, we observed perturbation in the expression of genes such as *UFD1*, *UFD2*, *STT3*, *DSK2*. Additionally, *OST2* and *OST6*, involved in post-translational processing in the ER (PPER), were significantly downregulated and upregulated, respectively. Similar alterations are inferred for the N-glycan biosynthesis pathway, which is partially regulated by *OST2* and *OST6* activity. We also observed decreased-expression of *ARG3* involved in amino acid biosynthesis, including arginine, proline, alanine, aspartate and glutamate metabolism and increased expression of *URA2*.

Also of interest, genes such as *CDC20* and *UBC11*, which are related to ubiquitin proteolysis were significantly disrupted. Protein synthesis underpins much of cell growth and multiplication<sup>44</sup>. Coincidently, impairment of *CDC20* suggests a direct relationship among dysregulation of protein biosynthesis and alteration of MAPK signaling pathways, cell cycle and DNA replication respectively.

#### Mn-induced molecular impairment in yeast mimics pathways associated with neurodegeneration.

We identified alterations in various pathways that lead to impairment of protein biosynthesis, which is a conflicting topic in neurodegeneration research. Some reports have viewed this as a therapeutic target, while others suggest that it provokes the onset of certain neurodegenerative disorders<sup>45</sup>. Due to the conservation of the key cellular processes and genes, yeast has been used as a model organism to study human neurodegenative diseases<sup>34</sup>. In this sense, we conducted an additional analysis of the pathways affected by Mn using both the String database and the Comparative Toxicogenomics Database – CTD<sup>46</sup>, which permits the development of novel hypotheses about the relationships between chemicals and diseases<sup>47</sup>. The results are shown in Fig. 5.

We verified that approximately 31% (44 proteins/genes, Supplementary Material - Fig. SM 3) of the inferred network for hits (genes) affected by Mn (Fig. 2) have homologues in human, of which approximately 73% (32 proteins/genes, Supplementary Material – Fig. SM 3) are potentially linked to neurodegeneration, according to the CTD<sup>46</sup>. The genes affected by Mn suggest that this cation-induced toxicity in yeast involves disruption of several pathways which together lead to impairment of protein biosynthesis (Fig. 5A). These alterations shared characteristics with pathways involved in neurodegenerative diseases (Fig. 5B). For example, we identified that the MnCl<sub>2</sub> affects the *CDC20* involved in the metabolism of proteins<sup>46</sup>, the cell cycle and MAPK signaling pathways and is potentially involved in the development of neurodegenerative disorders such as AD, ALS, HD and PD<sup>46</sup>. At the same time, *UFD1* is associated with protein processing in endoplasmic reticulum and potentially linked to the evolution of AD, ALS and PD<sup>46</sup>. Altogether; our findings and subsequent inferences suggest that the developmental impairment induced by Mn, according to cell cycle disruption, is mainly influenced by collective perturbation of pathways that converge to disturbance of protein biosynthesis. We demonstrated a decrease in total RNA,



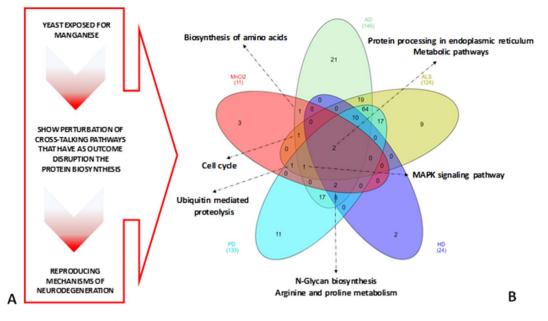
**Figure 4.** Relative gene-transcription of preselected hits from yeast stressed with Mn, after analysis of protein-protein interaction network (figure 2),  $\beta$ -galactosidase expression assay and ribosome profile, which are an evidence of perturbation of protein biosynthesis and other associated pathways (protein processing in endoplasmic reticulum, metabolic pathways, N-Glycan biosynthesis, cell cycle, ubiquitin mediated proteolysis, amino acid biosynthesis, MAPK signaling pathway and translation control analysis) was performed by qPCR. Bars represent the mean value of at least 3 independent experiments and error bars represent (mean  $\pm$  SEM). Preliminarily, we verified some trends to be different between Mn treatment and the control using t-test ( $^+p < 0.05$ ). Then, we confirmed several significant differences by ANOVA two-way, followed of Bonferroni post-test ( $^*p < 0.05$ ).

polysome and  $\beta$ -galactosidase activity as well as potential alterations in the expression of genes directly associated with translation (*HPY2* and *TIF1*) and ribosome biogeneses (*RPS15*, *NSR1* and *NOP1*). Together findings suggest a plausible hypothesis for Mn-induced neurotoxicity and neurodegeneration (Fig. 5B). Further analysis in higher-order animal models is needed to confirm this theory.

#### Discussion

The role of Mn in toxicity, particularly in relation to neurotoxicity and neurodegeneration disorders, remains unclear with several proposed hypotheses<sup>12</sup>. The CTDdescribes Mn as an essential trace element, with possible connections to approximately 570 biological processes and/or pathways<sup>48</sup>. In this work, using a functional genomics and systems biology approach, we observe a connection between Mn and cellular processes such as cell cycle progression, cell signaling, and protein metabolism. Agreeably, previous studies have suggested the possibility that Mn may disturb cellular development processes<sup>49,50</sup> as well as the flow of genetic information that could influence protein synthesis<sup>14-16</sup>, including ER stress<sup>21,40-43</sup>.

Our global chemical-genetic sensitivity screen, followed by GO term enrichment of interaction network of participants, suggest that Mn disturbed anabolic metabolism pathways In line with this, we provide evidence to suggest that disruptions in the biosynthesis of amino acids through decreased expression of *ARG3* which is involved in the biosynthesis of arginine from ornithine carbamoyltransferase<sup>51</sup>. Previous works have suggested that ornithine deficiency causes hyperammonemia and neurotoxicity in humans<sup>52</sup>. Specifically, alteration of arginine and proline metabolism has been associated with development of ALS<sup>53</sup>. The impairment of amino acid biosynthesis can directly disrupt translation efficiency<sup>54</sup>, a process that is energetically very costly<sup>23,24</sup>. Furthermore, these events appear to be associated with inactivation of MAPK pathways that can lead to translation repression<sup>23,55</sup>, antiapoptotic activities<sup>56</sup> and/or cell cycle arrest<sup>23,44,56</sup>. Interestingly, we identified and inferred significant impairment of genes involved in the cell cycle and MAPK pathways (Figs 1, 2 and 4) such as *CDC20* and *CLB2*, which correlated with our qPCR results. Cell cycle disruption has been associated with AD, PD and ALS<sup>57</sup>.



