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#### Adaptive response of yeast cells to triggered toxicity of phosphoribulokinase 1

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#### 12 Abstract

Adjustment of plasmid copy number resulting from the balance between positive and negative impacts 13 14 of borne synthetic genes, plays a critical role in the global efficiency of multistep metabolic engineering. 15 Differential expression of co-expressed engineered genes is frequently observed depending on growth phases, metabolic status and triggered adjustments of plasmid copy numbers, constituting a dynamic 16 17 process contributing to minimize global engineering burden. A yeast model involving plasmid based 18 expression of phosphoribulokinase (PRKp), a key enzyme for the reconstruction of synthetic Calvin cycle, was designed to gain further insights into such a mechanism. A conditional PRK expression 19 20 cassette was cloned either onto a low (ARS-CEN based) or a high (2-micron origin based) copy 21 number plasmid using complementation of a *trp1* genomic mutation as constant positive selection. 22 Evolution of plasmid copy numbers, PRKp expressions, and cell growth rates were dynamically 23 monitored following gene de-repression through external doxycycline concentration shifts. In the 24 absence of RubisCO encoding gene permitting metabolic recycling, PRKp expression that led to 25 depletion of ribulose phosphate, a critical metabolite for aromatic amino-acids biosynthesis, and accumulation of the dead-end diphosphate product contribute to toxicity. Triggered copy number 26 27 adjustment was found to be a dynamic process depending both on plasmid types and levels of PRK 28 induction. With the ARS-CEN plasmid, cell growth was abruptly affected only when level PRKp expression exceeded a threshold value. In contrast, a proportional relationship was observed with the 29 2-micron plasmid consistent with large copy number adjustments. Micro-compartment partitioning of 30 bulk cultures by embedding individual cells into inverse culture medium/oil droplets, revealed the 31 32 presence of slow and fast growing subpopulations that differ in relative proportions for low and high 33 copy number plasmids.

34 **Keywords:** plasmid burden, cell toxicity response, population heterogeneity, metabolic engineering

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## 39 1. Introduction

40 Yeast and E. coli are major industry relevant microorganisms used for bulk chemicals or specialized productions (Borodina and Nielsen, 2014) (Chen et al., 2013) (Khatun et al., 2017) (Kwak and Jin, 2017) 41 42 (Kim et al., 2017) (Wells and Robinson, 2017). ARS-CEN and 2µ-replicon based S. cerevisiae plasmids 43 are commonly used for metabolic engineering (Krivoruchko et al., 2011) (Gnügge and Rudolf, 2017) (Da Silva and Srikrishnan, 2012). In the case of ARS-CEN plasmids, replication and partitioning 44 45 between daughter cells are synchronous with chromosomal DNA and copy number is maintained at about a single copy per cell (Clarke and Carbon, 1980). In contrast, 2µ-replicon based plasmids are 46 47 present with a highly variable copy number (10-40 copies per haploid genome) depending on engineering types and growth conditions (Gerbaud and Guérineau, 1980) (Futcher and Cox, 1984) 48 49 (Kazemi Seresht et al., 2013) (Gnügge et al., 2016). Plasmid replication has a fitness cost in addition to 50 specific positive or negative effects associated with included expression cassettes (Da Silva and 51 Srikrishnan, 2012) (Futcher and Cox, 1983) (Görgens et al., 2001). The burden associated with copy number was evaluated to affect growth of the yeast cell by ~0.2% per copy for 2µ-based plasmid 52 53 (Harrison et al., 2012), independently of expression cassettes. Similar data has been obtained for 54 multicopy plasmid in E. coli (Bailey, 1993). In response, cells with high-copy number plasmids are 55 counter-selected resulting into copy number adjustment. Promoter strengths of expressed gene, strain 56 ploidy and selection marker nature can similarly affect cell growth (Kazemi Seresht et al., 2013) (Görgens et al., 2001) (Karim et al., 2013) (Çakar et al., 1999) (Ugolini et al., 2002). For example, 57 58 auxotrophy complementation markers have been classified in decreasing order, HIS ~TRP > URA > 59 LEU, based on their associated plasmid burden (Karim et al., 2013).

60 Copy number of episomal DNA affects expression of embedded gene(s). This generally results in an 61 advantage with multi-copy plasmids when high level expression of a single heterologous protein is 62 needed. Depending on the host micro-organism considered, expression cassettes involved in multistep 63 engineering can be scattered between genomic and episomal elements. In the case of S. cerevisiae, availability of a large range of low and high copy number vectors makes multiple plasmid engineering 64 generally easier and more versatile to implement. Modulation of gene expressions resulting from 65 relative copy number changes in addition to the use of variable promoter strength plays a critical role in 66 67 tuning multi-step metabolic coupling. Copy number of plasmids, like the 2µ-based yeast replicon, has a tendency to naturally adjust in response to the balance between positive/negative selections, generally 68 to limit accumulation of potentially toxic metabolite intermediates (Karim et al., 2013). 69

70 However, and while they are regulated by complex mechanisms, multi-copy plasmid replication and 71 their distribution in daughter cells remains in part stochastic (Yen-Ting-Liu et al., 2014). This results into 72 variable balances between coupled activities from cell to cell. Such effects might significantly alter 73 productivity depending on the possibility of diffusion of accumulated metabolic intermediates between 74 cells. In contrast, heterogeneity of gene expression between cells can be an advantage to survive 75 external stress and contribute to robustness (Holland et al., 2014) (Guyot et al., 2015). Latest technological advancements give the possibility to study in more details plasmid encoded gene 76 77 expression in individual cells. Stochastic fluctuation of gene transcription and translation at the single 78 cell level are additional contributors to phenotypic diversity of clonal cells (Avery, 2006) can be 79 evidenced by flow cytometry or time-lapse microscopy of fluorescently labelled cells (Bódi et al., 2017) 80 (Talia et al., 2007), milli- or micro-fluidic technologies allow monitoring individual cell growth-rate in large populations (Grünberger et al., 2014) (Damodaran et al., 2015) (Grünberger et al., 2017) (Boitard 81 82 et al., 2012), while quantification of DNA molecules by droplet digital PCR (ddPCR) combined with cell 83 sorting using flow cytometry allows highly precise determination of plasmid copy number (Jahn et al., 84 2015) (Jahn et al., 2014).

