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**Maltose Utilization as a Novel Selection Strategy for Continuous
Evolution of Microbes with Enhanced Metabolite Production**

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19 ABSTRACT

20 We have developed a novel selection circuit based on carbon source utilization
21 that establishes and sustains growth-production coupling over several generations in a
22 medium with maltose as the sole carbon source. In contrast to traditional antibiotic
23 resistance-based circuits, we first approved that coupling of cell fitness to metabolite
24 production by our circuit was more robust with a much lower escape risk even after
25 many rounds of selection. We then applied the selection circuit to the optimization of
26 L-tryptophan (L-Trp) production. We demonstrated that it enriched for specific
27 mutants with increased L-Trp productivity whether applied to a small defined, or a
28 relatively large and undefined, mutational library. From the latter, we identified four
29 novel mutations with enhanced L-Trp output. Finally, we used it to select for several
30 high L-Trp producers with randomly generated genome-wide mutations and obtained
31 strains with up to 65% increased L-Trp production. This selection circuit provides new
32 perspectives for the optimization of microbial cell factories for diverse metabolite
33 production and the discovery of novel genotype-phenotype associations at the
34 single-gene and whole genome levels.

35
36 KEY WORDS: adaptive laboratory evolution, biosensor, maltose utilization, pathway
37 optimization, L-tryptophan biosynthesis

39 INTRODUCTION

40 In the past two decades, adaptive laboratory evolution (ALE) has been widely
41 used in the field of metabolic engineering as a strategy to accelerate microbial
42 evolution to obtain industrially relevant phenotypes.^{1,2} ALE-generated phenotypes
43 have included the ability to utilize non-native substrates,³ tolerance to fermentation
44 products,⁴ increased growth under specific environmental conditions,⁵ optimal
45 balance between product formation and biomass generation,⁶ and increased
46 productivity, titer, and yield of target product.⁷ Compared with rational metabolic
47 engineering, ALE as a strain-optimization strategy has the advantage of allowing
48 non-intuitive beneficial mutations to be enriched, thereby exceeding the scope of

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4 49 available knowledge about metabolic systems and microorganism physiology.⁸ Recent
5 50 advances in the generation of genotypic diversity have also accelerated the application
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7 51 of ALE and increased the possibility of producing desired phenotypes through ALE.^{9–}
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13 54 Most ALE applications to date have focused on fitness phenotypes because there
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15 55 are no general methods available to couple metabolite production to cellular fitness,
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17 56 e.g., to universally apply the ALE strategy directly to optimize strains for metabolite
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19 57 production. Although a study using ALE recently succeeded in improving carotenoid
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21 58 production in *Saccharomyces cerevisiae* under oxidative stress by exploiting the
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23 59 antioxidant properties of carotenoids,¹² most metabolites are not easily coupled to
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25 60 cellular fitness. To solve this problem, research is underway to transform the product
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27 61 signal into cellular fitness by applying synthetic genetic circuits. In these circuits,
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29 62 engineered biosensor responded to the metabolite concentration and controlled the
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31 63 expression of downstream fitness-coupled parts, such as antibiotic resistance
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33 64 genes.^{13,14} However, this strategy is susceptible to mutation of bacteria, termed
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35 65 escapees¹⁵ that recovered normal growth via spontaneous mutations that defeated the
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37 66 stressed conditions. These escapees formed competing populations with undesired
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39 67 phenotypes, impeding the enrichment of desired mutants with improved chemical
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41 68 production. To address this issue, two compromising strategies have been adopted. In
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43 69 the first, the engineered genotypic diversity was constructed into plasmid-based
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45 70 selection circuits, and bacterial strains carrying the constructs are subjected to
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47 71 selection. To avoid escapees, the plasmids are extracted from the evolved strains after
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49 72 several rounds of selection and retransformed into the starting parent strain for further
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51 73 selection.¹³ In an alternative approach, a negative selection is used to eliminate
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53 74 escapees via a toggled negative selection phase.¹⁴ The former approach severely
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55 75 impedes the continuity of the evolution process whereas the latter reduces the
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57 76 efficiency of selection, which results in wasted time and higher costs. Moreover, to
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59 77 avoid rapid generation of escapees, both systems rely on the predefined synthetic
60 78 mutation library, the genotype space sampling limitation of which contradicts the

79 fundamental purpose of ALE of finding unknown loci related to targeted phenotypes.

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81 Herein, we propose a novel selection strategy based on specific carbon source
82 utilization rather than lethal substances to meet the requirements of continuous
83 evolution with low risk of generating escapees. We designed a plasmid-based genetic
84 circuit, in which the expression of a maltose-utilizing enzyme (amylomaltase) is under
85 the control of a biosensor of a target metabolite. Our reasoning was as follows: First,
86 when present in a strain that is deficient for the maltase, the ability to utilize maltose
87 as the sole carbon source becomes dependent on the target metabolite; thus tightly
88 coupling production and growth. Second, adaptation of microbes to the selective
89 pressure imposed by inherently non-exploitable carbon sources (e.g., maltose) is
90 likely considerably rarer than to the stress generated by antibiotics. Based on these
91 two assumptions, we hypothesized that this circuit-based strategy would significantly
92 reduce the possibility of escapee emergence during the selection process and thereby
93 render continuous evolution possible.

94

95 In this study, we chose L-tryptophan (L-Trp) as our target metabolite and
96 constructed a genetic circuit based on a L-Trp biosensor. L-Trp sensing mechanism we
97 used is firstly revealed in transcriptional regulation of the *tnaCAB* operon based on
98 the nascent leader peptide mechanism (encoded in *tnaC*).¹⁶ In our previous work, we
99 firstly repurposed this naturally occurring mechanism as a biosensor by fusing
100 reporter gene GFP downstream to the regulatory element (from 24-bp upstream of
101 *tnaC* to 30-bp downstream of the *tnaA* start codon). The expression of reporter genes
102 was linearly dependent on the concentration of L-Trp in operational range.¹⁷ Here, we
103 fused the regulatory element with *malQ*, the gene encoding amylomaltase,¹⁸
104 downstream of the L-arabinose induced pBAD promoter to achieve
105 growth-production coupling and selection of desired phenotypes (Figure 1a). By
106 replacing *malQ* with *tetA* that confers tetracycline resistance, we also constructed a
107 control circuit to compare the anti-escape ability of a traditional antibiotics-based
108 strategy with this novel approach. We demonstrated that, for both circuits, cell growth

positively responded to exogenously added L-Trp, and strains with high L-Trp production were enriched within days by simply transferring the culture under the appropriate selective environment. However, the kinetics of the two systems were quite different: using a carbon source as selection pressure was much more robust with fewer escapees even after 30 days of evolution, whereas tetracycline (tet) resistance rapidly emerged after just 2 days. We then applied this new selection method to select for high L-Trp producers from two types of *TrpE* mutant libraries—a site-saturation mutagenesis library and a mutant library generated by error-prone PCR. *TrpE* encodes anthranilate synthase, or TrpE, a rate-limiting enzyme in the L-Trp biosynthetic pathway.¹⁹ We successfully enriched for new beneficial mutations during the continuous selection process. We also applied our selection strategy to a mutational library with random mutations at the genome level and successfully enriched strains with increased L-Trp production of up to 65% by a series of continuous selections. This experimental selection strategy enabled the efficient enrichment of desired phenotypes continuously with very low risk of generating evolution-induced escapees based on either gene level synthetic library or genome level spontaneous mutation library. This strategy may be extended as a universal and powerful tool for the optimization of microbial production of desired metabolites. Furthermore, it provides a new avenue for the discovery of genotype-phenotype associations by identifying the determinative genetic elements for the targeted genotype in a quick and relatively high-throughput manner.

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131 **RESULTS AND DISCUSSION**

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133 **Establishment and Characterization of the Growth-based Selection**
134 **Platform.** To realize growth-production coupling, we constructed a selection circuit,
135 pMC, by expressing *malQ*, encoding a maltose hydrolase, downstream of the L-Trp
136 biosensor in a medium copy-number plasmid, pTrc99A. In this circuit, the L-Trp
137 biosensor activates the transcription of *malQ* by positively responding to the
138 intracellular concentration of L-Trp. So, intracellular L-Trp can activate the expression

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4 139 of the maltose hydrolase, which hydrolyzes maltose to yield glucose—the carbon
5 140 source that is readily utilized by microbes for growth (Figure 1a). Thus, we predicted
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7 141 that by culturing microbes harboring the pMC circuit in medium with maltose as the
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9 142 sole carbon source, a high L-Trp-producing bacterium would grow faster than a
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11 143 relatively low L-Trp-producing competitor; hence, the former would ultimately
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13 144 predominate in the population as transfer culture continued, enabling the
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15 145 high-throughput growth-based selection (Figure 1a).
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18 147 To validate the function of the pMC circuit in growth-production coupling, we
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20 148 cultured strain B1 (*E. coli* BL21(DE3) $\Delta malQ \Delta araA$, in which *araA* was deleted to
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22 149 make sure the host can't utilize the inducer L-arabinose for growth) harboring the
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24 150 pMC circuit in the M9 culture medium, which contained maltose as the sole carbon
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26 151 source and different concentrations of exogenously added Ala-Trp dipeptide. It has
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28 152 been proved that dipeptide addition is a valid method to increase the cytosolic pool of
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30 153 a specific amino acid in *E. coli*.²⁰ After membrane transport, expedited by alanine
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32 154 residue, the Ala-Trp dipeptide can be hydrolyzed into L-Ala and L-Trp, and make
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34 155 intracellular L-Trp concentration linearly dependent on the extracellular dipeptide
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36 156 concentration.¹⁷ Additionally, we observed the direct addition of L-Trp moderately
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38 157 inhibited cell growth. Therefore, we used Ala-Trp to control the intracellular
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40 158 concentration of L-Trp in our work. We found that strains in the high Ala-Trp
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42 159 environments grew faster than those in low Ala-Trp environments, and the trend
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44 160 continued up to a concentration of 20 μ M Ala-Trp (Figure 1b). For Ala-Trp
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46 161 concentrations >20 μ M, much lower than 600 μ M (upper detection limit of L-Trp
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48 162 biosensor quantified by expressing *sfGFP* downstream of the *malQ* and detecting the
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50 163 Ala-Trp induced fluorescence response in non-selective medium) (Figure S1), the
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52 164 growth of the strains remained unchanged, possibly because the amount of maltose
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54 165 hydrolase expressed was sufficient to hydrolyze maltose to glucose for growth. It is
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56 166 reasonable that strains grown in media that contained glucose as the sole carbon
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58 167 source had the highest growth rates as they directly utilized glucose for growth with
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60 168 no burden of expressing maltose hydrolase and no lag time for transforming maltose

169 to glucose. The strain still survived in medium without Ala-Trp, although with a
170 relatively low growth rate, and this may have resulted from leaky expression of *malQ*.
171 And the strain without the pMC circuit (NC) hardly survived in the medium.
172 According to our preliminary experiments to culture strain under the same condition
173 as NC, it showed no cell growth for as long as 30 days (data not shown). To further
174 verify the difference in growth rates that resulted from different maltose-utilizing
175 abilities, we used HPLC to measure the maltose concentration in the media during
176 culture. We found that the difference in maltose consumption rate in response to
177 Ala-Trp concentration exhibited the same trend as the growth rate (Figure S2). In
178 short summary, this result confirmed that the pMC selection circuit coupled the
179 growth of the microbes to L-Trp based on the conversion of maltose to glucose,
180 specifically through L-Trp–induced expression of *malQ*.