**Figure 5.** Mn-induced disruption pathways in yeast (**A**) share similarities with certain pathways linked to neurotoxicity and neurodegeneration (**B**). Analysis performed with the Comparative Toxicogenomic Databasewhich containscurated data regarding the mechanisms of action for neurodegenetative disorders. The results these analyses indicate overlapping pathways related to Mn Toxicity, AD (Alzheimer's Disease), Amyotrophic Lateral Sclerosis (ALS), HD (Huntington's Disease), and PD (Parkinson's Disease).

At the same time, aberrations from strictly controlled of MAPK signaling pathway have also been implicated in the development of different human diseases including AD, PD and ALS<sup>56,58</sup>.

According to the results discussed above, Mn-induced toxicity in yeast appears to be associated with essential pathways linked to protein metabolism. In the current study we inferred that Mn may induce ER stress (Fig. 2), which was demonstrated through qPCR analysis showing up-regulation of *OST6* and downregulation of *OST2* (Fig. 4). This is in agreement with previous *in vitro* and yeast studies that suggested that the ATPase activity of ER gene *SPF1* is compromised under exposure to Mn resulting in severe ER stress<sup>43</sup>. Other works have suggested that Mn-induced ER stress can be mediated through iron depletion, increased phosphorylation of the eukaryotic translation initiation factor  $2\alpha$  (phospho-eIF $2\alpha$ )<sup>59</sup>, activation of *PERK* and *IRE1* signaling pathways<sup>41,42</sup> and ER tumefaction<sup>60</sup>. An RNA-Seq approach in *Caenorhabditis elegans* revealed that Mn induced both up and down-regulation of ER-related protein families (*FKB* and *ABU*) which are both implicated in ER stress<sup>40</sup>. ER stress can trigger a signaling reaction known as the unfolded protein response (*UPR*), which induces adaptive programs that improve protein folding. In certain neurodegenerative diseases such as AD, ALS, HD and PD, when the cell damage is irreversible, *UPR* can also activate apoptosis<sup>61,62</sup>.

Moreover, we found that Mn could potentially influence glycosylation through OST2 and  $OST6^{63,64}$ . Aminoglycoside antibiotics have been proposed to introduce errors in post-translational modifications such as glycosylation and protein misfolding that can lead to destabilized membranes and chronic stress<sup>65</sup>. Other studies suggest that alterations of *SLC39A8* links Mn deficiency to inherited glycosylation disorders, specifically impairment of Mn-dependent enzymes activity, most notably the Golgi enzyme  $\beta$ -1,4-galactosyltransferase, which is essential for biosynthesis of the carbohydrates in glycoproteins<sup>63</sup>. Moreover, Golgi glycosylation defects may also be the result of *Gdt1p/TMEM165* deficiencies that stem from Golgi Mn homeostasis defects<sup>64</sup>. Collectively, this evidence suggest that ER stress in yeast treated with Mn, may be associated with the impairment of N-glycan biosynthesis<sup>66</sup>, which could consequently lead to arrest the protein biosynthesis.

Additionally, ER stress can be exacerbated by the impairment of endosome-to-Golgi retrograde trafficking<sup>67</sup>. Since the retromer complex, comprised of vacuolar protein sorting, is essential to the bidirectional transport between the trans-Golgi network and endosomes. It is one of the key vesicular trafficking pathways in the cell<sup>68</sup>, particularly the transport of protein to endoplasmic reticulum<sup>67,69,70</sup>.

Vacuole protein sorting appears disrupted in the presence of Mn. VPS5 mutants are hypersensitive to Mn (Fig. 1B), and the PPI network analysis implicatedprotein/genes with similar function such as Vps35, Vps29, Vps17 and PEP8 (Fig. 2). Interestingly, previous studies have reported that Mn is linked to yeast VPS1, VPS53 and PEP8<sup>71</sup>. Vesicle transport is considered to play an important role in yeast and mammalian models of ALS as well<sup>72</sup>. Furthermore, other studies have verified Mn down-regulated the expression of SNAP-25 and up-regulated the expression of VAMP-2, which interacted with Synaptophysin<sup>73</sup>. Using the FM1-43 dye (N-(3-Triethylammoniumpropyl)-4-(4-(Dibutylamino) Styryl) Pyridinium Dibromide), an excellent reagent both for identifying actively firing neurons and for investigating the mechanisms of activity-dependent vesicle cycling<sup>74</sup>, various authors verified that FM1-43-labeled synaptic vesicles treated with Mn resulted in an initial increase followed by a decrease in the number of vesicles<sup>73,75</sup>. Other studies linked Mn neurotoxicity to the disruption of genes with transport functions including *SLC30A10*, *ATP13A2* and *ZnT10*<sup>19,20</sup>.

Alternatively, Gitler *et al.*<sup>76</sup> identified that YPK9 overexpression significantly rescued the ability of proteins to leave the ER and traffic to the Golgi, which reduced the toxic effects of  $\alpha$ -syn intracellular accumulation and Mn toxicity, suggesting a close connection between genetic and environmental causes of neurodegeneration. Ypk9 is a yeast orthologue of human PARK9/ATP13A2, whose expression in animal models of PD is capable of rescuing neurodegeneration<sup>76</sup>. At the same time, Golgi dysfunction can lead to the rapid repression of rRNA and ribosomal proteins<sup>23</sup>, affecting protein biosynthesis. Indeed, we observed that translation arrest in yeast was notably increased after 24 hours of exposure to Mn (decreasing of  $\beta$ -galactosidase activity), suggesting that long or chronic exposure of Mn<sup>2+</sup> appears more effective in yeast than short or acute exposure which is similar to observations made by others<sup>11,77</sup>. We conducted the same analyses using other divalent cations such as Ca<sup>2+</sup>, Mg<sup>2+</sup> and Zn<sup>2+</sup> at equivalent or higher concentrations than used with Mn to determine if this was a general effect of metal stress and did not observe decreased rates of expression like the dose-dependent response to Mn seen in Fig. 3C. In addition, our ribosome profile analysis revealed a reduction in heavy polysomes fractions in response to Mn suggesting that Mn reduces efficiency of translation (Fig. 3B). This may be in agreement with a recent study in human SH-SY5Y cells that identified Mn-induced ER stress associated with increased phosphorylation of translation initiation factor *eIF2\alpha<sup>59</sup>*. Similar profiles have been reported when using anti-translation drugs including pactamycin and harringtonine<sup>78</sup>.