85 Carbon dioxide capture involving reconstruction of Calvin cycle was reported both in E.coli and S. 86 cerevisiae (Watson et al., 2016, Guadalupe-Medina et al., 2013). A critical step of this engineering is 87 the conversion by the PRKp of the natively present ribulose-5-phosphate into the corresponding 1, 5-88 diphosphate, the substrate of the RuBisCO carbon dioxide fixing enzyme. When expressed alone, 89 PRKp activity is highly toxic, both for E.coli and S. cerevisiae, due to the resulting depletion of the ribulose 5-phosphate pool, which is critical for aromatic amino-acid and nucleotide biosynthesis, and to 90 91 the accumulation of dead-end diphosphate product. Successful reconstruction of a Calvin cycle thus 92 critically depends on the balanced expression level of the PRKp in the absence of the multicomponent 93 biochemical regulations that controls PRKp activity in natural photosynthetic organisms (Zhuang and Li, 94 2013). A synthetic model was built in yeast to evaluate how adjustments to average plasmid copy 95 number occur following conditional promotor controlled changes in PRKp expressing cells.

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## 97 2. Materials and methods

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## 99 **2.1. Yeast strains and plasmids**

Plasmids pPRK-CEN (ARS416-CEN4, HA tagged *S. elongatus PRK* gene under the transcriptional
 control of the TET*O7* promoter and TRP1 selection marker) and pPRK-2μ (2μ-origin of replication
 associated to the same functional cassettes) were used to transform *Saccharomyces cerevisiae* CENPK1605 strain (MATa *leu2-3,112 trp1-289 ura3-52*). Resulted strains were named 1605-PRK-CEN
 and 1605-PRK-2μ respectively.

## 105 **2.2. Media, growth conditions and sampling.**

106 The strains were grown at 30°C in YNB-trp liquid or solid (20 g/l of Agar) medium, containing 0.67% 107 (w/v) Yeast Nitrogen Base with ammonium sulfate (Euromedex) and 2% (w/v) glucose and completed 108 with drop-out synthetic mix without tryptophan (USBiological).

109 The frozen cells were spread on a plate containing solid YNB-trp with 2  $\mu$ g/ml of doxycycline (Dox, 110 Sigma-Aldrich). After 48 hours incubation at 30°C, cells were collected and washed three times with 111 YNB-trp without Dox and resuspended in the different liquid media supplemented with three different 112 concentrations of Dox: 0, 0.2 or 2  $\mu$ g/ml at OD<sub>600</sub> 0.01. Cell growth over time was monitored based on 113 OD<sub>600 nm</sub>. The cell concentration was deduced using the equivalence between 1 OD<sub>600</sub> = 10<sup>7</sup> cells/ml. 114 Every two hours, a volume of culture was sampled for qPCR and PRKp activity measurements. The 115 samples were centrifuged (5 min, 13000 rpm, 4°C), supernatant removed and cells stored at -80°C.

## 116 **2.3. Yeast cell lysis and total DNA extraction.**

Frozen yeast cells were resuspended in lysis buffer (10 mM Na-phosphate [pH 7.5], 1.2 M sorbitol, 2.5 mg/ml Zymolyase 20T Euromedex UZ1000) and incubated for 10 min at 37°C to digest the cell wall. Cell suspension was temperature cycled at 94°C for 15 min, –80°C for 5 min, and 94°C for 15 min (Moriya et al., 2006). Centrifuged supernatant *containing DNA* was stored at -20°C before Q-PCRs analysis.

## 2.4. Real-time Q-PCR.

123 The plasmid copy number was estimated by comparing the relative quantity of plasmid encoded *PRK* 124 gene to single copy chromosomal *ALG9* gene. The estimated plasmid copy number was calculated by 125  $2^{\Delta Ct(ALG9-PRK)}$  (Moriya et al., 2006). The DNA levels were analyzed using the MyIQ real-time PCR system 126 from Bio-Rad with the software Bio-Rad iQ5 2.0. The Ct were determined by the software. Each sample 127 was tested in duplicate in a 96-well plate (Bio-Rad, CA). The reaction mix (20 µl final volume) was 128 composed of 10 µl of Sso Advanced Universal SYBR Green Supermix (Bio-Rad), 0.4 µl of each primer 129 (Table S1. *Alg9* sequences used for a described in (Teste et al., 2009)) at 0.2  $\mu$ M final concentration, 130 5.2  $\mu$ I water, and 4  $\mu$ I of a 1:10 dilution of the DNA samples. A blank (no template) and a positive 131 control were also included in each assay. The thermocycling program consisted of one hold at 95°C for 132 30 s followed by 40 cycles of 10 s at 95°C and 45 s at 54°C. After the amplification, a melting curve 133 analysis with a temperature gradient of 0.1°C/s from 70 to 95°C was performed to verify PCR 134 specificity, contamination and the absence of primer dimers.

## 135 **2.5. HPLC-MS determination of PRK activity.**

Cell pellets were resuspended in two volumes of cold lysis buffer (100 mM Tris/HCl buffer [pH7.9], 10 mM MgCl<sub>2</sub>, 100 mM NaCl), the suspension was put in a FastPrep tube filled with one volume of 500 μm glass beads (Sigma-Aldrich). The cells were broken using a FastPrep FP120 (MPBiomedicals) with a setting of 6.0 m/s and 6 cycles of 20 s 'on' / 20sec 'off' in ice. The tubes were centrifuged (13 000 rpm, 4°C, 5 min) and the supernatant (containing the cell extract) was recovered and stored at - 80°C. Prior to use, the protein extract was centrifuged again (13 000 rpm, 4°C) in order to eliminate aggregates. Total protein content was determined by using the Bradford assay (Sigma Aldrich).

The PRKp activity was quantified by monitoring conversion of ribulose-5-phosphate to the 1,5diphosphate derivative. Protein extracts (12.5 µl) in a 96-well plate were mixed on ice with 12.5 µl of 4X assay buffer (400 mM Tris [pH7.9], 40 mM MgCl<sub>2</sub>, 400 mM NaCl, 8 mM ATP). Reaction was initiated by 25 µl of 2mM ribulose-5-phosphate (Sigma-Aldrich) in water. The microplate was incubated for 30 min at 30°C and the enzymatic reaction was stopped by heating for 7 min at 90°C. The plate was centrifuged and supernatants diluted two times with water and stored at -80°C before analysis.

HPLC analysis was performed on Waters separation module 2790 coupled to Waters micromass
ZQ2000. Separation was achieved on a Sheri-5 RP185 column (100–2.1 mm) (PerkinElmer) with
mobile phase consisting of tributylamine acetate (TBA) pH5.7 and acetonitrile (ACN). Elution was
performed at 1ml/min with 100% TBA for 1 min, a 100:0 to 70:30 TBA:ACN linear gradient for 15 min,
and a 70:30 to 0:100 TBA:CAN linear gradient for 18 min. Ions at m/e = 229.0 (ribulose-5-phosphate),
309.0 (ribulose-1.5-biphosphate), 426.3 (ADP) and 506.3 (ATP) were monitored. PRK activity was
expressed in µmoles of ribulose-1,5-biphosphate formed per min and mg of total proteins.