182 We reasoned that during the selection process, strains with high production
183 would be enriched among the mixture of strains with different production. As proof of
184 concept, we focused on *TrpED*, the bottleneck step in L-Trp biosynthesis¹⁹ and sought
185 to engineer *TrpED* to construct a series of mutant strains with different L-Trp
186 production. The *TrpED* encodes anthranilate synthase. This enzyme catalyzes the
187 reaction of chorismate to L-Trp and are feedback-inhibited by intracellular L-Trp, the
188 removal of which significantly increases chorismate-to- L-Trp flux. In addition to the
189 wild-type *TrpED*, we expressed a mutated form, *TrpE^{fbr}D*, in which sensitivity to
190 feedback inhibition was eliminated by two point mutations, Met293Thr and Ser40Phe.
191 Based on the previous reported B8 strain (*E. coli* BL21(DE3) $\Delta tnaA \Delta TrpR \Delta pheA$)
192 optimized for L-Trp production¹⁹, we further deleted *araA* and *malQ* to construct B10
193 strain as the host for this assay. The strain B10/pEDfbr, which expressed mutated
194 *TrpE^{fbr}D*, had a higher L-Trp titer/OD ~18 mg/L/OD, whereas strain B10/pEDwt,
195 which expressed wild-type *TrpED*, had a titer/OD of only 1 mg/L/OD (Figure S3). We
196 then transferred the pMC circuit into each of these strains to produce
197 B10/pMC+pEDwt and B10/pMC+pEDfbr and cultured the two strains in both
198 M9-cas-maltose (selective) and M9-cas-glucose (non-selective) media. As anticipated,

only in the selective medium did B10/pMC+pEDfbr had a growth advantage over B10/pMC+pEDwt; in the non-selective medium, there was no significant difference in the growth rate of the two strains (Figure 1c). This result demonstrated that in strains carrying the pMC selection circuit, high L-Trp producers grew faster than low producers in medium with maltose as the sole carbon source.

Furthermore, we mixed the two strains at different initial ratios (fbr:wt = 1:9/1:3/1:1) and transferred the cultures five times. We found that the L-Trp titer/OD increased with culture transfer, regardless of the initial ratio (Figure 1d), which revealed that the high L-Trp producer was consistently enriched during transfer culture. For example, after five culture transfers, the L-Trp production increased from 4 mg/L/OD to 10 mg/L/OD in samples with an initial mixing ratio of 1:1. To confirm this enrichment effect, we subjected the mixed culture to Sanger sequencing during transfer culture. By comparing the base calling in the mix with that of the premixed sample, we estimated that during progression from G0 to G5, the ratio of high producer approximately increased from: 10% to 40% in the 1:9 mix; from 25% to 50% in the 1:3 mix; and from 50% to 70% in the 1:1 mix (Figure S4, Figure S5). Taken together, these results indicated that the pMC selection circuit enabled selection of a high L-Trp producer from a mixture of strains with different L-Trp production by simply applying the transfer culture protocol in medium with maltose as the sole carbon source.

As a control, we replaced *malQ* in the pMC circuit with *tetA* (tetracycline-resistance gene) to construct a pTet circuit, i.e., to test whether induction with varying amounts of tetracycline could also positively couple the growth rate to the intracellular L-Trp concentration in the medium (Figure S6). The selection process with the pTet circuit was initiated by adding tetracycline to the medium 3–4 h after inoculation when the OD₆₀₀ reached 0.4–0.6 (see Methods for details). Under conditions in which the final concentration of added tetracycline was 7 mg/L, the pTet circuit in BL21(DE3) cells responded to exogenously added Ala-Trp dipeptide up to

0.6 mM (Figure S7), a plateau significantly higher than that for pMC. The increase may be caused by that the amount of L-Trp needed for sufficient expression of essential target genes for cell growth differed in a tet-containing environment. Similar to the approach we used for pMC, we constructed two strains with different L-Trp production, namely BL21(DE3)/pTet (almost no L-Trp produced) and B11/pTet (with an L-Trp titer/OD of 15 mg/L/OD). We found an optimal tet concentration (2 mg/L) to maximize the difference in their growth rates (Figure S8a). Under this condition, we obtained ~100% of the high producer after 24 h selection even when the initial ratio of the high producer in the seed solution was reduced to 10^{-4} (Figure S8b). These results demonstrated that the pTet circuit was also capable of selecting a high producer from a mixed population in the presence of inducer in the medium.

Evaluation of the Anti-escape Ability of Circuits Based on Carbon Source Utilization and Antibiotic Resistance. Before launching continuous evolution, we performed a preliminary test on the two types of circuits to compare their anti-escape properties. To investigate the escape phenomenon, we first mutated the parent strains (B1/pMC and BL21(DE3)/pTet) using biological (*dnaQ926*)^{21,22} or physical (atmospheric and room temperature plasma, ARTP)²³ mutagenesis to accelerate the generation of genetic diversity (see Methods). The generated mutated strains were transferred in parallel to selective medium (M9-cas-maltose or M9-YE, with tet) or non-selective medium (M9-cas-glucose or M9-YE, without tet). We measured the OD₆₀₀ and L-Trp titer of each culture after 24 h and transferred the evolved strains that were in the selective medium to fresh media, both selective and non-selective, and the transfer culture was repeated for several additional rounds with variable selective pressures determined according to the final OD₆₀₀ of each individual round. Three biological replicates were included.

In these experiments, we found that L-Trp production did not increase for either parent strain (data not shown), but the growth curves differed substantially (Figure 2). By comparing the OD₆₀₀ of strains in selective and non-selective media, we found that

for BL21(DE3)/pTet, (EGT; Figure 2) escapees arose rapidly in ≤ 48 h for strains mutated by *dnaQ926* (Figure 2a) and ARTP (Figure 2b), as shown by the acquisition of tet resistance without an increase in L-Trp production. The initial concentration of tet in the selective medium was set as 2 mg/L which was the optimal tet concentration for selection (Figure S8a). For strains mutated by *dnaQ926*, the stress induced by 2 mg/L tet was completely overcome when growth was measured at 72 h. At every round, we measured the rate of tet inhibition at the moment of tet addition by comparing the number of sampled bacteria that grew on agar plates with or without tet. We found decreased rates of tet inhibition for the escapees. Some escapees, which initially showed no resistance to 2 mg/L tet, acquired resistance to 4 mg/L tet just after the second round of selection; we even found escapee populations that exhibited resistance to 8 mg/L tet after the third round of selection (Figure S9). For strains mutated by ARTP, all mutated populations acquired resistance to 2 mg/L after the first round of selection and quickly adapted to 7 mg/L tet. It seemed that ARTP was more efficient at inducing gene mutations, giving rise to divergent evolutionary dynamics between the biological and physical mutators. Consequently, we used ARTP to mutate B1/pMC and repeated the same transfer culture protocol with the selective and non-selective media that we had used with *dnaQ926*. The OD₆₀₀ measurements revealed that the evolved strains (EGM; Figure 2c) were unable to use maltose as the sole carbon source and that escapees did not appear even after 700 h, i.e., >30 rounds of selection. Taken together, the results demonstrated that, in contrast to antibiotic resistance-based systems, the novel genetic circuit based on carbon resource utilization showed an outstanding anti-escape feature, with no escapees emerging after many rounds of selection.

Previously, antibiotics were the principal agents of selection pressure. There are three major types of antibiotics,^{24–26} all of which may be invalidated by adaptive mutations. For example, spontaneous resistance to tetracycline²⁷ of wild-type *E. coli* after adaptation was tracked to mutations that alter expression of chromosomal efflux systems²⁸ (such as AcrAB-TolC^{29–31} and emrE³²), modify the permeability of the outer-membrane porins or lipopolysaccharides,^{33,34} or change the strength of

289 ribosomal binding sites.³⁵ Among these, intrinsic production of numerous multidrug
290 efflux pumps bore the main responsibility for inducing broad-spectrum antibiotic
291 resistance or substrate tolerance to poisonous substances like crystal violet, SDS,
292 Triton X-100, etc.³⁶ In this context, the likelihood of generating escapees in antibiotic
293 resistance-based selection is almost inevitable. For our novel selection system, we
294 focused on MalQ, an enzyme that catalyzes the transglycosylation of maltose and
295 maltodextrins in *E. coli*, an essential step in the degradation of maltose.^{37,38} With a
296 *malQ* deletion, *E. coli* cannot survive in medium with maltose as the only carbon
297 source.³⁹ Therefore, the only possibility for escapees to emerge in this selection
298 system is to acquire a chromosomal mutation in a gene that codes for an enzyme
299 similar in function to MalQ. Based on a phylogenetic analysis of all the
300 carbohydrate-active enzymes in *E. coli* BL21(DE3) in the Carbohydrate-Active
301 Enzymes database⁴⁰, we found that MalQ was classified as an individual subfamily
302 (GH77). This divergence suggested that *malQ* and the other 87 carbohydrate active
303 enzyme-related genes have remote homologous relationships. Furthermore, if we
304 extended to all proteins encoded by *E. coli* BL21(DE3) genome (NC_012892.2.faa),
305 BLASTP search (*E* value = 0.01) identified no homologues to MalQ. This *in silico*
306 analysis may explain the high anti-escape potential of this novel selection system,
307 which is specifically based on the utilization of maltose as the sole carbon source.

308 In light of these considerations, we conclude that this system is potent for further
309 application in continuous evolution to find rare beneficial mutations even at the
310 genome level. Continuous evolution represents a powerful advance in protein
311 engineering^{41–46} and strain development⁴⁷ that may dramatically enhance the success
312 of evolutionary approaches. Nevertheless, previous examples of continuous evolution
313 lacked a strategy to link metabolite production to fitness, a drawback that hindered
314 their application in metabolic engineering. Herein, we used the novel selection circuit
315 presented here to address this issue; specifically, we performed continuous evolution
316 to enhance L-Trp production of strains with mutations introduced both into
317 plasmid-borne *TrpE* and genomic metabolite-processing genes.

318

Application of the Selection Platform to Optimize the L-Trp Biosynthetic Pathway. First, we applied the selection platform to select for a high L-Trp producer from a synthetic library. To demonstrate the selection function, we conducted site-saturation mutagenesis of the *TrpE* feedback inhibition binding site Ser40 present in the pEDwt plasmid. We transformed B10/pMC with the resulting library, named S40rd. We expected that transfer culture would allow enrichment of those bacteria that carried a mutation that released feedback inhibition; indeed, after eight cycles, the growth rate of the strains in the selective medium increased with time (Figure 3a). Furthermore, for all triplicates, the L-Trp titer/OD of the strains in the selective medium also increased over time from ~1 mg/L/OD to 10 mg/L/OD (Figure 3b). Taken together, the results showed that high L-Trp producers with high growth rates were enriched during transfer in the selective medium. As expected, the growth rate and L-Trp titer/OD remained unchanged from initial levels for transfer culture in the non-selective medium (Figure 3a and 3b). To verify the identity of the enriched mutants, we sequenced the final sample of each transfer culture at the Ser40 site. We found that three genotypes were enriched in the selective medium, namely, AGG (arginine, R), GAT (aspartic acid, D) and TTG (leucine, L) (Figure 3c). A base deletion mutation was enriched in the non-selective medium, possibly because the expression of TrpED caused burden to the cell in non-selective condition. To test the positive effect of the enriched mutations on L-Trp production, we constructed the corresponding mutant plasmids (pED-S40R/D/L) and transformed the B10 strain with each one. The L-Trp titer/OD of all mutant strains increased to levels approaching that of B10/pEDfbr (Figure 3d), which confirmed that the pMC selection circuit effectively enriched specific mutants with high L-Trp production. Previous structural analysis of TrpE revealed that the hydrogen bond formed between the amino group of L-Trp and the hydroxymethyl group on the side chain of Ser40 was responsible for feedback inhibition of anthranilate synthase by L-Trp.⁴⁸ The enriched mutant proteins bearing either arginine or aspartic acid, with their electrically charged side chain, or leucine, with a hydrophobic side chain, apparently impede the formation of the implicated hydrogen bond and thereby release feedback inhibition to ultimately

increase L-Trp titer/OD. Overall, the random nature of the selection process is supported by the fact that we did not generate Ser40Phe, a known mutant making even higher L-Trp production when cooperating with Met293Thr, and that we produced three distinct genotypes that produced high, but not the highest, production rates. Thus, the results demonstrated the potential of this approach to rapidly generate a collection of mutants with a variable range of improved production capacities.