Furthermore, we verified direct impairment of protein biosynthesis, including disruption of ribosome biogenesis due to down-regulation of the genes *NOP1*, *NSR1*; although this can be partially composed through up-regulation of the gene *RPS15*. A review at the CTD<sup>48</sup> revealed that *RPS15* is a marker of Disease Progression, including memory impairment in transgenic mice modelingAD treated with copper<sup>79</sup> as well as RPL14, potentially affected by Mn, is a marker of PD), which have been observed in case of residential exposure to maneb. It is very interesting because, while paraquat is a derived of bipyridine, maneb is a polymeric complex of Mn. Unpublished studies from our group have identified maneb-induced impairment of protein biosynthesis in cerebellar granule neurons.

#### **Final Considerations**

Literature in this field has consolidated robust hypotheses regarding Mn induced-neurotoxicity and neurodegeneration that include mitochondrial dysfunction, energy impairment, oxidative stress, disruption of neurotransmitters, ER stress, neuroinflammation, DNA damage and epigenetic alterations, apoptosis, autophagy, and many others<sup>9,10,80,81</sup>. However, occasionally, the accuracy of these hypotheses is challenged in different models. All processes cited above either occur after the process of protein synthesis is completed and/or are directly linked to it. In this study we identified protein synthesis as a key target of Mn-induced toxicity in *S. cerevisiae*. Defects in protein synthesis have been documented in different neurodegenerative disorders in humans. Since Mn-induced toxicity has been linked to human neurodegenerative disorders, the data presented in the current study may provide a connection between Mn-induced toxicity and human neurodegenerative disorders through the process of protein synthesis. Altogether, our findings provide strong evidence that Mn-toxicity can occur at multiple levels simultaneously, which appear to be associated with disruption of orchestrated essential pathways including metabolism and protein biosynthesis. In this way the presented study adds to our current understanding of the Mn-induced mode of toxicity. Additional experiments with mammalian models must be conducted to validate if these findings apply to other systems.

#### Experimental

**Gene expression analysis.** Manganese sensitivity/resistance screening using yeast gene deletion array. Approximately 4700 MATa haploid yeast, S. cerevisiae strains (BY4741, MATa ura3 $\Delta$ 0 leu2 $\Delta$ 0 his3 $\Delta$ 1 met15 $\Delta$ 0) from the non-essential Gene Deletion Array (yGDA) were manually arrayed onto agar plates as previously described by Alamgir, *et al.*<sup>82</sup> in the presence or absence of sub-inhibitory concentration (a high concentration of a bioactive/toxic compound where growth of a WT strain is not completely inhibited) of MnCl<sub>2</sub> (1.35 mM). Plates were incubated at 30 °C overnight. Finally, digital images of plates were used to analyze the growth of individual colonies, by automatized visual density comparison between control and their respective Mn treatment through of the available in-house and online software "SGAtools" from the University of Toronto<sup>83</sup>. The experiment was repeated between three and five times (Supplementary Material, Table SM 1). Colonies that showed 30% reduction or more in at least three repeats were considered hits<sup>84-86</sup>.

*Transcriptomics experiment using q-PCR.* The quantitative PCR (q-PCR) assay has been used to study the effects of a gene deletion on expression under specified conditionsgene deletion in previous works<sup>87,88</sup>. Primers of selected genes were synthetized (Table 2). Total RNA was isolated from each strain, using a Qiagen RNA isolation kit; followed by cDNA construction, using an iScript cDNA synthesis kit and finally used SYBR green supermix (Bio-Rad) for the multiplex real time PCR assay; according to the instructions of the manufacturer. The quantification of mRNA was performed by q-PCR on a Rotor-Gene RG-300 from Corbett research, according to Samanfar *et al.*<sup>85</sup>.

**Protein synthesis analysis.** Total rRNA analysis. The yeast wild type strains were preincubated and grown overnight, then grown on YPD media at 30 °C to an  $OD_{600}$  of 0.8–1.0, in either the absence or presence of Mn (1.5 mM or 3 mM), for 0.75, 1 and 24 hours respectively. Total RNA was isolated from each strain using a Qiagen RNA isolation kit (RNeasy mini kit). RNA electrophoresis was carried out in 1X MOPS running buffer diluted from 10X MOPS buffer [40.8 g 3-(N-morpholino) propanesulfonic acid (MOPS); 6.8 g sodium acetate; 3.8 g ethylenediamine tetraacetic acid (EDTA)]. Volume was completed up to 1000 ml by the addition of ultrapure water treated with diethyl pyrocarbonate (DEPC), and the pH was adjusted to 7.0 using sodium hydroxide (NaOH)). The concentration of agarose used in the RNA gels was 1.2% (w/v). Samples were prepared in 80% v/v deionized formamide, heated at 65 °C for 5 minutes, then immediately cooled on ice. Before loading the samples on the gel, 1/10th of sample volume 10X RNA loading dye (0.0125 g Bromophenol Blue; 10 µl 0.5 M EDTA; 2.5 ml