156 The enzymatic activity measurement was carried out starting from 13 hours of incubation as cell 157 quantities in earlier time points were too low to obtain a detectable activity.

#### 158 **2.6. Observations in reverse emulsion.**

159 Microfluidic devices (droplets generation chip and observation chambers (Fig. S1) were provided by the 160 Laboratory Colloïdes et Matériaux Divisés (LCMD) from Ecole Supérieure de Physique et Chimie 161 Industrielles of Paris (ESPCI). To generate the emulsion, cultures were diluted to  $OD_{600} = 0.015$  in 162 order to encapsulate mostly a single cell per droplet. In such conditions of limit dilution, a large majority 163 of droplets remained empty (Fig.S1D). The emulsion was made by flow-focusing the cell suspension 164 stream with two streams of HFE7500 fluorinated oil (3M) containing 2% (w/w) 008-FluoroSurfactant 165 (RAN Biotechnologies) (Boitard et al., 2012). The droplets were incubated at 30°C in a 1.5 ml tube. 166 After 24 hours of incubation at 30°C, a monolayer of droplets was observed in a custom-made glass 167 chamber with 40-µm depth using a direct microscope LEICA DM4000B. Snapshots were taken with 168 LEICA DFC300FX camera. Three classes of growth were differentiated: droplets with no or weak 169 growth (1 or 2 cells/droplet), droplets with few cell divisions (3 to 10 cells/droplet) and droplets with 170 many cell divisions (more than 10 cells/ droplet). About a hundred droplets exhibiting each cell growth 171 phenotype were counted.

## 173 **3. Results and discussions**

## 174 **3.1. Experimental cell model**

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175 S. cerevisiae cells were transformed with a low copy number pPRK-Cen or a high copy number 2-176 micron origin based pPRK-2µ plasmid bearing a synthetic cassette encoding a PRK synthetic gene 177 under the transcriptional control of a Dox repressed (tet-off) promoter (Dingermann et al., 1992). ARS-178 CEN plasmids synchronously replicate with chromosomal material and are generally present in yeast at 179 a single copy (in average between 1 and 2 due replication during cell division). In contrast, copy number of 2µ-plasmids can be highly variable, ranging from single copy when counter-selected, to 180 181 values than can exceed 80 when they are strongly positively selected. ARS-CEN plasmids are fairly 182 stable but 2µ-plasmids can be easily lost (typically 5-10% per generation) during cell division due to 183 unequal daughter cell repartition. Their average copy numbers exhibit a large distribution making population of transformed cells heterogeneous. The two plasmid types contained a native TRP1 gene 184 185 as positive selection marker complementing a genomic trp1 mutation. The transcriptional efficiency of 186 the tet-off synthetic promoter driving PRKp expression was controlled by the Dox concentration in a 187 pseudo-log manner due to the presence of multiple enhancer repeats. Dose-response adjustments were performed to select Dox concentrations leading to clear and reproducible differences of growth 188 189 rates (high, medium, slow) for the strain transformed by the multi-copy plasmid. The same 190 concentrations were subsequently used for experiments involving the ARS-CEN plasmid.

191 Particular attention was drawn to define controlled and reproducible culture conditions. For a given level 192 of PRKp expression, toxicity (as judged by cell growth rate), can depend on initial cell metabolic status. 193 It was thus critical to define reproducible culture conditions and to secure the initial absence of PRKp 194 expression. Growth of frozen cell stock on petri dishes to obtain isolated clones followed by clone 195 pooling, was found to be an optimal starting material. The next step was to define three Dox 196 concentrations causing undetectable, medium, and strong counter-selection during the subsequent 197 liquid culture. For experiments, a controlled shift (lowering) of Dox concentration was required to induce 198 PRKp expression following the initial liquid pre-culture at high Dox (2 µg/ml) concentration. Conditions minimalizing cell stress associated during this step with external factors like centrifugation, temperature 199 200 or culture media changes were determined using reproducibility of growth rates and plasmid copy 201 number evolution as criteria. Time series determinations of plasmid copy number and PRKp activities 202 were performed by sampling bulk cultures following Dox concentration changes as illustrated in Fig.1. 203 To evaluate the growth phenotypes of individual cells, culture samples were diluted with fresh culture 204 media to generate water-in-oil emulsion of droplets. The dilution was adjusted so that the majority of 205 droplets were empty or contained a single cell.

## 3.2. Bulk cell growths as a function of plasmid type and induction.

207 1605-PRK-CEN and 1605-PRK-2µ strains were cultivated at the three Dox concentrations previously 208 determined leading to repressed, intermediate and fully induced PRKp expressions (Fig. 2). In the case 209 of the 1605-PRK-CEN strain, similar growth curves were observed for the repressed (Dox= $2 \mu g/ml$ ) and 210 intermediate (Dox=0.2 µg/ml) expression states (Fig. 2A). In contrast, cells 1605-PRK-2µ exhibited 211 three clearly distinct growth behaviors depending on Dox concentrations (Fig2.B). In the conditions of 212 full induction, growth rate was significantly faster for cells transformed by the pPRK-CEN plasmid in 213 comparison to the 2µ-plasmid case. However, a delay of about 7 hours of culture, (3-4 cell doubling) 214 was needed to establish this difference. This delay could correspond to the duration required for PRK 215 gene induction and corresponding protein accumulation.

The above observations established that for a low copy number plasmid, intermediate Dox level does not allow PRKp to reach expression levels that affect cell growth. Such a situation was in contrast to the full induction of the pPRK-CEN plasmid or for full and intermediate induction levels of the multi-copy

220 plasmid. In the latter case, growth inhibition was stronger with the multi-copy plasmid. This experiment 221 demonstrated that the experimental model allowed us to define at least four types of PRKp expression/ 222 growth phenotype relationships (none, intermediate, strong and maximal effects). Consequently, for 223 similar expression cassettes and induction levels, observed effects were much more marked with 2u-224 plasmids. Careful examination of growth curves evidenced that for the intermediate induction level and 225 the 2µ-plasmid, inhibition of growth decreases with time. After 15h of partial induction, the growth rate 226 for the 1605-PRK-2µ cells reached similar value to the one observed in the fully repressed condition. 227 This suggested that cells transformed with the 2µ-plasmid might be able to adjust the level of toxicity by 228 reducing copy number to reach a situation similar to the one observed with the ARS-CEN-based 229 plasmid. At this point, it is important to note that a threshold of PRKp expression level was required to 230 affect cell growth and that plasmid copy number adjustment might in some way compensate for initial 231 difference of PRK expression. These findings will be further confirmed by direct analysis of plasmid 232 copy number and PRKp activity changes during time courses.