Next, we constructed an error-prone *TrpE* library, the pED-library, to verify whether the selection circuit enriched for high producers when bacteria were transformed with a relatively large and undefined mutational library. We transformed B10/pMC with the pED-library and applied transfer culture. We performed six replicates for transfer culture in the selective medium; only a single sample was cultured in the non-selective medium because of the inherent randomness of the selection. The cultures were viable for 20 transfers. In the selective medium, the samples from the sixth replicate exhibited a significant increase in both L-Trp titer/OD (Figure 4a) and growth rate (Figure S10), whereas in the non-selective medium, the L-Trp titer/OD remained essentially unchanged. From generations 12 and 16 (G12 and G16), we isolated 24 single colonies from the culture of replicate No. 6 in the selective medium (lib-M6 at G12 and G16) and 12 single colonies from culture in the non-selective medium (lib-G at G12 and G16). We chose generation 12 for its highest L-Trp titer/OD among the total 20 generations and thus we anticipated that the possibility of isolating best mutants is higher. As the titer/OD of generation 13, 14 and 16 are the second highest and are almost the same, we chose generation 16 as it is 4 generations away from generation 12 and we anticipated that more genetic changes would be found from generation 16 other than generation 13 and 14 as they are closer to generation 12. We sequenced the *TrpE* region on the corresponding plasmids. The sequencing results are shown in Table 1. Two mutants, mutant1 (V68I, V228A, H459Q) and mutant2 (A156T) were enriched in the selective medium, and the fraction of mutant1 increased from 70% to 100% from G12 to G16. In the non-selective medium, only one mutant, mutantC (P273H, A327V), was enriched in both G12 and G16. We then constructed three plasmids, each one harboring one of the

different enriched mutations, called pED-mutant1, pED-mutant2, and pED-mutantC. We used them to transform B10/pMC and different B10 pED-carrying strains and measured the corresponding L-Trp production in M9-cas-glucose medium. Both B10/pMC and B10 pED-mutant strains (-mutant1 and -mutant2) exhibited an ~two-fold increase in L-Trp production compared with B10 pEDwt that carried the parental plasmid; the productivity of pED-mutantC was similar to that of pEDwt (Figure 4b). The mutations identified in mutant1 and mutant2 were not known to increase L-Trp production; thus, we concluded that the selection method permitted discovery of novel beneficial mutations from within a relatively large and undefined mutational library. The fact that mutant1 finally overtook the population may be due to some other unknown beneficial mutations in the genome causing different dynamics of L-Trp production or different distribution of the subpopulation caused by non-genetic variation within isogenic populations⁴⁹, some possibilities to be further investigated. And from the perspective of enzyme structure, future work may focus on precisely how the mutations in *TrpE* (V68I, V228A, H459Q, A156T) discovered in this study contribute to the observed increase in L-Trp production.

Taken together, these results indicate that this new approach is a powerful and flexible tool for high-throughput engineering of proteins. In a validated selection system for targeted protein function, it quickly identifies novel active sites, even as encoded by vast mutant libraries.

Application of the Selection Platform for Mutational Breeding of L-Trp High Producers at the Level of the Genome. Although our knowledge about microbial metabolism is increasing with the detailed functional annotation of each gene, research⁵⁰ suggests that genes currently without direct links to target metabolite networks may have an unexpected impact on the future choice and elaboration of microbial cell factories. For this reason, we tested our strategy on the evolutionary engineering of high L-Trp producers through random mutagenesis of the whole genome followed by targeted selection. It is likely that genome-wide mutations beneficial to metabolite production are much less frequent than neutral or cheater

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409 mutations. Only by reducing the escape rate—as in the present strategy—can we
410 establish effective selection filters for desired traits. Naturally occurring mutations in
411 most microbes are rare and thus, they are far from satisfying the demanding
412 requirements of engineering applications. Accordingly, our experiments began with
413 ARTP mutagenesis to accelerate the generation of genetic diversity. From the results
414 of our previous preliminary test, we had found that even though our platform was
415 very robust, we could not obtain the high L-Trp producer phenotype from a B1/pMC
416 strain with a comparatively wild-type genotype, even after >700 h of transfer
417 selection. As L-Trp biosynthesis is related to several metabolic pathways, acquisition
418 of the high Trp-producer phenotype would likely require the simultaneous alteration
419 of multiple genes. To expedite the generation of new beneficial mutations at the
420 genome level, we constructed a strain, B12, in which we modified all the known
421 critical sites related to L-Trp biosynthesis. B12 mutational changes included removing
422 competitive pathways, blocking downstream L-Trp degradation pathways, and
423 enhancing synthetic routes. We used B12 to construct a new parental strain carrying
424 the pMC2 plasmid, which was derived from pMC by adding the constitutively
425 expressed *sacB* gene to help counter-selection when we want to eliminate the
426 plasmids from host cells. B12/pMC2 was mutated by ARTP and subjected to
427 continuous evolution. The L-Trp production of evolved populations in selective media
428 changed over time (Figure 5a), and, after increasing in early rounds, it remained
429 relatively stable up to at least G15. We randomly selected 15 single colonies from G4,
430 G11, and G14 of each parallel experiment to assess L-Trp production in the
431 non-selective medium. We chose G11 as its L-Trp production in three parallel
432 experiments was all in relatively high levels for the first time. And G4 and G14 were
433 chosen to help us learn more about the evolutionary trace of our selection. The
434 incremental rate of L-Trp production of the picked strains was plotted against that of
435 the parental strain, and the results showed different evolutionary trajectories (Figure
436 S11). Finally, we selected several of the highest producing strains to confirm their
437 production. The results showed that we had obtained strains with production levels
438 increased by ~55–65%; in several instances, this was achieved after only a few rounds

of selection (G1–G4; Figure 5b). To make sure the increase of L-Trp production was caused by mutations on the genome, we further extracted the pMC2 plasmids from the evolved strains shown in Figure 5b and retransformed the original pMC2 plasmids into them. The production of new strains remained the same with the picked evolved ones and was higher than the parent strains (data not shown). This result indicated that it was the mutations on the genome that contributed to the phenotype. Then, we performed the genome sequencing on five evolved strains (EGMB81-G11-1/pMC, EGMB81-G14-2/pMC, EGMB82-G4-1/pMC, EGMB83-G11-2/pMC, EGMB83-G14-1/pMC) and summed up the mutation sites in the genome scale map of parent strain (Figure S12). Some sites (*pcnB*, *rihC*) were related to DNA replication and repair, while others were mainly concerned with metabolic reactions. Further detection need to be done to figure out the effective sites. Collectively, these existing results amply demonstrated the efficacy of this selection method in the discovery of rare and beneficial novel mutations at the genome level, which constitutes an important advance in strain development both for industrial production and in-depth mechanistic studies.

From all the experiment above, we found that several crucial issues required further discussions in our strategy. First, the operational range of a selection circuit, defined as the chemical concentration range in which microbes continue to experience growth advantage as the concentration increases,¹⁴ determines the utility of the selection circuit for improving metabolite production, so it should be tuned seriously. The upper boundary of the operational range defines the limit that production optimization can reach. Here, the upper boundary of the pMC circuit was 20 μ M Ala-Trp(exogenously added). To increase the upper limit of the pMC circuit and thereby extend its utility for pathway optimization, there were two possible strategies: adding a degradation-encoding tag to *malQ* to accelerate MalQ proteolysis or reducing the ribosomal binding site strength of the *malQ* mRNA to attenuate translation. Furthermore, for the selection to be sufficiently strict, the basal expression of *malQ* must be lowered. As the sensor itself primarily determines basal expression,

and because most natural sensors may not have evolved to completely repress the basal expression of the genes they control, a promising approach may be to reduce basal expression through sensor mutation followed by selection for a stricter sensor. Second, although we picked out strains with increased production in both experimental approaches finally, we still found that the L-Trp titer/OD first rose and then, in some cases, declined. We surmise that as the titer/OD increases, the stress may become progressively less strict and consequently lead to a greater possibility that irrelevant mutations may predominate in the population. As this risk would be expected to increase with time as spontaneous mutations accumulate, the number of selection cycles should be limited to a reasonable time range. Third, it should be admitted that the increase in L-Trp production of evolved strains was not very remarkable in our work. It might be blamed on the impossibility of generating strains with multiple beneficial mutations in the limited selection time, so the mutation sites we found were supposed to be locally optimal solutions. Our results indicated that we can easily find non-intuitive and specific mutations in different parallel experimental groups. By combination of these mutations, there is a hope for further improvement of production. And looking at it from another point of view, our selection systems can serve as a powerful discovery platform to provide abundant raw research materials for deep learning in biological mechanism study.

In summary, we believe that the strategy of the novel selection circuit defined in this work shows much potential for providing a framework for improving directed synthesis of other trait-oriented chemicals by microbial cell factories.

METHODS

Strains and Culture Conditions. Strains and plasmids are described in Table 2. The red recombination method⁵¹ was used for gene knockout. The following standard culture protocols were used throughout: to generate seed cultures, single colonies

from plates were inoculated into 5 mL LB medium in 15-mL centrifuge tubes (BD) and cultured overnight at 37°C at 200 rpm. Experimental cultures were started from seed cultures by inoculation into 10 mL medium in a 50-mL flask to an initial OD₆₀₀ of 0.02 and incubated as above for 24 h or the times indicated. For growth to log phase, OD₆₀₀ was monitored throughout culturing.

Media. M9-cas-maltose medium: 4 g/L maltose, M9 salts (17.1 g/L Na₂HPO₄•12H₂O, 3 g/L KH₂PO₄, 0.5 g/L NaCl, 1 g/L NH₄Cl), 2 mM MgSO₄, and 0.1 mM CaCl₂, 1g/L casamino acids (J851, Amresco, Solon, OH),⁵² 0.34g/L thiamine pyrophosphate (Sigma-Aldrich, cat. no. C8754-1G). M9-cas-glucose medium: 4 g/L glucose, M9 salts, 2 mM MgSO₄, and 0.1 mM CaCl₂, 1g/L casamino acids,⁵² 0.34g/L thiamine pyrophosphate. M9-YE medium: 5 g/L glucose, M9 salts, 1 g/L yeast extract, 1 mM MgSO₄, and 0.1 mM CaCl₂. As appropriate, addition of 100 mg/L ampicillin, or 34 mg/L or 14 mg/L chloromycetin to the media was used to maintain the presence of corresponding drug-resistant plasmids.

Plasmid Construction. All the oligonucleotides used in this work were purchased from Taihe Biotechnology Co., LTD (Beijing, China) and listed in Table S1. Construction of individual plasmids is described below.

Construction of pMC, pTet, and pMC2. The pMC plasmid contains *malQ*, PCR-amplified from the *E. coli* BL21(DE3) genome using the primer of pTrc99a-MalQ-F/pTrc99a-MalQ-R and fused downstream to the *tnaC* regulatory element of the *tnaCAB* operon, PCR-amplified from pSenTrp using the primer of *tnaC*-*tnaA*-UP-F/*tnaC*-*tnaA*-UP-R.⁵³ The *trc* promoter of pTrc99A was substituted with the pBAD promoter (PCR-amplified from pNotgate) along with the *araC* regulatory element of the *ara* operon upstream of the pBAD promoter by Gibson assembly.⁵⁴ The PCR-amplified fragments of *malQ* and the *tnaC* regulatory element were ligated into the multiple cloning site of the modified pTrc99A plasmid by Gibson assembly to construct pMC. *tnaC* acts as the L-Trp sensor⁵⁵ to transform the

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3 529 signal of the intracellular L-Trp concentration into the expression of the downstream
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5 530 *malQ*. pTet was constructed by replacing *malQ* in pMC with *tetA* and adding
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7 531 *dnaQ926* controlled by the pBAD promoter. pMC2 was built by adding the
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9 532 constitutively expressed *sacB* to pMC upstream of *Amp*.
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13 534 **Construction of pEDwt and pEDfbr.** Plasmid pEDfbr was constructed by
14
15 535 substituting the T7 promoter of pEDori with the J23109 promoter from the Registry
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17 536 of Standard Biological Parts (partsregistry.org) and by substituting the p15A origin of
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19 537 replication of pEDori with that of pSC101 (PCR-amplified from pNotgate). pEDwt
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21 538 was constructed by introducing two point mutations into *TrpE*: Phe40Ser (TTC to
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23 539 TCC), and Thr293Met (ACG to ATG).
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25 540

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27 541 **Construction of the Plasmid Library of pED-S40SSM.** Plasmid pEDwt was
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29 542 PCR-amplified by two pairs of primers S40rd-F/Inner-R and Inner-F/S40rd-R, and the
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31 543 two amplified fragments were ligated by Gibson assembly to form the site-saturation
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33 544 mutagenesis library of the *TrpE* S40 site. The S40rd-F primer contains NNK to cover
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35 545 the TCC codon of the S40 *TrpE* site. The sequence of S40rd-F primer is:
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37 546 5'-TCGTCCGGCAACGCTGCTGCTGGAANNKGCAGATATCGACAGCAAAGAT
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39 547 G-3'.
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43 549 **Preparation of the Error-prone *TrpE* Library, pED-Library.** The *TrpE*
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45 550 fragment was amplified with error-prone PCR using the primer pair of
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47 551 PF_*TrpE*_eplib/PR_*TrpE*_eplib from pEDwt to form the fragment *TrpE*-ep. Then the
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49 552 backbone fragment of pEDwt was amplified by the primer pair of
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51 553 PF_pEDbackbone/PR_pEDbackbone and was ligated with the *TrpE*-ep fragment by
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53 554 Gibson assembly to form the *pED-library*. The concentration of Mn^{2+} used in the
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55 555 error-prone PCR protocol was 0.1 mM, and the corresponding mutation rate was ~3.5
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57 556 nucleotides/molecule measured by calculating the mean mutation rate of 10 randomly
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59 557 selected colonies.
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61 558

Characterization of pMC. For the characterization of the pMC circuit with exogenously added Ala-Trp, we used the B1/pMC strain in M9-cas maltose medium with 0.1 g/L L-arabinose, and cultures were grown to log phase. To compare the growth rate of strains with different L-Trp productivities, we used the strains B10/pMC+pEDwt and B10/pMC+pEDfbr grown to log phase in M9-cas maltose medium.