ŧ	Gene Symbol	Sequence (5'->3')	)	Template strand	Length	Start	Stop	Tm	GC (%)	Self complementarity	Self 3' complementarity
		Forward primer	TCCCGCTAAAAACGCATTGA	Plus	20	516602	516621	58.48	45	4	2
1	OST2	Reverse primer	CAGCACGTCATCTGCAGTCT	Minus	20	516803	516784	60.39	55	6	3
		Product length	202								
2		Forward primer	CGCTGACAACTACCCACTGT	Plus	20	233594	233613	59.97	55	3	3
	OST6	Reverse primer	TGGCAACTCATGCCGTTACT	Minus	20	233692	233673	59.96	50	4	
		Product length	99								
3		Forward primer	TTCGGTGACTTCGTGAAGGG	Plus	20	453244	453263	59.97	55	6	2
	STT3	Reverse primer	TCAAGGCAGAAAGTCCGACC	Minus	20	453352	453333	59.97	55	5	
	5115	Product length	109		20	100002	100000	0,0,0,0			
		Forward primer	GGACCCTAATGCCGGTATGG	Plus	20	819486	819505	59.96	60	6	3
Į	DSK2	Reverse primer	TTCGTGTTGGAGCCTTCCTC	Minus	20	819578	819559	59.97	55	3	
	DORZ	Product length	93	Ivinius	20	017570	017557	35.57	35	5	1
				Plus	20	260462	269481	59.76	55	5	2
;	ADCO	Forward primer	GTTGCTGAGAGAAACGGTGC			269462					
	ARG3	Reverse primer	GCTTGGCCTGTTTCGCAAAT	Minus	20	269588	269569	60.32	50	4	2
		Product length	127								
	1011	Forward primer	ACCCAGCCTTTGGATGAAGG	Plus	20	285532	285551	59.96	55	4	
	ICL1	Reverse primer	GTTACAGAGGTGGGACGCAA	Minus	20	285764	285745	59.97	55	3	1
		Product length	233				-				
		Forward primer	CAGAGACAGACGGTGCATGT	Plus	20	772641	772660	60.04	55	4	3
	CLB2	Reverse primer	CAGCTGCTGCACACAATGAG	Minus	20	772871	772852	60.11	55	7	3
		Product length	231								
8		Forward primer	GCCAAGCTTTCCTCAATGGC	Plus	20	560815	560834	60.11	55	6	2
	CDC28	Reverse primer	GGGTCATACGCGAGGAGTTT	Minus	20	560916	560897	59.82	55	4	1
		Product length	102								
		Forward primer	TTGGCCGCTATCGTCGAAAT	Plus	20	431999	432018	60.18	50	6	3
9	rpl14A	Reverse primer	TTGCCAGCACTTTTTCGTAGC	Minus	21	432120	432100	60	47.62	4	2
	-	Product length	122								
		Forward primer	ACCTAAAACCCACCGTGGAC	Plus	20	104415	104434	59.89	55	7	3
0	rpl14B	Reverse primer	GTTGGCGGTCCCTGAACATA	Minus	20	104492	104473	60.04	55	3	2
		Product length	78								
		Forward primer	ACTGGTAAGACCGGTACCTTTT	Plus	22	555194	555215	59.03	45.45	6	2
1	TIF1	Reverse primer	GCTTGAGGAGCCTTGACAGA	Minus	20	555264	555245	59.68	55	4	
		Product length	71	1.111140	20	000201	000210	00.00		-	-
		Forward primer	TGAACATGGACGGTGACACT	Plus	20	85983	86002	59.24	50	5	3
2	LIVD2	Reverse primer	GCTTCTTCACCCATAGCGGA	Minus	20	86112	86093	59.82	55	3	
2	HYP2	-		Ivinius	20	80112	80093	39.02	33	3	2
		Product length		pl	20	500051	500070	50.76	50	2	2
		Forward primer	GCGGCGGAAATGGTTTTGTA	Plus	20	589851	589870	59.76	50	3	
3	UFD1	Reverse primer	ATTTTCCCGCCGAAGTTTGC	Minus	20	589968	589949	60.04	50	3	2
		Product length	118								
		Forward primer	CGGCGAAAGCAATCGTTCAA	Plus	20	121396	121415	60.11	50	4	3
4	UFD2	Reverse primer	GTGCCTCAAGGCTCAACTCT	Minus	20	121511	121492	59.96	55	6	1
		Product length	116								
15	CDC48	Forward primer	CCAGTACCAGGGGGGACCATA	Plus	20	237886	237905	60.03	60	4	2
		Reverse primer	CAGTGAGGAAAGGCGACCAT	Minus	20	238201	238182	60.04	55	3	2
		Product length	316								
		Forward primer	ATCGTCTACGGGAAACGCAC	Plus	20	958728	958747	60.46	55	5	1
6	UBC11	Reverse primer	AGTAGAAGAGGGTGGTTGCG	Minus	20	958827	958808	59.39	55	2	2
		Product length	100								complementarity           2           3           2           3           2           3           2           3           2           3           2           3           2           3           1           2           2           2           2           2           2           1           3           3           2           1           3           2           1           3           2           1           3           2           3           2           3           2           1           3           2           2           2           3           2           3           2           3           2           3           2           3
		Forward primer	TTGCGTCCCCAACAAAGCTA	Plus	20	289873	289892	60.18	50	4	2
17	CDC20	Reverse primer	ATTAACGGTGGTGCCCCAAT	Minus	20	290059	290040	59.96	50	6	2
		Product length	187		1			1			
	MCM2	Forward primer	GTGGCCAATCTTTCGTCTGC	Plus	20	175437	175456	59.83	55	6	2
8		Reverse primer	CGCGCTGCTCAATTATTGCT	Minus	20	175602	175583	59.97	50	7	
		Product length	166								1
		Forward primer	CTAGAGCCTTCTTGGCGTCC	Plus	20	806681	806700	60.18	60	4	2
9	NSR1	Reverse primer	CCGTCCGTATCCCAACACAT	Minus	20	806773	806754	59.82	55	2	
19	INSKI	Product length	93		20	000773	0007.54	57.02		-	-
			1 7.1	1		1	1	1	1	1	1

#	Gene Symbol	Sequence (5'->3')		Template strand	Length	Start	Stop	Tm	GC (%)	Self complementarity	Self 3' complementarity
20	NOP1	Forward primer	ATTGCCCCAGGCAAGAAAGT	Plus	20	427853	427872	60.18	50	7	1
		Reverse primer	TCTCTGCCTGGTCTGTGAGA	Minus	20	427980	427961	59.89	55	4	3
		Product length	128								
21	URA2	Forward primer	CAAATTCTGGATGGCGCCTG	Plus	20	166665	166684	59.9	55	6	2
		Reverse primer	ACGGAAGAAGCAATCGCTGA	Minus	20	166793	166774	60.04	50	6	2
		Product length	129								
	MCM2	Forward primer	GTGGCCAATCTTTCGTCTGC	Plus	20	175437	175456	59.83	55	6	2
22		Reverse primer	CGCGCTGCTCAATTATTGCT	Minus	20	175602	175583	59.97	50	7	3
		Product length	166								

Table 2. Genes selected for q-PCR analysis. Primer sequences and associated parameters are included.