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#### 3.3. Plasmid copy number and PRK activity relationships with cell growth phenotypes

Time courses of plasmid copy numbers and PRKp activities were monitored during the same cultures 235 as the growth curves previously described (Fig.3). Plasmid copy number quantifications were 236 237 normalized using the single chromosomal copy of the ALG9 gene in order to correct for DNA recovery 238 yields (Fig.3 A&B). Concerning the 1605-PRK-CEN strain, plasmid copy number remained in the 0.8 to 239 1.6 copy/cell range independently of PRKp expression levels and culture durations. This confirmed that 240 the ARS-CEN copy number remained under the control of mechanisms similarly regulating 241 chromosomal DNA replication. Cells transformed with the 2µ-plasmid exhibited a higher copy number 242 (12-14 copies per cell) in the Dox repressed state. This level remained constant within a margin of error 243 during the pre-culture and the subsequent 20h of culture at 2 µg/ml Dox. Such a high copy number is 244 standard for plasmids involving the 2µ-origin in the absence of strong positive or negative selection 245 (Jordan et al., 1996). Dox concentration shifts (from 2 to 0.2 µg/ml or absence) induced partial or full 246 enzyme expression and caused a clear and progressive decrease (more than 2 fold in 15h) of plasmid 247 copy number with a similar time dependence and that extended to the two conditions. However, the 248 final copy number (~5-6 copies/cell) remained significantly higher than the one observed for ARS-CEN 249 plasmids. Observation of similar copy number values for the partial and full induction contrasted with 250 the differential impact previously illustrated on growth curves. However, this finding has to be mitigated 251 considering that expressed PRK activities and metabolic disturbance might only partially reflect gene 252 copy numbers (see latter).

253 To be able to better interpret results, PRKp activities were quantified into cell extracts obtained from the same experiments (Fig.3 C & D). While copy numbers for ARS-CEN-constructs were identical 254 255 regardless of Dox concentrations and induction durations, associated PRKp activities markedly differed. 256 Activities appeared fairly independent of culture duration for the full and partial induction conditions but 257 exhibited some increase at the shorter times for the lower PRK expression level. These results also 258 show that in the fully repressed state, some residual PRKp expression was still present while being 259 100-fold lower than ones observed at maximal induction. From the ensemble of these results and the 260 growth observations, the threshold for PRKp activities able to impact cell growth was evaluated to be 261 ~10 nmoles/min/mg of total proteins. PRKp activity levels for the 2µ-construct followed similar time 262 courses in experiments involving partial and full induction, consistent with similar copy number 263 evolutions. However, for technical reasons (low cell density) the initial time course of PRKp activities 264 cannot be accurately determined during the first 12 hours of incubation (arbitrary dotted on the figure) 265 following DOX concentration shifts. During this initial period, a simple relationship between copy 266 number and expressed activity is not expected. This transient phase results from time required for 267 transcriptional de-repression and protein accumulation in the growing population. Final protein level is rarely expected to be proportional to transcription and copy numbers (McManus et al., 2015) (Barrett et al., 2012) (Wethmar et al., 2010) (Tang and Amon, 2013).

270 PRKp activities reached similar levels for partial or full induction of the 2µ-construct and induction times 271 ranging from 12 to 20h, when effects on cell growth rates markedly differed (Fig. 2 and 3). This lack of 272 correlation was not observed for the ARS-CEN construct that featured stable copy number during 273 PRKp induction course. It is thus tempting to associate these contrasting behaviors to some adaptation 274 associated with plasmid properties. Growth curves (Fig. 2) upon full induction of PRKp expression can 275 be accurately simulated by a model (data not shown) involving a mix of two subpopulations, one 276 corresponding to dying cells expressing PRKp above a lethal threshold and the other corresponding to 277 still efficiently growing cells expressing lower PRKp levels. Depending on parameters (dying rate and 278 cell division time) and proportions of the two subpopulations, growth arrest after few generations or only 279 reduced apparent growth rates are predicted. Development of such heterogeneity within an initially 280 clonal population might appear surprising. In fact, it could be easily explained by the initial distribution of copy number for the 2µ-constructs that is absent with ARS-CEN plasmids. In such conditions, PRKp 281 282 expression in cells initially featuring high plasmid copy number will rapidly be lethal. In contrast, a nonlethal effect is expected for cells initially featuring a lower copy number, preserving potentiality for cell 283 284 division and allowing further lowering of copy number through unequal plasmid repartition. Such 285 mechanism is not expected with ARS-CEN construct and appeared globally fully consistent with 286 observations.

#### 287 **3.4. Micro-compartment based analysis of toxicity adaptation mechanisms**

At this point, and while reconciliation of growth phenotypes, copy number evolution and PRKp 288 289 expression could appeared generally good enough, potential impact of the copy number heterogeneity 290 associated with the 2µ-construct has to be confirmed. Assuming a population of cells in the bulk culture 291 containing heterogeneous copy numbers of the 2u-construct, different phenotypes must be evidenced 292 by isolating and monitoring growth of individual cells into micro-compartments. A microfluidic device, 293 provided by the LCMD (Fig.S1), consisting of a water in oil emulsion forming unit and an observation 294 chamber was used for such purpose following micro-compartmentation of induced or repressed bulk 295 cultures. Samples withdrawn after 10h liquid culture at different Dox concentration were diluted (same 296 culture media and Dox concentrations) in order to generate droplets containing mostly no cell or single 297 cells. The droplets were observed after 24h of additional incubation at 30°C and the number of cells per 298 droplet were counted to evaluate growth potentiality. Counts were roughly classified into three groups: 299 no growth (dead cells), 4-10 cells and more than 10 cells/droplet (Fig. 4A).