Growth Selection for pMC. For the growth selection of the mutagenic library, the library plasmids (site-saturation mutagenesis library, pED-S40SSM, or error-prone PCR library, pED-library) were transformed individually by electroporation into strain B10/pMC. Ten times the number of library size transformants were scraped off the plate and inoculated both into selective medium (M9-cas-maltose medium with 3.8 g/L maltose and 0.2 g/L glucose) and non-selective medium (M9-cas-glucose medium). For the transfer cultures, when the OD₆₀₀ of strains in the selective medium reached 0.8–1.0, the cultures were transferred into fresh medium and denoted as generation n+1.

Generation of Mutational Library by *dnaQ926*. Parent strains, after culture in LB medium for 16 h, were transferred to fresh LB medium (1:100, v:v) with 1 g/L L-arabinose to induce expression of *dnaQ926*, which increased the mutation rate by 10-fold compared with the natural mutation rate (data not shown). Strains were cultured in this medium for another 24 h and used as the initial mutational library.

Generation of Mutational Library by ARTP. Parent strains, after culture in LB medium for 16 h, were transferred to fresh LB medium (1:100, v:v). When OD₆₀₀ reached ~ 0.8, 10 µL culture solution was spread on a sterile iron plate to be irradiated by ARTP for 25 s with a power of 100 W and a gas flow of 10 SLM. Strains were washed from the plate and culture resumed in the non-selective medium for 24 h to generate the initial mutational library.

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Characterization and Evolution Process for the pTet Circuit. For the pTet circuit, selection was performed by adding tet to M9-YE medium (non-selective) when the OD₆₀₀ of strains reached 0.4–0.6. Growth was monitored for 20 h to see how the circuit responded to exogenously added Ala-Trp or to L-Trp producers with different production capacities. For continuous evolution, cultures were transferred every 24 h and tet was added as above for every round of selection. OD₆₀₀ and L-Trp production were tested at the end of each selection, and 500 µL of the evolved strain was stocked in 50% glycerol solution at –20°C.

Quantification of Extracellular L-Trp and Maltose. The extracellular L-Trp titer was measured for each generation after 24 h of fermentation starting from single-colony preparations. For the quantification of L-Trp, culture samples were centrifuged at 18,000 ×g for 10 min, and 500 µL of each supernatant was separated in an Inertsil ODS-SP 4.6 × 250 mm column using a Shimadzu HPLC system. The mobile phase was methanol (A) and 0.05% (w/v) aqueous H₃PO₄, and the UV detector was set to 280 nm. The elution procedure was 2% A between 0–3 min; 2–80% A between 3–30 min; 80% A between 30–40 min; 80–2% A between 40–50 min; and 2% A between 50–60 min with a flow rate of 0.5 mL/min. For the detection of maltose, culture samples were prepared as above, and 500 µL of each supernatant fraction was separated in an Aminex HPX-87H, 300 × 7.8 mm column using the Shimadzu HPLC system. The mobile phase was 5 mM aqueous H₂SO₄ with a constant flow rate of 0.8 mL/min, and it was analyzed with a refractive index detector (RID-10A, Shimadzu).

Figure and Table legends

Figure 1. pMC circuit in genomic *malQ* knockout environment: L-Trp-dependent glucose production. (a) Mechanisms of the pMC selection circuit in the growth-production coupling function and the selection process to enrich for high producers from a library of mutants with different L-Trp production. (b) Growth response of the pMC circuit towards exogenously added Ala-Trp. Fitness plateaued at Ala-Trp >20 μ M. NC: strains without pMC circuit. Data represent the mean $\pm$ SD; n = 3. (c) Growth curves for B10/pMC: +pEDwt or +pEDfbr, in selective or non-selective medium. (d) L-Trp titer/OD of the mixed cultures during transfer culture. Gx: generation x, where x = 1, 2, 3, 4, or 5, i.e., the number of culture transfers. Mix 1:9, 1:3, or 1:1 indicates the initial ratio of B10/pMC+pEDwt to B10/pMC+pEDfbr. Data in Figure 1b and 1c represent the mean $\pm$ SD; n = 3.

Figure 2. Evaluation of anti-escape ability of circuits based on carbon source utilization and on antibiotic resistance. (a) The growth curve for each evolved strain population from BL21(DE3)/pTet, mutated by *dnaQ* 926, in selective and non-selective media. Arrows show times of tet addition. (b, c) Growth curves in selective or non-selective medium for each evolved strain population from (b) BL21(DE3)/pTet, mutated by ARTP, to give EGT strains 1–3, and from (c) B1/pMC, mutated by ARTP, to give EGM strains 1–3. Three biological parallel studies were done in each experiment.

Figure 3. Application of the selection method to a site-saturation mutagenesis library targeting the S40 feedback inhibition binding site of TrpE. (a) Growth curve for strains during transfer culture. S40rd-1, -2, and -3 denote triplicate samples from the S40rd mutagenesis library in the selective medium, and S40rd-C denotes a sample of the same library cycled in non-selective medium. (b) L-Trp titer/OD during culture transfer for G1–G8. After 24 h of culture, the extracellular titer/OD of L-Trp was measured. (c) Base calling of the TrpE S40 site at G1 and G8. Nucleotide bases: green, A; black, G; blue, C; red, T. Three genotypes (AGG, GAT, TTG) were enriched in selective medium, and one genotype (AC with one base deletion) was enriched in non-selective medium. (d) L-Trp titer/OD of the three enriched mutants pED-S40R, pED-S40D, and pED-S40L. Single-site mutagenesis was conducted to produce the corresponding mutations on pEDwt. Strain B10 was transformed with each of the plasmids, and L-Trp production was measured after 24 h of fermentation. Data in Figure 3d represent the mean $\pm$ SD; n = 3.

Figure 4. Application of the selection method to the error-prone TrpE library. (a) Extracellular titer/OD of L-Trp measured after 24 h of transfer culture. lib-M1–6: Six replicates from selective medium; lib-G: single sample from non-selective medium. (b) L-Trp titer/OD of three reconstructed strains. Site mutagenesis of pEDwt generated three plasmids, each carrying one of the mutations found in the enriched mutants. B10/pMC and B10 were each transformed with the individual plasmids, and

655 L-Trp production was measured after 24 h of fermentation. Data in Figure 4b
656 represent the mean $\pm$ SD; n = 3.

657
658 Figure 5. Application at the genome level of the selection platform for mutational
659 breeding of L-Trp high producers. (a) L-Trp production of three high L-Trp producers,
660 i.e., the evolved B12/pMC2 strains EGMB81, EGMB82 and EGMB83, monitored
661 over 20 selection cycles. Three biological parallel studies were done. (b) Production
662 as measured at several selected generations of the high L-Trp producers in (a). Data in
663 Figure 5b represent the mean $\pm$ SD; n = 3.

664
665 Table 1 Percent enriched mutants in G12 and G16

666
667 Table 2 List of strains and plasmids

668

Figures:

Fig. 1a)

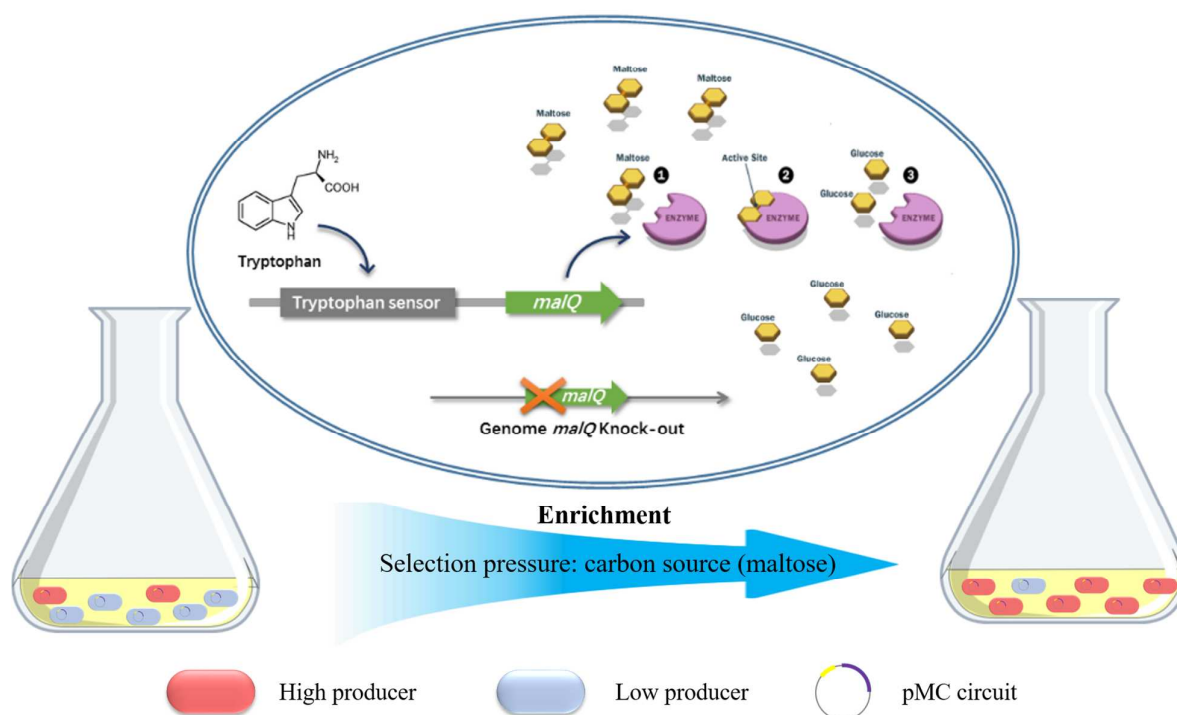
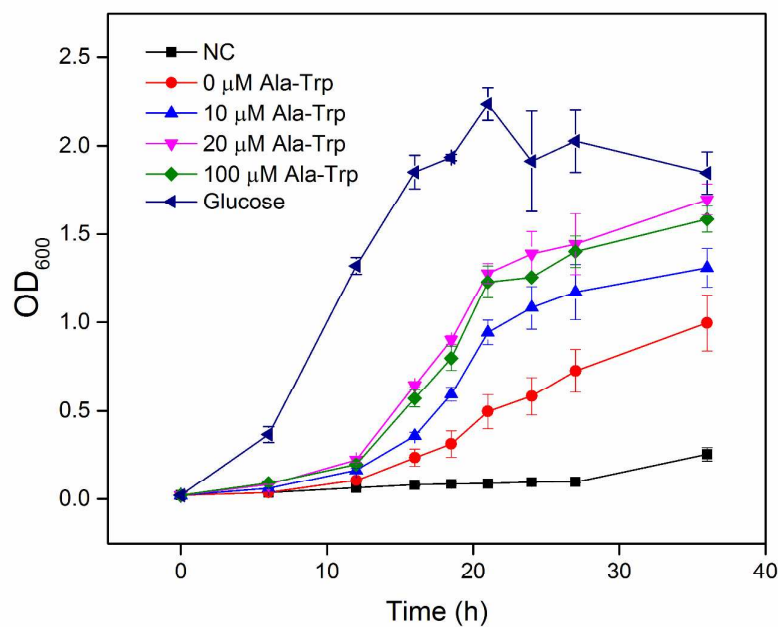