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100% glycerol; 2.5 ml DEPC-treated water; mixed by vortexing and autoclaved) was added to the samples for a final concentration of  $1 \times (1 \mu g)$ .

 $\beta$ -Galactosidase expression assay. The efficiency of translation was quantified using an inducible  $\beta$ -galactosidase reporter gene in the p416 plasmid<sup>82,89</sup>.  $\beta$ -galactosidase is a model of intracellular protein synthesis that can provide a profile of aberrancy in the rate of protein synthesis and an estimate of gene expression. Thus, yeast cells transformed with p416 plasmid were preincubated for 1 hour and then exposed to a crescent toxicological curve of Mn (0.25–3 mM) and other divalent ions (Ca<sup>2+</sup>, Mg<sup>2+</sup> and Zn<sup>2+</sup> at 0.5, 1.5, 5 mM and a higher 15 mM concentration for Mg<sup>2+</sup>) for 3 hours at 30 °C, followed of spectrophotometric determination of  $\beta$ -galactosidase activity<sup>82</sup>. Metal ion concentrations were suggested by previous works<sup>90–93</sup>.

*Ribosome profile analysis.* Ribosome profiling<sup>94</sup>, allows for the monitoring of translation dynamics *in vivo*. Yeast wild type strains were preincubated 1 hr and then grown on YPD media at 30 °C to an OD<sub>600</sub> of 0.8–1.0, in the absence or presence of 3 mM Mn, for 1 hr and 24 hrs respectively at 30 °C. Immediately before harvest, cycloheximide was added to all samples, to a final concentration of 100 µg/ml, and the culture was incubated again at 30 °C for 15 minutes, followed by a cold snap in an ice water bath. Cells were harvested, washed with a cycloheximide/ water solution (100 µg/ml) and centrifuged at 4000 rpm for 4 min at 4 °C using a Sorvall SLA-1500 rotor to separate the supernatant. Cell pellets were resuspended in 10 ml of ice-cold lysis buffer A (YA buffer: 10 mM Tris-HCl [pH 7.4], 100 mM NaCl, 30 mM MgCl<sub>2</sub>, cycloheximide 50 µg/ml, heparin 200 µg/ml) and centrifuged at 4000 rpm for 4 min at 4 °C (Sorvall SS34 rotor) twice. Pellets were resuspended in 750 µl of YA buffer, lysed by vortexing with glass beads, transferred to microtubes, and centrifuged at 13000 rpm for 10 minutes at 4 °C. The supernatant was preserved for the quantitative determination of total RNA, followed by fractionation on 10-50% sucrose gradients containing 50 mM Tris-acetate [pH 7.0], 50 mM NH<sub>4</sub>Cl, 12 mM MgCl<sub>2</sub>, and 1 mM dithiothreitol. The extract was centrifuged for 2 h at 40,000 rpm using a SW40-Ti rotor in a Beckman LE-80 K at 4 °C. The polysome profiles were analyzed via a Biocomp gradient station and the absorbance was recorded at 254 nm using a spectrophotometer (Bio-Rad Econo UV monitor) coupled with the Biocomp station. In this method, free mRNAs from the top fractions were separated from polysome-associated mRNAs from the bottom fractions<sup>95</sup>.

**Protein-protein interaction (PPI) prediction and gene ontology (GO) analysis.** A PPI network can be described as a heterogeneous network of proteins joined by interactions as edges. Protein network and GO enrichment analysis were based on the data from the current project and analyzed using the STRING database (http://string-db.org)<sup>38</sup>. Additional GO analysis was conducted at the Comparative Toxicogenomic Database – CTD (http://ctdbase.org/)<sup>48</sup> to test the hypothesis of a conserved mode of action of Mn between yeast and humans. Both STRING and the CTD database were accessed on November 18<sup>th</sup>, 2018.

**Data analysis.** The results were expressed as mean  $\pm$  sem of at least three independent experiments. To detect statistically significant differences, ANOVA (analysis of variance) followed by Bonferroni's tests was be used; preceded of single t-test analysis between pairs of treatments. Fitting and statistical analyses were performed using GraphPad Prism (GraphPad 4.0 Software Inc, San Diego, CA, USA).

#### **Data Availability**

All data generated and/or analyzed during this study are included in this published article and/or its Supplementary Material Files).

#### References

- 1. Templeton, D. M. et al. Guidelines for terms related to chemical speciation and fractionation of elements. Definitions, structural aspects, and methodological approaches (IUPAC Recommendations 2000). Pure Appl. Chem. 72 (2000).
- 2. Howe, M. P. D., Malcolm, H. M. & Dobson, D. S. *Manganese and Its Compounds: Environmental Aspects.* World Health Organization (2004).
- Kenneth Klewicki, J. & Morgan, J. J. Kinetic behavior of Mn(III) complexes of pyrophosphate, EDTA, and citrate. *Environ. Sci. Technol.* 32, 2916–2922 (1998).
- Luo, X. G. et al. Gene expression of manganese-containing superoxide dismutase as a biomarker of manganese bioavailability for manganese sources in broilers. Poult. Sci. 86, 888–894 (2007).