300 Control experiments with cells transformed with plasmids lacking the PRKp expression cassette led to 301 droplets containing only fast growing cells indicating that encapsulation did not induce growth heterogeneity in the absence of PRK expression. Similarly, for cells with the fully repressed PRKp 302 303 expression, a large majority (70% for the 2µ-based and 83% for ARS-CEN-based constructs) of 304 droplets contained more than 10 cells following incubation (Fig. 4A and B, Table S2). In contrast, a near absence of growth (1 to 3 cells per droplet) or some limited growth (4 to 10 cells per droplet) was 305 306 observed for the majority of droplets containing cells encapsulated from a fully induced (no DOX) bulk 307 culture. Partial induction of 2µ-construct containing cells in bulk culture resulted after micro-308 compartmentation in a more balanced distribution of the three types of growth. In the same conditions 309 (repressed and partial induction), the fast-growing subpopulation was always predominant with ARS-CEN-constructs. The small proportion of droplets containing non-growing cells observed in the 310 311 repressed state both with the 2µ- and the ARS-CEN constructs, likely resulted from a low proportion of 312 plasmid-free cells having accumulated during the bulk culture. This was confirmed by the observation of 313 a 98% survival rate for repressed cells transformed by the  $2\mu$ -construct when further cultivated on a 314 medium supplemented with tryptophan.

315 This work suggested that growth inhibition phenotypes observed upon controlled PRKp expression 316 mostly resulted from population heterogeneity preexisting in bulk cultures. Comparison of growth 317 behaviors in bulk (Fig 2) and in droplets (Fig 4B) illustrated that the micro-fluidic approach was more 318 prone to detect moderate toxicity of gene expression than analysis of growth rates in bulk cultures. For 319 the multicopy plasmid construction, a large majority (63+/-6%) of droplets featuring no growing cells 320 were counted in the absence of Dox, when 70+/-7% of droplets accumulated more than 10 cells in the 321 fully repressed condition (Dox= 2 µg/ml). Approximatively the same proportions of droplets containing 322 no growing, 4-10 cells/droplet or more than 10 cells/droplet were observed with the 2µ-constructs and 323 an intermediate (0.2 µg/ml) Dox concentration. These results are in accordance with the growth curves 324 shown in Fig 2 and Table 1 and illustrated three clearly distinct growth behaviors depending on Dox 325 concentrations. Concerning the ARS-CEN-construct, 83+/-13% and 61+/-16% of droplets contained 326 more than 10 cells were counted for the fully repressed and intermediate Dox conditions respectively. 327 In contrast, only 19+/-8% of droplets contained 10 cells or more were observed for fully induced 328 condition (no Dox). These results are consistent with the similarity of growth curves in the repressed 329 and intermediate expression states. Thus differential growth in droplets encapsulating cells from a bulk 330 liquid culture likely resulted mostly from the preexisting copy number heterogeneity in the population 331 with an additional contribution of cells having lost their plasmid during the bulk culture.

### 332 Conclusions

333 PRKp activity is toxic by interfering with critical metabolic branches involved in amino-acid and 334 nucleotide biosynthesis. This resulted in a clear-cut threshold value for toxicity of PRKp expression that 335 plays the role of amplifier for the functional impact of the natural scattering of 2µ-construct copy 336 number. Our model allowed us to address how yeast cells transformed with plasmids involving ARS-337 CEN- and 2µ-origin and carrying a conditional PRKp expression cassette responded to the conditional 338 protein expression through adjustment of plasmid copy number, gene expression, and finally cell 339 growth rates. The PRKp expression model is of particular interest in constituting a key step for the 340 reconstruction of synthetic microorganisms able to capture (or recapture) carbon dioxide through an 341 artificial Calvin cycle. However, the model has a more general interest for tuning strategies of 342 engineering involving sequence of critically balanced enzymatic steps prone to accumulate toxic 343 intermediates. Control of plasmid copy number is potentially a powerful approach for engineering 344 optimization. Natural unequal plasmid partition over cell divisions progressively create a distribution of 345 copy numbers counteracted by a large range of regulation mechanisms acting at level of plasmid 346 replication. However, these mechanisms can be disrupted in a dynamic manner by strong positive or 347 negative selection pressures associated with plasmid encoded functional cassettes. Playing with such 348 mechanisms is of interest to optimize the production of biomolecule and cause a significant metabolic 349 load. Maintaining multi-copy plasmid in the off-state during the growth phase before activation, once 350 high cell density is reached and cell division arrested, is a classical approach to optimize expression. 351 However, our work illustrated that copy number distribution can led to the formation of subpopulations 352 with markedly distinct phenotypes.

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## 358 Figure legends and tables

**Figure 1.** Experiment flow chart. Plate incubation was performed in solid YNB-trp supplemented with 2  $\mu$ g/ml Dox at 30°C. Washes were performed with YNB-trp without Dox and culture started at OD<sub>600</sub>=0.01. Liquid cultures were performed in the same media containing various Dox concentrations at 30°C with 200 rpm shaking. Samples were either pelleted for qPCR and HPLC-MS analysis at 0, 7, 9, 11, 13, 15, 17, 19 and 21h of culture or diluted to OD<sub>600</sub>=0.015 after 10h culture for encapsulation. 365

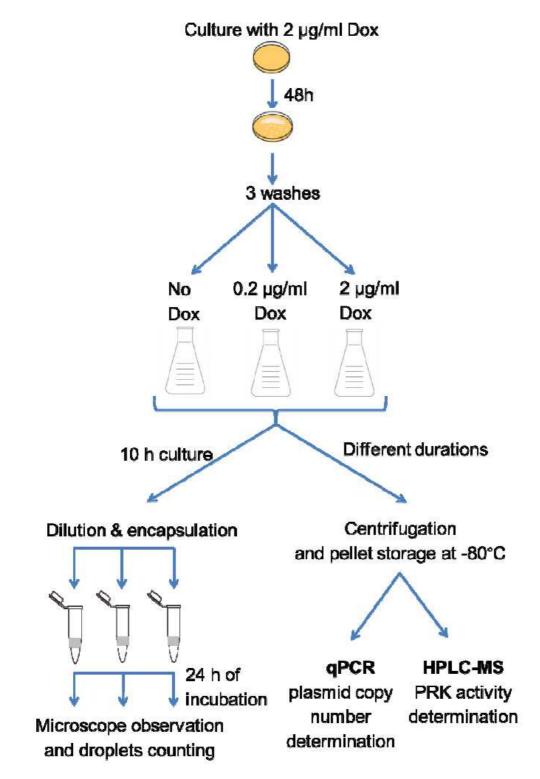
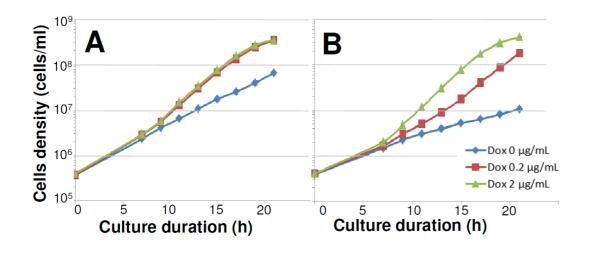