Fig. 1b)



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Fig. 1c)

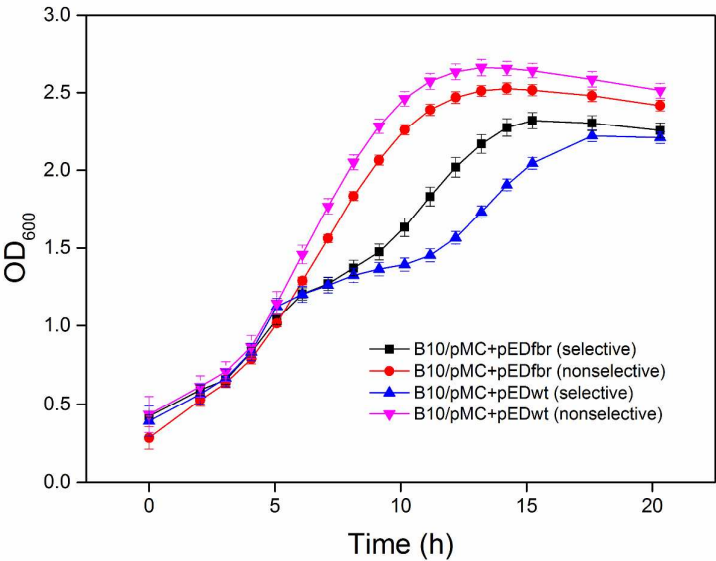


Fig. 1d)

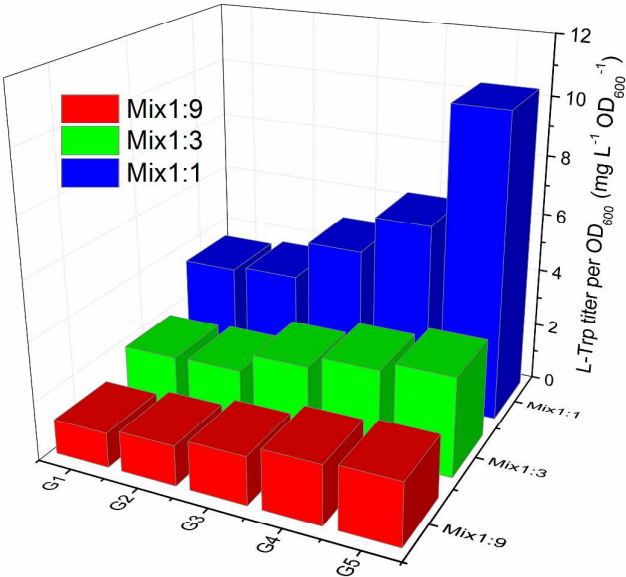


Figure 1. pMC circuit in genomic malQ knockout environment: L-Trp-dependent glucose production. (a) Mechanisms of the pMC selection circuit in the growth-production coupling function and the selection process to enrich for high producers from a library of mutants with different L-Trp production. (b) Growth response of the pMC circuit towards exogenously added Ala-Trp. Fitness plateaued at Ala-Trp >20 μ M. NC: strains without pMC circuit. Data represent the mean $\pm$ SD; n = 3. (c) Growth curves for B10/pMC: +pEDwt or +pEDfbr, in selective or non-selective

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in Figure 1b and 1c represent the mean $\pm$ SD; n = 3.

Fig. 2a)

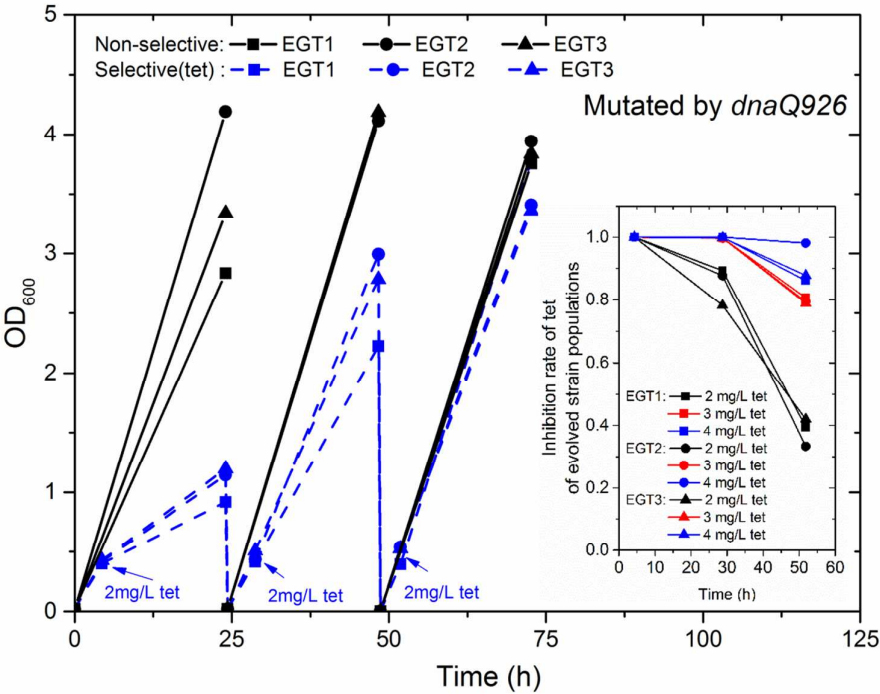
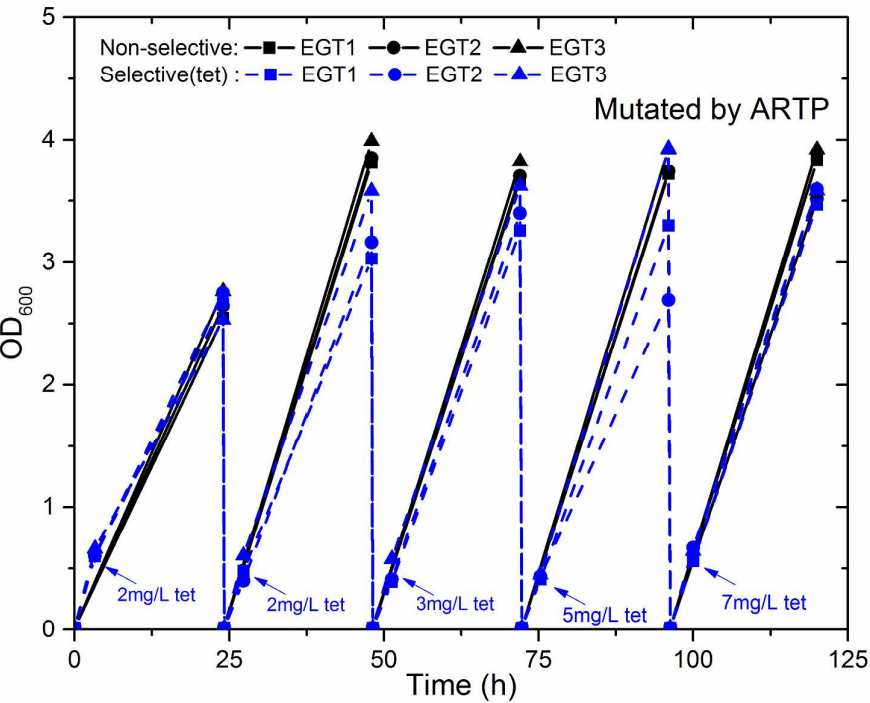
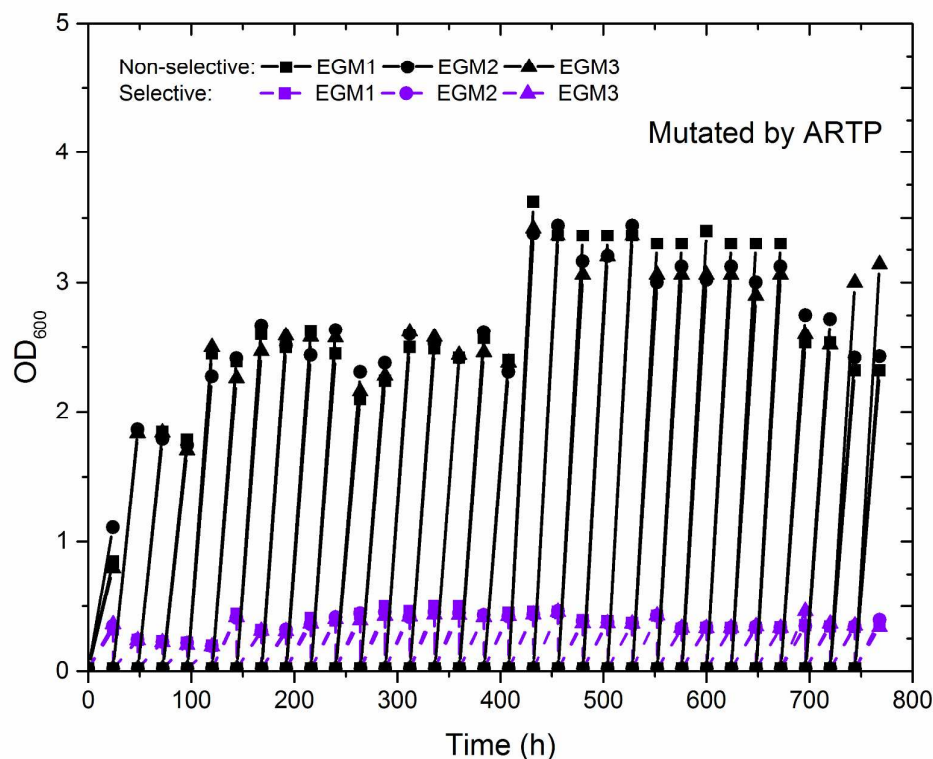


Fig. 2b)



694 Fig. 2c)



695
696
697 Figure 2. Evaluation of anti-escape ability of circuits based on carbon source
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703 mutated by ARTP, to give EGM strains 1–3. Three biological parallel studies were
704 done in each experiment.
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Fig. 3a)