- 5. Hafeman, D., Factor-Litvak, P., Cheng, Z., van Geen, A. & Ahsan, H. Association between manganese exposure through drinking water and infant mortality in Bangladesh. Environ. Health Perspect. 115, 1107-1112 (2007)
- 6. Ljung, K. & Vahter, M. Time to re-evaluate the guideline value for manganese in drinking water? Environ. Health Perspect. 115, 1533-1538 (2007)
- 7. Jordão, C. P., Pereira, J. L., Jham, G. N. & Bellato, C. R. Distribution of Heavy Metals in Environmental Samples Near Smelters and Mining Areas in Brazil. Environ. Technol. 20, 489-498 (1999).
- 8. Bonne Hernández, R., Oliveira, E. & Espósito, B. P. Distribution and behavior of manganese in the Alto do Paranapanema Basin. J. Environ. Monit. 11, 1236-43 (2009).
- Peres, T. V. et al. Manganese-induced neurotoxicity: A review of its behavioral consequences and neuroprotective strategies. BMC Pharmacol, Toxicol, 17 (2016).
- 10. Pfalzer, A. C. & Bowman, A. B. Relationships Between Essential Manganese Biology and Manganese Toxicity in Neurological Disease. Curr. Environ. Heal. reports 4, 223-228 (2017).
- Hernández, R. B. et al. Mechanisms of manganese-induced neurotoxicity in primary neuronal cultures: The role of manganese 11 speciation and cell type. Toxicol. Sci. 124, 414-423 (2011).
- 12. RB, H. Current Challenges about Understanding of Manganese-Induced Neurotoxicity. Toxicol. Open Access 01, 58201 (2015).
- 13. Putrament, A., Baranowska, H., Ejchart, A. & Prazmo, W. Manganese Mutagenesis in Yeast. A Practical Application of Manganese for the Induction of Mitochondrial Antibiotic-resistant Mutations. J. Gen. Microbiol. 90, 265-270 (1975).
- 14. Putrament, A., Baranowska, H., Ejchart, A. & Jachymczyk, W. Manganese mutagenesis in yeast VI. Mn2+ uptake, mitDNA replication and ER induction. Comparison with other divalent cations. MGG Mol. Gen. Genet. 151, 69-76 (1977).
- 15. Donaldson, S. G., Fox, O. F., Kishore, G. S. & Carubelli, R. Effect of manganese ions on the interaction between ribosomes and endoplasmic reticulum membranes isolated from rat liver. Biosci. Rep. 1, 727 LP-731 (1981).
- 16. Dambach, M. et al. The Ubiquitous yybP-ykoY Riboswitch Is a Manganese-Responsive Regulatory Element. Mol. Cell 57, 1099-1109 (2015)
- 17. Bray, M. S. et al. Multiple prebiotic metals mediate translation. Proc. Natl. Acad. Sci. 115, 12164 LP-12169 (2018).
- 18. Pan, T. Adaptive Translation as a Mechanism of Stress Response and Adaptation. Annu. Rev. Genet. 47, 121-137 (2013).
- Leyva-Illades, D. et al. SLC30A10 Is a Cell Surface-Localized Manganese Efflux Transporter, and Parkinsonism-Causing Mutations 19. Block Its Intracellular Trafficking and Efflux Activity. J. Neurosci. 34, 14079-14095 (2014).
- 20. Nishito, Y. et al. Direct comparison of manganese detoxification/efflux proteins and molecular characterization of ZnT10 protein as a manganese transporter. J. Biol. Chem. 291, 14773-14787 (2016).
- 21 Wang, F, Canadeo, L. A. & Huibregtse, J. M. Ubiquitination of newly synthesized proteins at the ribosome. Biochimie 114, 127-133 (2015)
- 22. English, A. R. & Voeltz, G. K. Interconnections with Other Organelles. Cold Spring Harb. Perspect. Biol. 1-16, https://doi. org/10.1101/cshperspect.a013227 (2013).
- 23. Warner, J. R. The economics of ribosome biosynthesis in yeast. Trends in Biochemical Sciences 24, 437-440 (1999).
- 24. Thomson, E., Ferreira-Cerca, S. & Hurt, E. Eukaryotic ribosome biogenesis at a glance. J. Cell Sci. 126, 4815-4821 (2013).
- Ibstedt, S., Sideri, T. C., Grant, C. M. & Tamas, M. J. Global analysis of protein aggregation in yeast during physiological conditions and arsenite stress. Biol. Open 3, 913-923 (2014).
- 26. Ingolia, N. T. Ribosome profiling: New views of translation, from single codons to genome scale. Nature Reviews Genetics 15, 205-213 (2014).
- 27 Chassé, H., Boulben, S., Costache, V., Cormier, P. & Morales, J. Analysis of translation using polysome profiling. Nucleic Acids Res. 45, e15 (2017).
- 28. Burnside, D. et al. Use of Chemical Genomics to Investigate the Mechanism of Action for Inhibitory Bioactive Natural Compounds. In Bioactive Natural Products 9-32, https://doi.org/10.1002/9783527684403.ch2 (2015).
- 29. Galván Márquez, I. et al. Disruption of protein synthesis as antifungal mode of action by chitosan. Int. J. Food Microbiol. 164, 108-112 (2013).
- Bessarabova, M., Ishkin, A., JeBailey, L., Nikolskaya, T. & Nikolsky, Y. Knowledge-based analysis of proteomics data. BMC Bioinformatics 13(Suppl 1), S13 (2012).
- 31. Rao, V. S., Srinivas, K., Sujini, G. N. & Kumar, G. N. S. Protein-Protein Interaction Detection: Methods and Analysis. Int. J. Proteomics 2014, 1-12 (2014).
- McHale, C. M. *et al.* Assessing health risks from multiple environmental stressors: Moving from  $G \times E$  to  $I \times E$ . *Mutation Research* 32. - Reviews in Mutation Research 775, 11-20 (2018).
- 33. Escher, B. I. et al. From the exposome to mechanistic understanding of chemical-induced adverse effects. Environ. Int. 99, 97-106 (2017).
- 34. Braun, R. J., Büttner, S., Ring, J., Kroemer, G. & Madeo, F. Nervous yeast: modeling neurotoxic cell death. Trends in Biochemical Sciences 35, 135-144 (2010).
- 35. Reddi, A. R., Jensen, L. T. & Culotta, V. C. Manganese homeostasis in saccharomyces cerevisiae. Chem. Rev. 109, 4722-4732 (2009).
- 36. Mason, R. P. & Giorgini, F. Modeling huntington disease in yeast: Perspectives and future directions. Prion 5, 269-276 (2011).
- 37. Büttner, S. et al. Endonuclease G mediates α-synuclein cytotoxicity during Parkinson's disease. EMBO J. 32, 3041–3054 (2013)
- 38. Szklarczyk, D. et al. The STRING database in 2017: Quality-controlled protein-protein association networks, made broadly accessible. Nucleic Acids Res. 45, D362–D368 (2017)
- Ash, D. E. Manganese in Metabolism and Enzyme Function. Manganese in Metabolism and Enzyme Function, https://doi.org/10.1016/ 39. B978-0-12-629050-9.50022-3 (1986).
- Rudgalvyte, M., Peltonen, J., Lakso, M., Nass, R. & Wong, G. RNA-Seq Reveals Acute Manganese Exposure Increases Endoplasmic 40. Reticulum Related and Lipocalin mRNAs in Caenorhabditis elegans. J. Biochem. Mol. Toxicol. 30, 97-105 (2016).
- 41 Xu, B. et al. Endoplasmic reticulum stress signaling involvement in manganese-induced nerve cell damage in organotypic brain slice cultures. Toxicol. Lett. 222, 239-246 (2013).
- Xu, B. et al. Alpha-synuclein is involved in manganese-induced ER stress via PERK signal pathway in organotypic brain slice 42. cultures. Molecular Neurobiology 49, 399-412 (2014).
- 43. Cohen, Y. et al. The yeast P5 type ATPase, Spf1, regulates manganese transport into the endoplasmic reticulum. PLoS One 8 (2013).
- 44. Polymenis, M. & Aramayo, R. Translate to divide: control of the cell cycle by protein synthesis. Microb. Cell 2, (94–104 (2015).
- 45. Dasuri, K., Zhang, L. & Keller, J. N. Oxidative stress, neurodegeneration, and the balance of protein degradation and protein synthesis. Free Radical Biology and Medicine 62, 170-185 (2013).
- Negga, R. et al. Exposure to Mn/Zn ethylene-bis-dithiocarbamate and glyphosate pesticides leads to neurodegeneration in Caenorhabditis elegans. Neurotoxicology 32, 331-341 (2011).
- 47. King, B. L., Davis, A. P., Rosenstein, M. C., Wiegers, T. C. & Mattingly, C. J. Ranking Transitive Chemical-Disease Inferences Using Local Network Topology in the Comparative Toxicogenomics Database. PLoS One 7 (2012). 48.
  - Davis, A. P. et al. The Comparative Toxicogenomics Database: Update 2017. Nucleic Acids Res. 45, D972-D978 (2017).
- 49. Kumar, K. K. et al. Cellular manganese content is developmentally regulated in human dopaminergic neurons. Sci. Rep. 4, 6801 (2014)
- 50. Tuormaa, T. E. The Adverse Effects of Manganese Deficiency on Reproduction and Health: A Literature Review. 27–29 (1996).