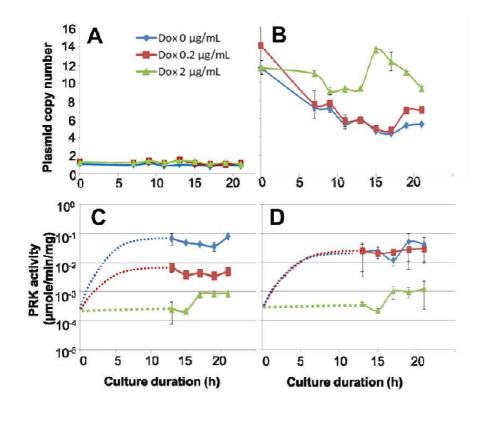
Figure 2. Growth curves of yeast cells at different Dox concentrations ( → 0 µg/ml, → 0.2 µg/ml,
 2 µg/ml) for cells bearing centromeric (A) or multi-copy plasmids (B).





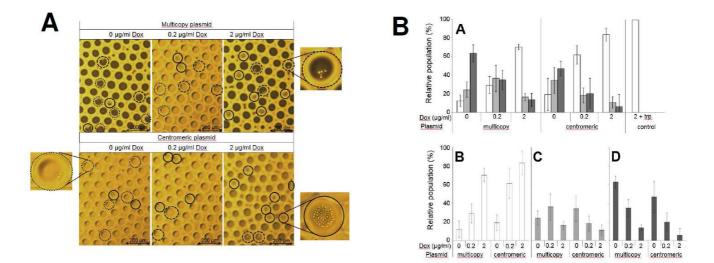


**Figure 3.** Time dependence of relative plasmid copy number as function of Dox concentration in culture media ( $\rightarrow$  0 µg/ml,  $\rightarrow$  0.2 µg/ml,  $\rightarrow$  2 µg/ml) for centromeric (A) or multi-copy (B) plasmids. Time dependence of PRKp activity for cells with centromeric (C) or multi-copy (D) plasmids. Dotted lines are arbitrary drawn and given only as help to visualize time course.



377 378

379 **Figure 4.** (4A) Microscopy observation of droplets for different Dox concentrations and plasmid types. 380 High (full circles), medium (dashed circles) and low (dotted circles) cell densities in droplets. (4B) Cell growth analysis in droplets after 24h incubation. Classified by (A) Dox concentrations or (B-D) growth 381 level in the droplet. 1 to 3 cells per droplet (black boxes), 4 to 10 cells per droplet (grey boxes), and 382 383 more than 10 cells per droplet (white boxes). A control was realized with cells transformed with multi-384 copy plasmid lacking the PRKp expression cassette, in presence of 2 µg/ml of Doxycycline and 385 tryptophan supplementation (2 + trp). Color codes are identical for upper and lower panels. Values are 386 averages of microfluidic experiments triplicates.



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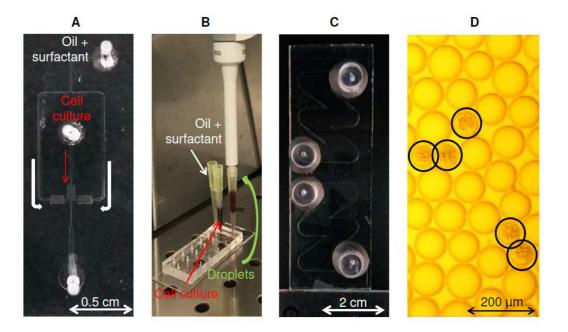
**Table 1.** Results summary. Growth rate ( $\mu$ ) calculated between 13 and 15h of culture. Relative plasmid copy numbers measured at start of culture (0h) and after 21h and fold changes. PRKp activities after 21h of incubation. Microfluidic observations in droplets of the relative populations of fast and slow growing cells.

		Growth rate	Relative copy numbers		PRK activity Microfluidic		luidic
Plasmid type	<b>Dox</b> (μg/ml)	(μ) 13 - 15h	Value	Fold change	21 h	% cells	% cells
, ypc	(μg/iiii)	(h⁻¹)	0h - 21h	T21/T0	(µmoles/min/ mg)	Slow growing	Fast growing
	0	0.06	$12 \pm 0.7 - 5 \pm 0.0$	0,42	4.10 <sup>-2</sup> ± 3.10 <sup>-2</sup>	63 ± 8	12 ± 9
multicopy	0.2	0.14	$14 \pm 3.0 - 7 \pm 0.1$	0.50	3.10 <sup>-2</sup> ±2.10 <sup>-2</sup>	35 ±14	29 ±10
	2	0.20	$12 \pm 0.8 - 9 \pm 0.2$	0.75	1.10 <sup>-3</sup> ± 1.10 <sup>-3</sup>	$14\pm 4$	70 ± 7
	0	0.11	$1.1 \pm 0.2 - 0.7 \pm 0.2$	0.64	8.10 <sup>-2</sup> ±4.10 <sup>-3</sup>	47 ± 14	19 ± 8
centromeric	0.2	0.18	1.3 ± 0.1 - 1.0 ± 0.1	0.77	5.10 <sup>-3</sup> ± 1.10 <sup>-4</sup>	$20\pm\ 8$	61 ± 16
	2	0.17	1.3 ± 0.1 - 1.1 ± 0.1	0.85	9.10 <sup>-4</sup> ±2.10 <sup>-4</sup>	6 ± 6	83 ± 13

## 394 Supplementary material

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**Figure S1.** Microfluidic system for cell encapsulation in droplets and observation of growth. (A) Flowfocusing geometry: cells in culture media (vertical arrow), Oil and surfactant (arrows). (B) Multi-line droplet generating system driven by suction. (C-D) Observation glass chamber.



- **Table S1.** QPCR primer list.

Gene		5' – 3' sequence
ALG9	Forward	CACGGATAGTGGCTTTGGTGAACAATTAC
	Reverse	TATGATTATCTGGCAGCAGGAAAGAACTTGGG
PRK6	Forward	ACACGCAAACACAAATAC
	Reverse	TACCACAACCAGAATCAC

Table S2. Relative numbers of droplets featuring low, medium and high number of cells following
 incubation of initially single cell transformed with centromeric and multi-copy plasmids in medium
 containing various Dox levels.