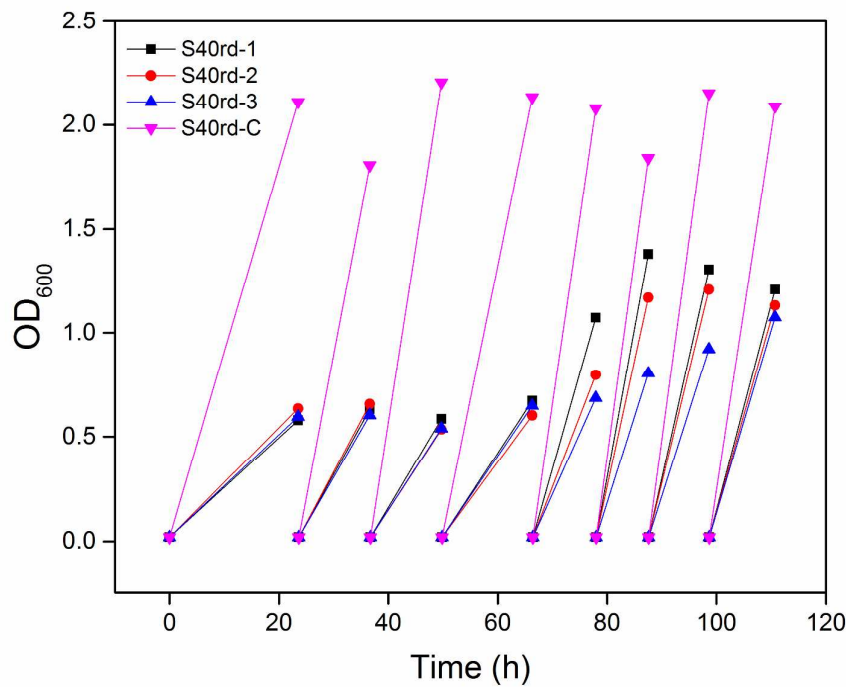
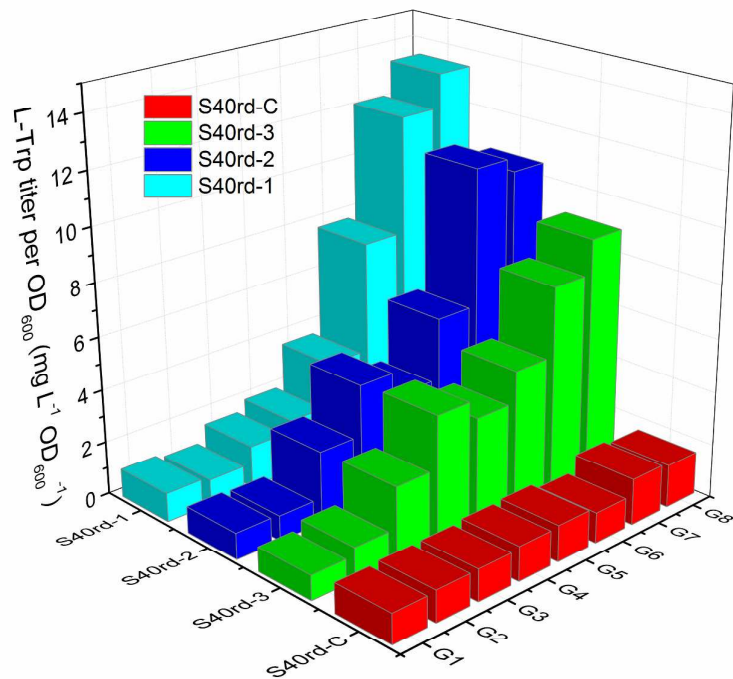
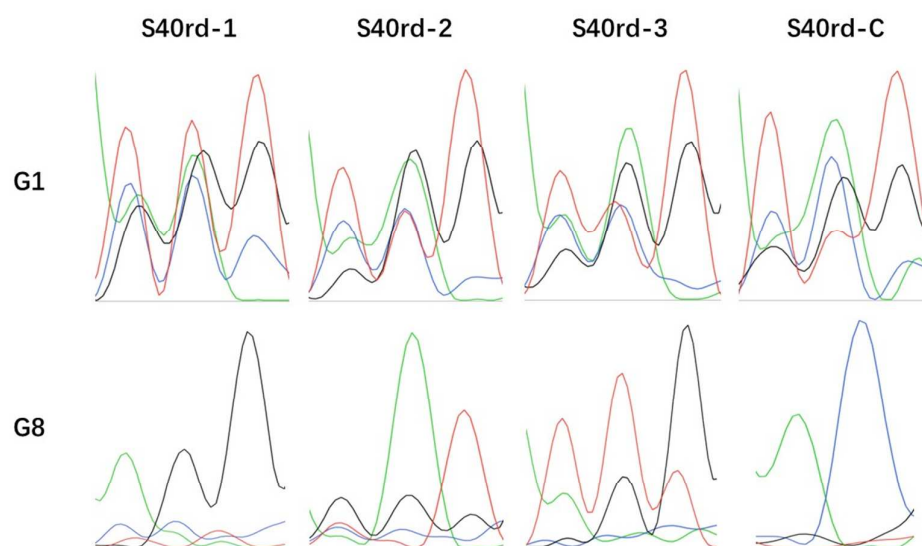
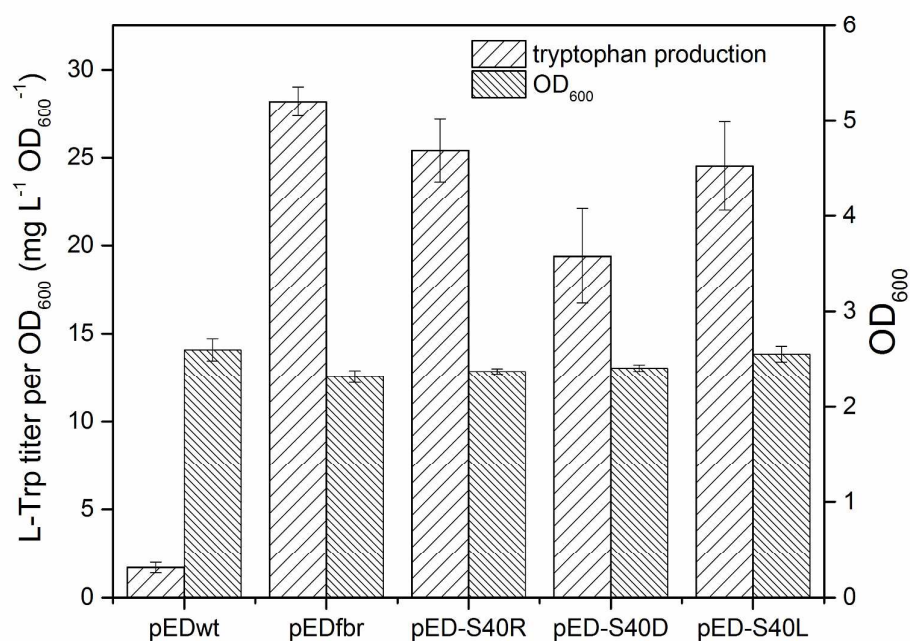


Fig. 3b)



710 Fig. 3c)

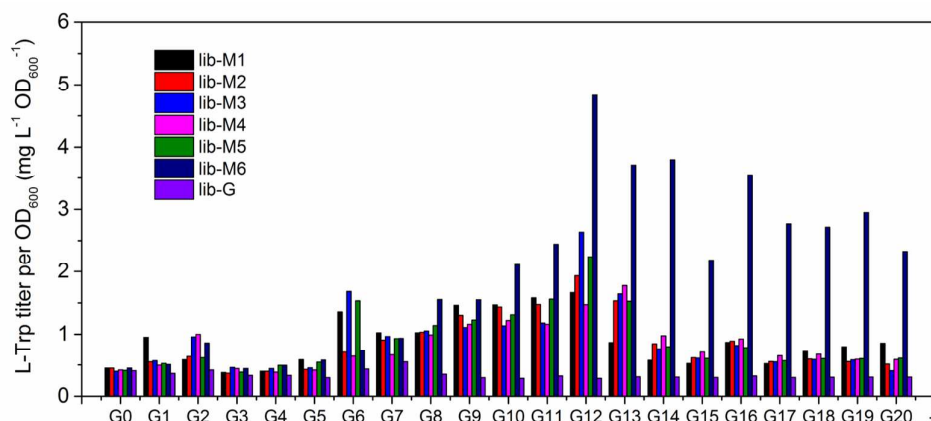
711
712 Fig. 3d)

713

714 Figure 3. Application of the selection method to a site-saturation mutagenesis library
 715 targeting the S40 feedback inhibition binding site of TrpE. (a) Growth curve for
 716 strains during transfer culture. S40rd-1, -2, and -3 denote triplicate samples from the
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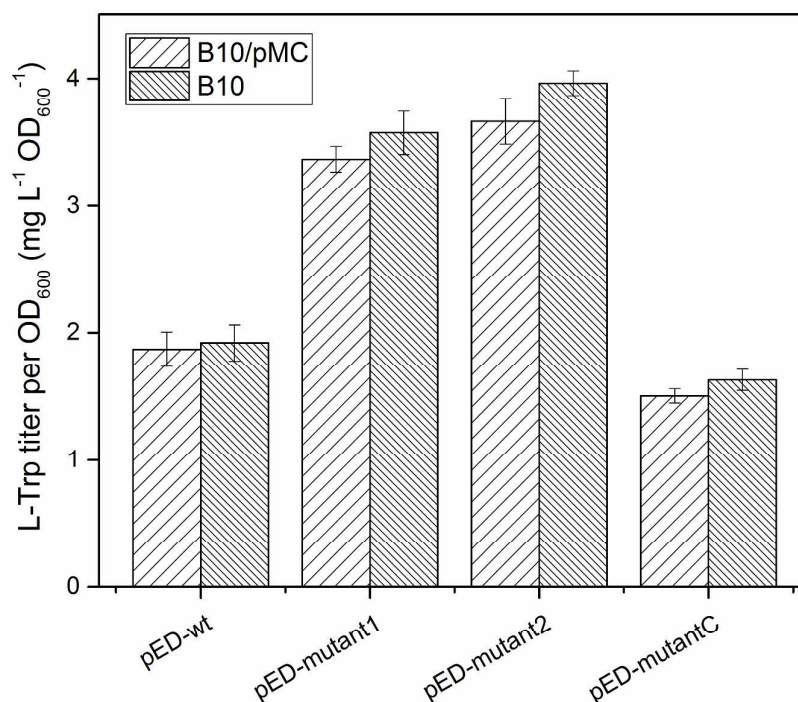
measured. (c) Base calling of the TrpE S40 site at G1 and G8. Nucleotide bases: green, A; black, G; blue, C; red, T. Three genotypes (AGG, GAT, TTG) were enriched in selective medium, and one genotype (AC with one base deletion) was enriched in non-selective medium. (d) L-Trp titer/OD of the three enriched mutants pED-S40R, pED-S40D, and pED-S40L. Single-site mutagenesis was conducted to produce the corresponding mutations on pEDwt. Strain B10 was transformed with each of the plasmids, and L-Trp production was measured after 24 h of fermentation. Data in Figure 3d represent the mean $\pm$ SD; n = 3.

729 Fig. 4a)



730

731 Fig. 4b)



732

733 Figure 4. Application of the selection method to the error-prone TrpE library. (a)
 734 Extracellular titer/OD of L-Trp measured after 24 h of transfer culture. lib-M1–6: Six
 735 replicates from selective medium; lib-G: single sample from non-selective medium.

736 (b) L-Trp titer/OD of three reconstructed strains. Site mutagenesis of pEDwt
 737 generated three plasmids, each carrying one of the mutations found in the enriched
 738 mutants. B10/pMC and B10 were each transformed with the individual plasmids, and
 739 L-Trp production was measured after 24 h of fermentation. Data in Figure 4b represent
 740 the mean $\pm$ SD; n = 3.

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Fig. 5a)

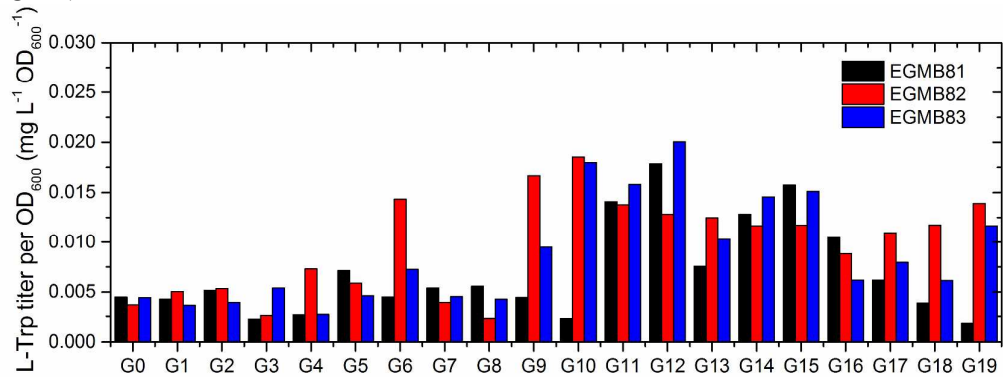


Fig. 5b)

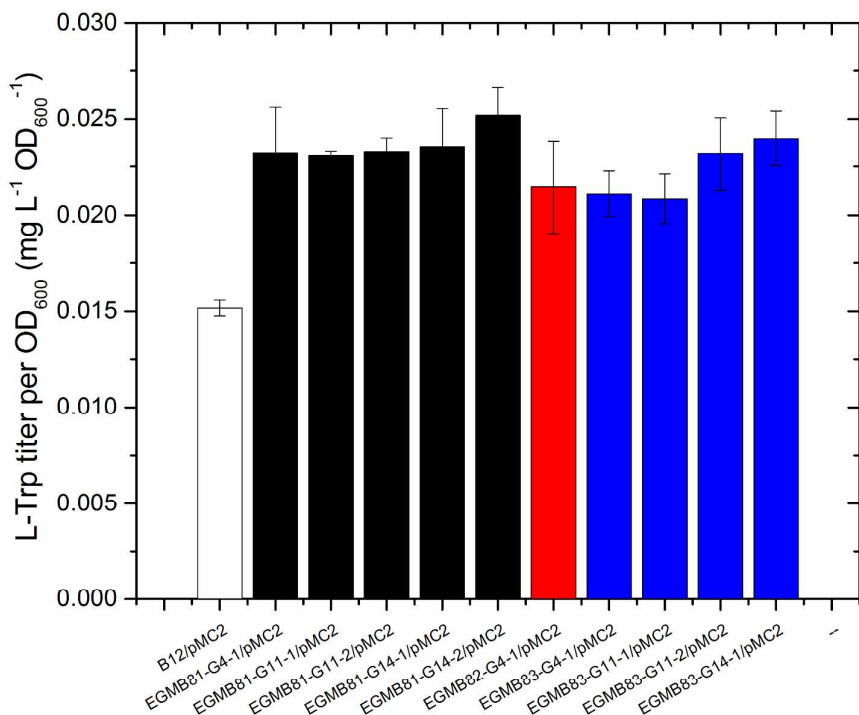


Figure 5. Application at the genome level of the selection platform for mutational breeding of L-Trp high producers. (a) L-Trp production of three high L-Trp producers, i.e., the evolved B12/pMC2 strains EGMB81, EGMB82 and EGMB83, monitored over 20 selection cycles. Three biological parallel studies were done. (b) Production as measured at several selected generations of the high L-Trp producers in (a). Data in Figure 5b represent the mean $\pm$ SD; n = 3.