- Jauniaux, J. C., Urrestarazu, L. A. & Wiame, J. M. Arginine metabolism in Saccharomyces cerevisiae: subcellular localization of the enzymes. J. Bacteriol. 133, 1096–1107 (1978).
- Mao, Y., Wang, J.-D., Hung, D.-Z., Deng, J.-F. & Yang, C.-C. Hyperammonemia following glufosinate-containing herbicide poisoning: A potential marker of severe neurotoxicity. *Clin. Toxicol.* 49, 48–52 (2011).
- Patin, F. et al. Omics to Explore Amyotrophic Lateral Sclerosis Evolution: the Central Role of Arginine and Proline Metabolism. Mol Neurobiol. 54, 5361–5374 (2017).
- 54. Hu, X. P., Yang, Y. & Ma, B. G. Amino Acid Flux from Metabolic Network Benefits Protein Translation: The Role of Resource Availability. Sci. Rep. 5, 1–9 (2015).
- Shahbazian, D. et al. The mTOR/PI3K and MAPK pathways converge on eIF4B to control its phosphorylation and activity. EMBO J. 25, 2781–2791 (2006).
- 56. Darling, N. J., Cook, S. J., Krebs, J. & Moreau, M. Biochimica et Biophysica Acta The role of MAPK signalling pathways in the response to endoplasmic reticulum stress ★. BBA Mol. Cell Res. 1843, 2150–2163 (2014).
- Liu, D.-Z. & Ander, B. P. Cell cycle inhibition without disruption of neurogenesis is a strategy for treatment of aberrant cell cycle diseases: an update. *ScientificWorldJournal*. 2012, 491737 (2012).
- Kim, E. K. & Choi, E. J. Pathological roles of MAPK signaling pathways in human diseases. *Biochim. Biophys. Acta Mol. Basis Dis.* 1802, 396–405 (2010).
- Seo, Y. A., Li, Y. & Wessling-Resnick, M. Iron depletion increases manganese uptake and potentiates apoptosis through ER stress. *Neurotoxicology* 38, 67–73 (2013).
- 60. Wang, T. et al. ER stress and ER stress-mediated apoptosis are involved in manganese-induced neurotoxicity in the rat striatum in vivo. Neurotoxicology 48, 109–119 (2015).
- 61. Hetz, C. & Saxena, S. ER stress and the unfolded protein response in neurodegeneration. Nat. Rev. Neurol. 13, 477-491 (2017).
- 62. Fruhmann, G. *et al.* Yeast buddies helping to unravel the complexity of neurodegenerative disorders. *Mechanisms of Ageing and Development* **161**, 288–305 (2017).
- Park, J. H. et al. SLC39A8 Deficiency: A Disorder of Manganese Transport and Glycosylation. Am. J. Hum. Genet. 97, 894–903 (2015).
   Potelle, S. et al. Glycosylation abnormalities in Gdt1p/TMEM165 deficient cells result from a defect in Golgi manganese
- homeostasis. *Hum. Mol. Genet.* 25, 1489–1500 (2016).
  65. Allan Drummond, D. & Wilke, C. O. The evolutionary consequences of erroneous protein synthesis. *Nature Reviews Genetics* 10, 715–724 (2009).
- 66. Ruddock, L. W. & Molinari, M. N-glycan processing in ER quality control. J. Cell Sci. 119, 4373-4380 (2006).
- 67. Johannes, L. & Popoff, V. Review Tracing the Retrograde Route in Protein Trafficking. 5, 1175-1187 (2008).
- Progida, C. & Bakke, O. Bidirectional traffic between the Golgi and the endosomes machineries and regulation. 1–12, https://doi. org/10.1242/jcs.185702 (2016).
- 69. Tsvetanova, N. G. The secretory pathway in control of endoplasmic reticulum homeostasis. 4, 28-33 (2013).
- Bonifacino, J. S. & Rojas, R. Retrograde transport from endosomes to the trans-Golgi network. *Nat. Rev. Mol. Cell Biol.* 7, 568 (2006).
   Chesi, A., Kilaru, A., Fang, X., Cooper, A. A. & Gitler, A. D. The Role of the Parkinson's Disease Gene PARK9 in Essential Cellular Pathways and the Manganese Homeostasis Network in Yeast. 7 (2012).
- Van Damme, P., Robberecht, W. & Van Den Bosch, L. Modelling amyotrophic lateral sclerosis: progress and possibilities. *Dis. Model. Mech.* 10, 537–549 (2017).
- Wang, C. et al. Manganese exposure disrupts SNARE protein complex-mediated vesicle fusion in primary cultured neurons. Environ. Toxicol. 32, 705–716 (2017).
- Lee, S. C. & Pappone, P. A. ATP can stimulate exocytosis in rat brown adipocytes without apparent increases in cytosolic Ca2+ or G
  protein activation. *Biophys. J.* 76, 2297–2306 (1999).
- Wang, C. et al. Inhibition of Calpains Protects Mn-Induced Neurotransmitter release disorders in Synaptosomes from Mice: Involvement of SNARE Complex and Synaptic Vesicle Fusion. Sci. Rep. 7 (2017).