Plasmide type	Dox (µg/ml)	1-3 cells/droplet	4-10 cells/droplet	>10 cells/droplet
	0	63% ± 6%	24% ± 8%	12% ± 9%
multicopy	0.2	35% ± 9%	36% ± 14%	29% ± 10%
	2	14% ± 3%	16% ± 4%	70% ± 7%
	0	47% ± 17%	34% ± 14%	19% ± 8%
centromeric	0.2	20% ± 10%	18% ± 8%	61% ± 16%
	2	6% ± 7%	11% ± 6%	83% ± 13%

## 410 **References**

- 411Avery, S.V., 2006. Microbial cell individuality and the underlying sources of heterogeneity. Nat Rev412Micro 4, 577–587. https://doi.org/10.1038/nrmicro1460
- 413 Bailey, J.E., 1993. Host-vector interactions in Escherichia coli, in: Bioprocess Design and Control. 414 Springer Berlin Heidelberg, Berlin, Heidelberg, pp. 29–52. https://doi.org/10.1007/BFb0007195
- Barrett, L.W., Fletcher, S., Wilton, S.D., 2012. Regulation of eukaryotic gene expression by the
  untranslated gene regions and other non-coding elements. Cell. Mol. Life Sci. 69, 3613–3634.
  https://doi.org/10.1007/s00018-012-0990-9
- Bódi, Z., Farkas, Z., Nevozhay, D., Kalapis, D., Lázár, V., Csörgő, B., Nyerges, Á., Szamecz, B.,
  Fekete, G., Papp, B., Araújo, H., Oliveira, J.L., Moura, G., Santos, M.A.S., Székely Jr, T.,
  Balázsi, G., Pál, C., 2017. Phenotypic heterogeneity promotes adaptive evolution. PLOS Biol.
  15, e2000644. https://doi.org/10.1371/journal.pbio.2000644
- Boitard, L., Cottinet, D., Kleinschmitt, C., Bremond, N., Baudry, J., Yvert, G., Bibette, J., 2012.
  Monitoring single-cell bioenergetics via the coarsening of emulsion droplets. Proc. Natl. Acad.
  Sci. U. S. A. 109, 7181–7186. https://doi.org/10.1073/pnas.1200894109
- Borodina, I., Nielsen, J., 2014. Advances in metabolic engineering of yeast Saccharomyces cerevisiae
   for production of chemicals. Biotechnol. J. 9, 609–620. https://doi.org/10.1002/biot.201300445
- 427 Çakar, Z.P., Sauer, U., Bailey, J.E., 1999. Metabolic engineering of yeast: the perils of auxotrophic 428 hosts. Biotechnol. Lett. 21, 611–616. https://doi.org/10.1023/A:1005576004215
- Chen, X., Zhou, L., Tian, K., Kumar, A., Singh, S., Prior, B.A., Wang, Z., 2013. Metabolic engineering of
   Escherichia coli: A sustainable industrial platform for bio-based chemical production. Biotechnol.
   Adv. 31, 1200–1223. https://doi.org/10.1016/j.biotechadv.2013.02.009
- 432 Clarke, L., Carbon, J., 1980. Isolation of a yeast centromere and construction of functional small 433 circular chromosomes. Nature 287, 504–509. https://doi.org/10.1038/287504a0
- Da Silva, N.A., Srikrishnan, S., 2012. Introduction and expression of genes for metabolic engineering
   applications in Saccharomyces cerevisiae. FEMS Yeast Res. 12, 197–214.
   https://doi.org/10.1111/j.1567-1364.2011.00769.x
- Damodaran, S.P., Eberhard, S., Boitard, L., Rodriguez, J.G., Wang, Y., Bremond, N., Baudry, J.,
  Bibette, J., Wollman, F.-A., 2015. A Millifluidic Study of Cell-to-Cell Heterogeneity in GrowthRate and Cell-Division Capability in Populations of Isogenic Cells of Chlamydomonas
  reinhardtii. PLoS ONE 10, e0118987. https://doi.org/10.1371/journal.pone.0118987
- Dingermann, T., Frank-Stoll, U., Werner, H., Wissmann, A., Hillen, W., Jacquet, M., Marschalek, R.,
   1992. RNA polymerase III catalysed transcription can be regulated in Saccharomyces
   cerevisiae by the bacterial tetracycline repressor-operator system. EMBO J. 11, 1487–1492.
- 444 Futcher, A.B., Cox, B.S., 1984. Copy number and the stability of 2-micron circle-based artificial 445 plasmids of Saccharomyces cerevisiae. J. Bacteriol. 157, 283–290.
- 446 Futcher, A.B., Cox, B.S., 1983. Maintenance of the 2 microns circle plasmid in populations of 447 Saccharomyces cerevisiae. J. Bacteriol. 154, 612–622.
- Gerbaud, C., Guérineau, M., 1980. 2 μm plasmid copy number in different yeast strains and repartition
   of endogenous and 2 μm chimeric plasmids in transformed strains. Curr. Genet. 1, 219–228.
   https://doi.org/10.1007/BF00390947
- 451 Gnügge, R., Liphardt, T., Rudolf, F., 2016. A shuttle vector series for precise genetic engineering of 452 Saccharomyces cerevisiae. Yeast 33, 83–98. https://doi.org/10.1002/yea.3144
- 453 Gnügge, R., Rudolf, F., 2017. Saccharomyces cerevisiae Shuttle vectors. Yeast 34, 205–221. 454 https://doi.org/10.1002/yea.3228
- 455 Görgens, J.F., van Zyl, W.H., Knoetze, J.H., Hahn-Hägerdal, B., 2001. The metabolic burden of the 456 PGK1 and ADH2 promoter systems for heterologous xylanase production by Saccharomyces 457 cerevisiae in defined medium. Biotechnol. Bioeng. 73, 238–245. https://doi.org/10.1002/bit.1056
- Grünberger, A., Schöler, K., Probst, C., Kornfeld, G., Hardiman, T., Wiechert, W., Kohlheyer, D.,
   Noack, S., 2017. Real-time monitoring of fungal growth and morphogenesis at single-cell
   resolution. Eng. Life Sci. 17, 86–92. https://doi.org/10.1002/elsc.201600083
- Grünberger, A., Wiechert, W., Kohlheyer, D., 2014. Single-cell microfluidics: opportunity for bioprocess
   development. Cell Pathw. Eng. 29, 15–23. https://doi.org/10.1016/j.copbio.2014.02.008