753 **Tables:**

754 Table 1. Percent enriched mutants in G12 and G16

	Mutant	G12	G16
Selective medium	1	69.6%	100%
	2	30.4%	0%
Non-selective medium	C	100%	100%

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Table 2. List of strains and plasmids.

Bacterial strains or plasmids	Characteristics	Source
Strains		
BL21(DE3)	Wild-type	Fang ^a
B1	<i>E. coli</i> BL21(DE3) $\Delta malQ \Delta araA$	This study
B8	<i>E. coli</i> BL21(DE3) $\Delta TrpR \Delta tnaA \Delta pheA$	Fang ^a
B10	B8 $\Delta araA \Delta malQ$	This study
B11	B8 $\Delta TrpED \Delta araA::(CmR^R)$ $\Delta xylA::(M1-46-TrpE^{fbr}D)$	This study
B12	B11 $\Delta malQ$	This study
Plasmids		
pTrc99A	pBR332 origin, <i>trc</i> promoter, <i>Amp</i> ^R	Novagen
pSenTrp	pTrc99A with regulatory element of <i>tnaCAB</i> operon and <i>egfp</i> , <i>Amp</i> ^R	Fang ^a
pNotgate	pBAD promoter, <i>araC</i> regulatory element of <i>ara</i> operon, <i>Amp</i> ^R	Provided by Lou ^b
pMC	pSenTrp with <i>malQ</i> downstream; the regulatory element of <i>tnaCAB</i> operon controlled by pBAD promoter, <i>araC</i> , <i>Amp</i> ^R	This study
pTet	pSenTrp with <i>tetA</i> downstream the regulatory element of <i>tnaCAB</i> operon controlled by <i>p_{rha}</i> BAD promoter, <i>araC</i> , <i>Amp</i> ^R , <i>dnaQ926</i> controlled by pBAD promoter	This study
pMC2	pMC with <i>sacB</i> constitutively expressed to help circuits lose	This study
pEDori	pACYCDuet with <i>TrpE^{fbr}D</i> (Ser40Phe TCC to TTC; Met293Thr ATG to ACG), <i>CmR</i> ^R	Fang ^a
pEDwt	pACYCDuet with <i>TrpED</i> , J23109 promoter, pSC101 origin, <i>Cm</i> ^R	This study
pEDfbr	pACYCDuet with <i>TrpE^{fbr}D</i> , J23109 promoter, pSC101 origin, <i>Cm</i> ^R	This study
pED-S40SSM	pEDwt with Ser40 site-saturated mutagenesis	This study
pED-S40R	pEDwt with Ser40Arg TCC to AGG	This study
pED-S40D	pEDwt with Ser40Asp TCC to GAT	This study
pED-S40L	pEDwt with Ser40Leu TCC to TTG	This study
pED-library	pEDwt with <i>TrpE</i> library generated by error-prone PCR, <i>Cm</i> ^R	This study
pED-mutant1	pEDwt with V68I, V228A and H459Q	This study
pED-mutant2	pEDwt with A156T	This study
pED-mutantC	pEDwt with P273H / A327V	This study

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^a17. ^b56.

Supporting Information

Figures: fluorescence-based response data of L-Trp biosensors; response curves of pMC circuit based on maltose consumption; L-Trp production and growth of B10/pEDwt and B10/pEDfbr; base calling of the premix culture of the S40 site of TrpE; base calling of the S40 site of TrpE at generations 0, 3 and 5; mechanism of pTet circuit; response curves of the pTet circuit; effect of the pTet circuit on enrichment of high producers; characterization of an escapee from BL21(DE3)/pTet; growth rates during transfer culture of strains with the error-prone TrpE library; incremental rates of L-Trp production of the picked evolved strains with mutations at genomic level; list of mutation sites. Tables: oligonucleotides used in this work.

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773 **Author Contributions**
774 ²These authors contributed equally to the work
775 **Notes**
776 The authors declare no competing financial interest.
777