- Gitler, A. D. et al. Alpha-synuclein is part of a diverse and highly conserved interaction network that includes PARK9 and manganese toxicity. Nat Genet. 41, 308–315 (2009).
- Hernández, R. B., Nishita, M. I., Espósito, B. P., Scholz, S. & Michalke, B. The role of chemical speciation, chemical fractionation and calcium disruption in manganese-induced developmental toxicity in zebrafish (Danio rerio) embryos. J. Trace Elem. Med. Biol. 32, 209–217 (2015).
- Al-Jubran, K. et al. Visualization of the joining of ribosomal subunits reveals the presence of 80S ribosomes in the nucleus. Rna 19, 1669–1683 (2013).
- Yu, J. et al. Identification of the Key Molecules Involved in Chronic Copper Exposure-Aggravated Memory Impairment in Transgenic Mice of Alzheimer's Disease Using Proteomic. Analysis. J. Alzheimer's Dis. 44, 455–469 (2015).
- Tarale, P. et al. Global DNA methylation profiling of manganese-exposed human neuroblastoma SH-SY5Y cells reveals epigenetic alterations in Parkinson's disease-associated genes. Arch. Toxicol. 91, 2629–2641 (2017).
- Bevan, R., Ashdown, L., McGough, D., Huici-Montagud, A. & Levy, L. Setting evidence-based occupational exposure limits for manganese. *Neurotoxicology* 58, 238–248 (2017).
- Alamgir, M., Erukova, V., Jessulat, M., Azizi, A. & Golshani, A. Chemical-genetic profile analysis of five inhibitory compounds in yeast. BMC Chem. Biol. 10 (2010).
- Wagih, O. et al. SGAtools: One-stop analysis and visualization of array-based genetic interaction screens. Nucleic Acids Res. 41 (2013).
- Memarian, N. et al. Colony size measurement of the yeast gene deletion strains for functional genomics. BMC Bioinformatics 8, 117 (2007).
- Samanfar, B. et al. The sensitivity of the yeast, Saccharomyces cerevisiae, to acetic acid is influenced by DOM34 and RPL36A. PeerJ 2017 (2017).
- Galván Márquez, I. et al. Zinc oxide and silver nanoparticles toxicity in the baker's yeast, Saccharomyces cerevisiae. PLoS One 13, e0193111–e0193111 (2018).
- Costa, C. et al. Quantitative Real-Time PCR Assay for Rapid Identification of Deletion Carriers in Hemophilia. Clin. Chem. 50, 1269 LP-1270 (2004).
- Traverso, M. et al. Multiplex real-time PCR for detection of deletions and duplications in dystrophin gene. Biochem. Biophys. Res. Commun. 339, 145–150 (2006).
- Alamgir, M., Eroukova, V., Jessulat, M., Xu, J. & Golshani, A. Chemical-genetic profile analysis in yeast suggests that a previously uncharacterized open reading frame, YBR261C, affects protein synthesis. BMC Genomics 9 (2008).
- 90. Loukin, S. & Kung, C. Manganese Effectively Supports Yeast Cell-Cycle Progression in Place of Calcium. 13 (1995).
- Blackwell, K. J. & Tobin, J. M. Manganese toxicity towards Saccharomyces cerevisiae: Dependence on intracellular and extracellular magnesium concentrations. 751–757 (1998).
- 92. Daly, M. J. Manganese Complexes: Diverse Metabolic Routes to Oxidative Stress Resistance in Prokaryotes and Yeast. 19 (2013).
- 93. Liang, Q. & Zhou, B. Copper and Manganese Induce Yeast Apoptosis via Different. Pathways. 18, 4741-4749 (2007).
- 94. Esposito, A. M. et al. Eukaryotic Polyribosome Profile Analysis. J. Vis. Exp., https://doi.org/10.3791/1948 (2010).
- Faye, M. D., Graber, T. E. & Holcik, M. Assessment of Selective mRNA Translation in Mammalian Cells by Polysome Profiling. J. Vis. Exp., https://doi.org/10.3791/52295 (2014).

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#### **Author Contributions**

Professors Hernández and Golshani are responsible for conceptual development of this study, co-executor of all experiments, and coordinators of the grants that supported this work. H. Moteshareie, a PhD candidate, contributed to translation experiments as well as data analysis. D. Burnside, a PhD candidate, contributed to the bioinformatic approaches and data analysis. Professor McKay contibuted to the ribosome profile analysis. All authors contributed to the writing of the manuscript.

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