- Guyot, S., Gervais, P., Young, M., Winckler, P., Dumont, J., Davey, H.M., 2015. Surviving the heat:
  heterogeneity of response in Saccharomyces cerevisiae provides insight into thermal damage to
  the membrane. Environ. Microbiol. 17, 2982–2992. https://doi.org/10.1111/1462-2920.12866
- Harrison, E., Koufopanou, V., Burt, A., MacLean, R.C., 2012. The cost of copy number in a selfish
  genetic element: the 2-µm plasmid of Saccharomyces cerevisiae. J. Evol. Biol. 25, 2348–2356.
  https://doi.org/10.1111/j.1420-9101.2012.02610.x
- Holland, S.L., Reader, T., Dyer, P.S., Avery, S.V., 2014. Phenotypic heterogeneity is a selected trait in natural yeast populations subject to environmental stress. Environ. Microbiol. 16, 1729–1740.
  https://doi.org/10.1111/1462-2920.12243
- Jahn, M., Günther, S., Müller, S., 2015. Non-random distribution of macromolecules as driving forces
  for phenotypic variation. Environ. Microbiol. Extrem. 25, 49–55.
  https://doi.org/10.1016/j.mib.2015.04.005
- Jahn, M., Vorpahl, C., Türkowsky, D., Lindmeyer, M., Bühler, B., Harms, H., Müller, S., 2014. Accurate
  Determination of Plasmid Copy Number of Flow-Sorted Cells using Droplet Digital PCR. Anal.
  Chem. 86, 5969–5976. https://doi.org/10.1021/ac501118v
- 478 Jordan, B., E., Mount, Robert C, Hadfield, Christopher, 1996. Determination of plasmid copy number in 479 yeast 193–203.
- Karim, A.S., Curran, K.A., Alper, H.S., 2013. Characterization of plasmid burden and copy number in
   Saccharomyces cerevisiae for optimization of metabolic engineering applications. FEMS Yeast
   Res. 13, 10.1111/1567-1364.12016. https://doi.org/10.1111/1567-1364.12016
- Kazemi Seresht, A., Nørgaard, P., Palmqvist, E.A., Andersen, A.S., Olsson, L., 2013. Modulating
  heterologous protein production in yeast: the applicability of truncated auxotrophic markers.
  Appl. Microbiol. Biotechnol. 97, 3939–3948. https://doi.org/10.1007/s00253-012-4263-1
- Khatun, M.M., Yu, X., Kondo, A., Bai, F., Zhao, X., n.d. Improved ethanol production at high
  temperature by consolidated bioprocessing using Saccharomyces cerevisiae strain engineered
  with artificial zinc finger protein. Bioresour. Technol.
  https://doi.org/10.1016/j.biortech.2017.05.088
- Kim, S.R., Skerker, J.M., Kong, I.I., Kim, H., Maurer, M.J., Zhang, G.-C., Peng, D., Wei, N., Arkin, A.P.,
  Jin, Y.-S., 2017. Metabolic engineering of a haploid strain derived from a triploid industrial yeast
  for producing cellulosic ethanol. Metab. Eng. 40, 176–185.
  https://doi.org/10.1016/j.ymben.2017.02.006
- Krivoruchko, A., Siewers, V., Nielsen, J., 2011. Opportunities for yeast metabolic engineering: Lessons
   from synthetic biology. Biotechnol. J. 6, 262–276. https://doi.org/10.1002/biot.201000308
- Kwak, S., Jin, Y.-S., 2017. Production of fuels and chemicals from xylose by engineered
   Saccharomyces cerevisiae: a review and perspective. Microb. Cell Factories 16, 82.
   https://doi.org/10.1186/s12934-017-0694-9
- McManus, J., Cheng, Z., Vogel, C., 2015. Next-generation analysis of gene expression regulation –
   comparing the roles of synthesis and degradation. Mol. Biosyst. 11, 2680–2689.
   https://doi.org/10.1039/c5mb00310e
- Moriya, H., Shimizu-Yoshida, Y., Kitano, H., 2006. In Vivo Robustness Analysis of Cell Division Cycle
   Genes in Saccharomyces cerevisiae. PLOS Genet. 2, e111.
   https://doi.org/10.1371/journal.pgen.0020111
- Talia, S.D., Skotheim, J.M., Bean, J.M., Siggia, E.D., Cross, F.R., 2007. The effects of molecular noise
   and size control on variability in the budding yeast cell cycle. Nature 448, 947–951.
   https://doi.org/10.1038/nature06072
- Tang, Y.-C., Amon, A., 2013. Gene copy number alterations: A cost-benefit analysis. Cell 152, 394–
   405. https://doi.org/10.1016/j.cell.2012.11.043
- Teste, M.-A., Duquenne, M., François, J.M., Parrou, J.-L., 2009. Validation of reference genes for
   quantitative expression analysis by real-time RT-PCR in Saccharomyces cerevisiae. BMC Mol.
   Biol. 10, 99–99. https://doi.org/10.1186/1471-2199-10-99
- 513 Ugolini, S., Tosato, V., Bruschi, C.V., 2002. Selective Fitness of Four Episomal Shuttle-Vectors
   514 Carrying HIS3, LEU2, TRP1, and URA3 Selectable Markers in Saccharomyces cerevisiae.
   515 Plasmid 47, 94–107. https://doi.org/10.1006/plas.2001.1557
- Watson, S.K., Han, Z., Su, W.W., Deshusses, M.A., Kan, E., 2016. Carbon dioxide capture using
  Escherichia coli expressing carbonic anhydrase in a foam bioreactor. Environ. Technol. 37,
  3186–3192. https://doi.org/10.1080/09593330.2016.1181110

- Wells, E., Robinson, A.S., 2017. Cellular engineering for therapeutic protein production: product quality,
   host modification, and process improvement. Biotechnol. J. 12, 1600105–n/a.
   https://doi.org/10.1002/biot.201600105
- 522 Wethmar, K., Smink, J.J., Leutz, A., 2010. Upstream open reading frames: Molecular switches in 523 (patho)physiology. Bioessays 32, 885–893. https://doi.org/10.1002/bies.201000037
- Yen-Ting-Liu, Sau, S., Ma, C.-H., Kachroo, A.H., Rowley, P.A., Chang, K.-M., Fan, H.-F., Jayaram, M.,
  2014. The partitioning and copy number control systems of the selfish yeast plasmid: an
  optimized molecular design for stable persistence in host cells. Microbiol. Spectr. 2,
  10.1128/microbiolspec.PLAS-0003-2013. https://doi.org/10.1128/microbiolspec.PLAS-00032013
- 529 Zhuang, Z.-Y., Li, S.-Y., 2013. Rubisco-based engineered Escherichia coli for in situ carbon dioxide 530 recycling. Bioresour. Technol. 150, 79–88. https://doi.org/10.1016/j.biortech.2013.09.116