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Figure 1a

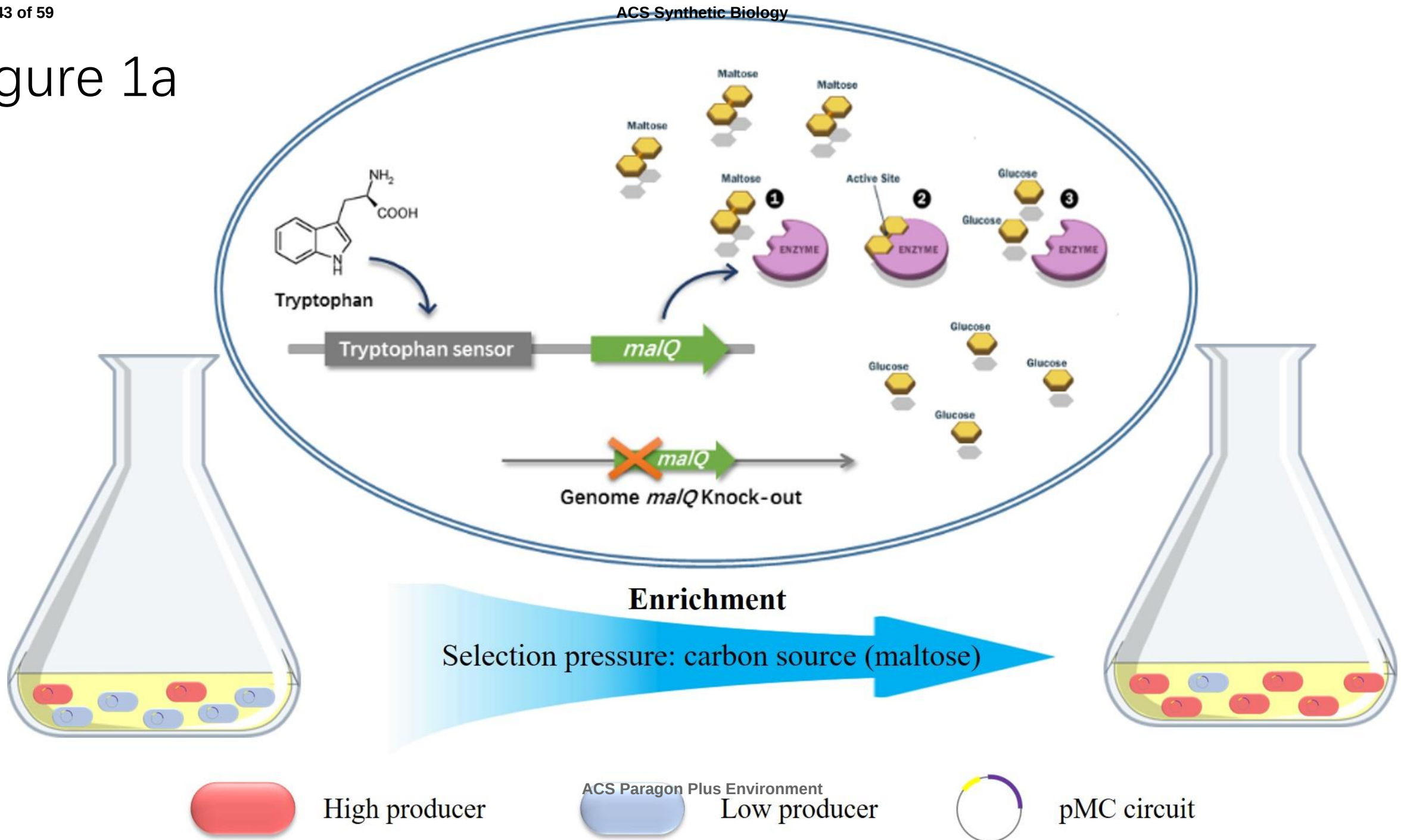


Figure 1b

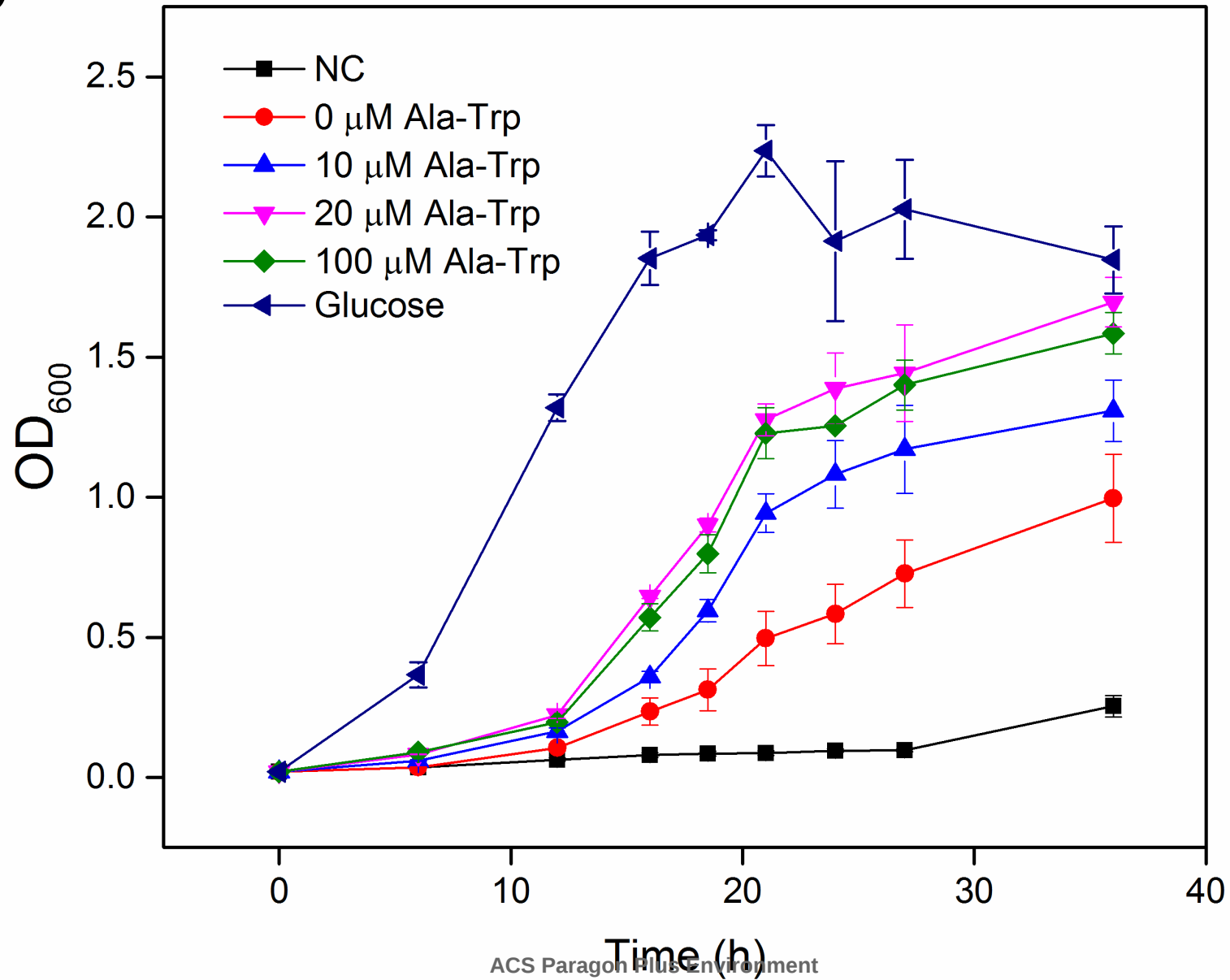


Figure 1c

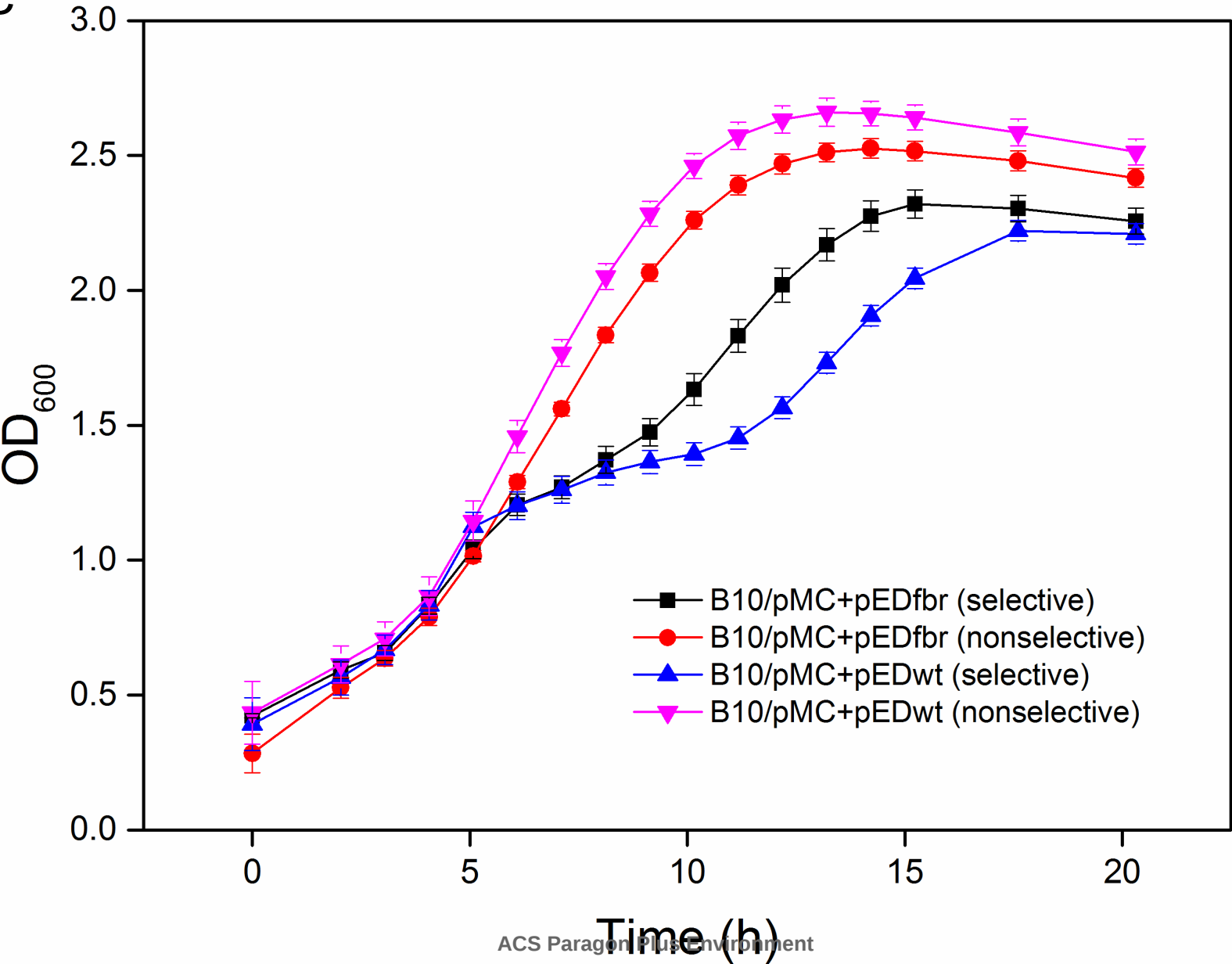


Figure 1d

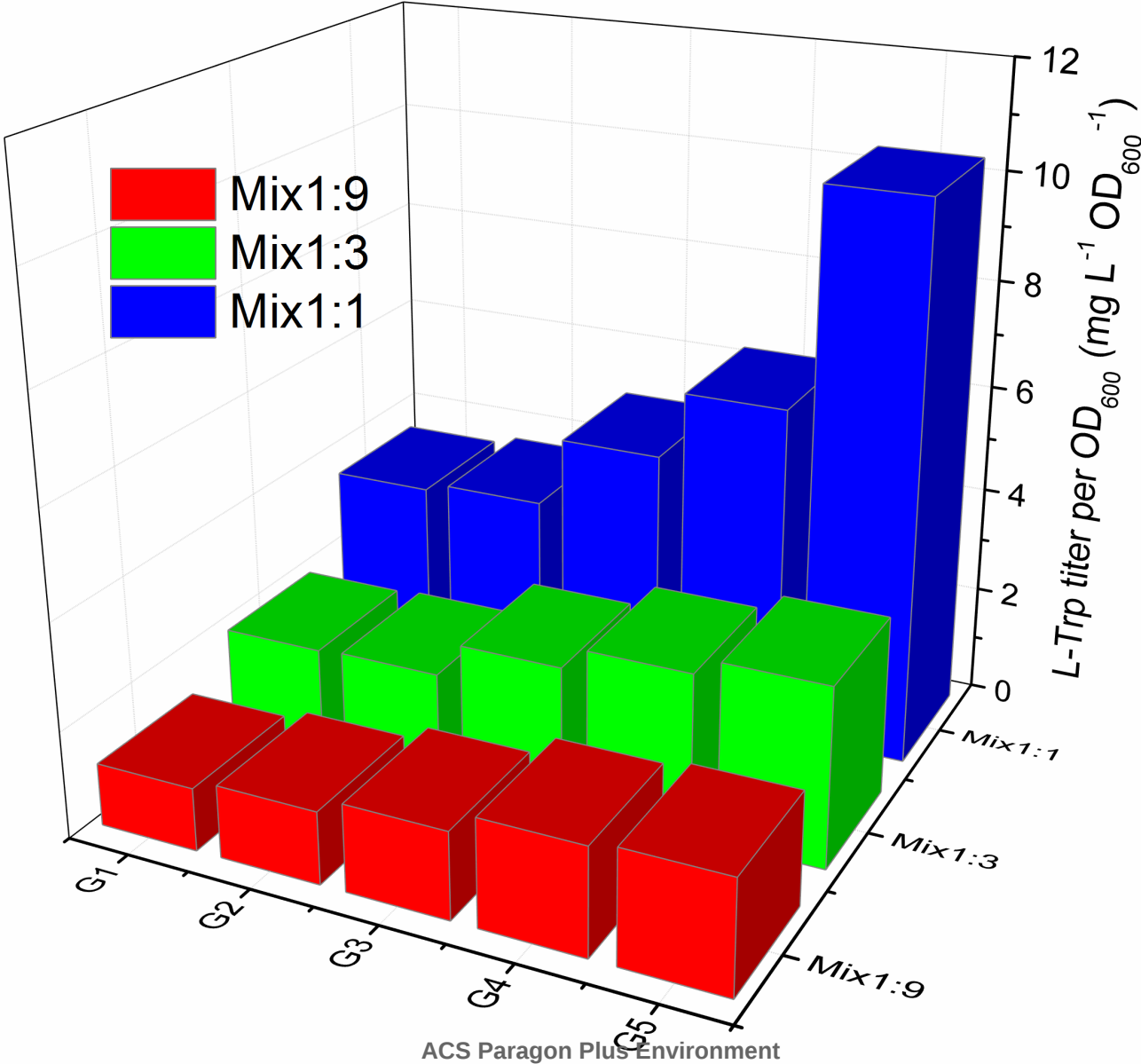


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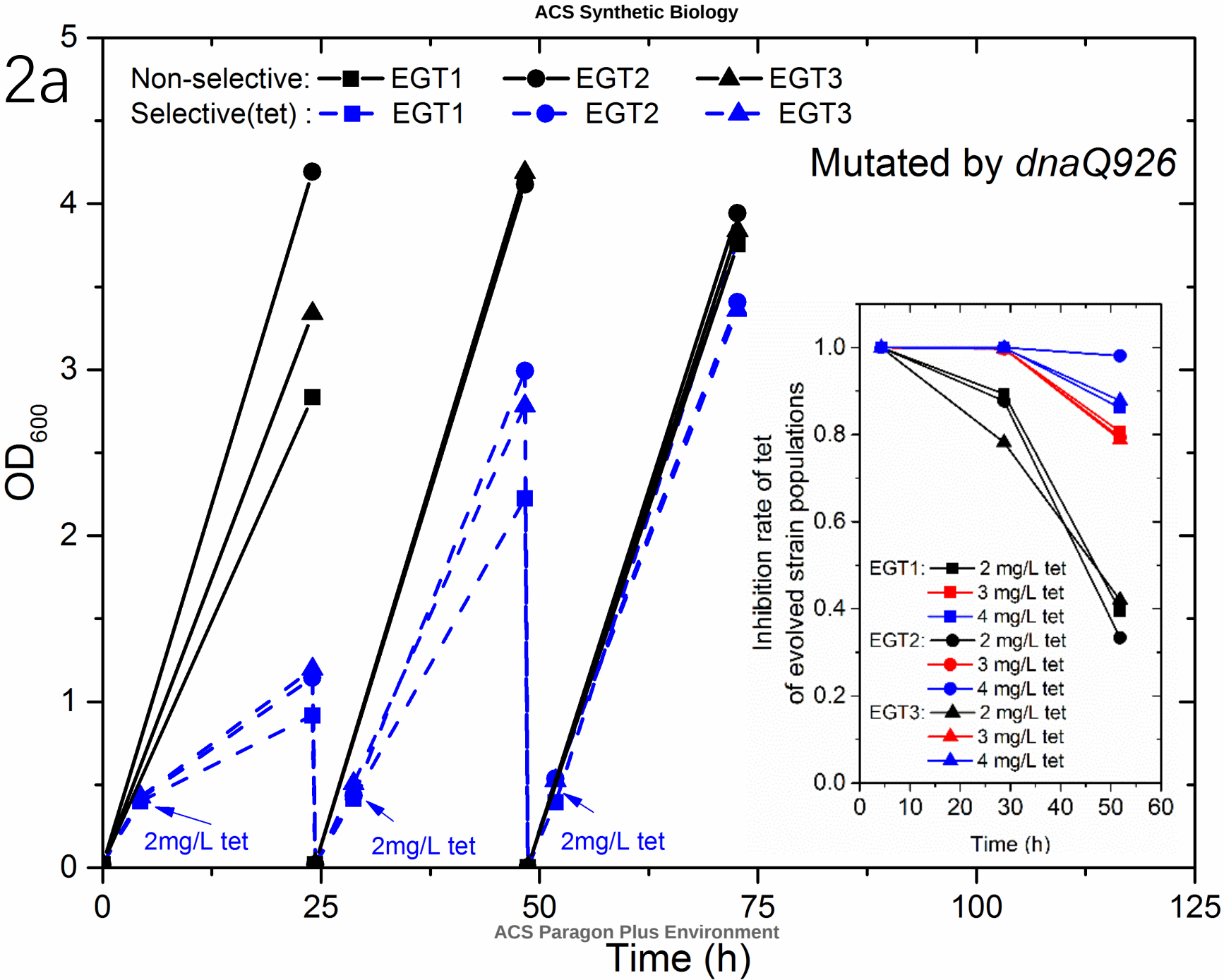


Figure 2b

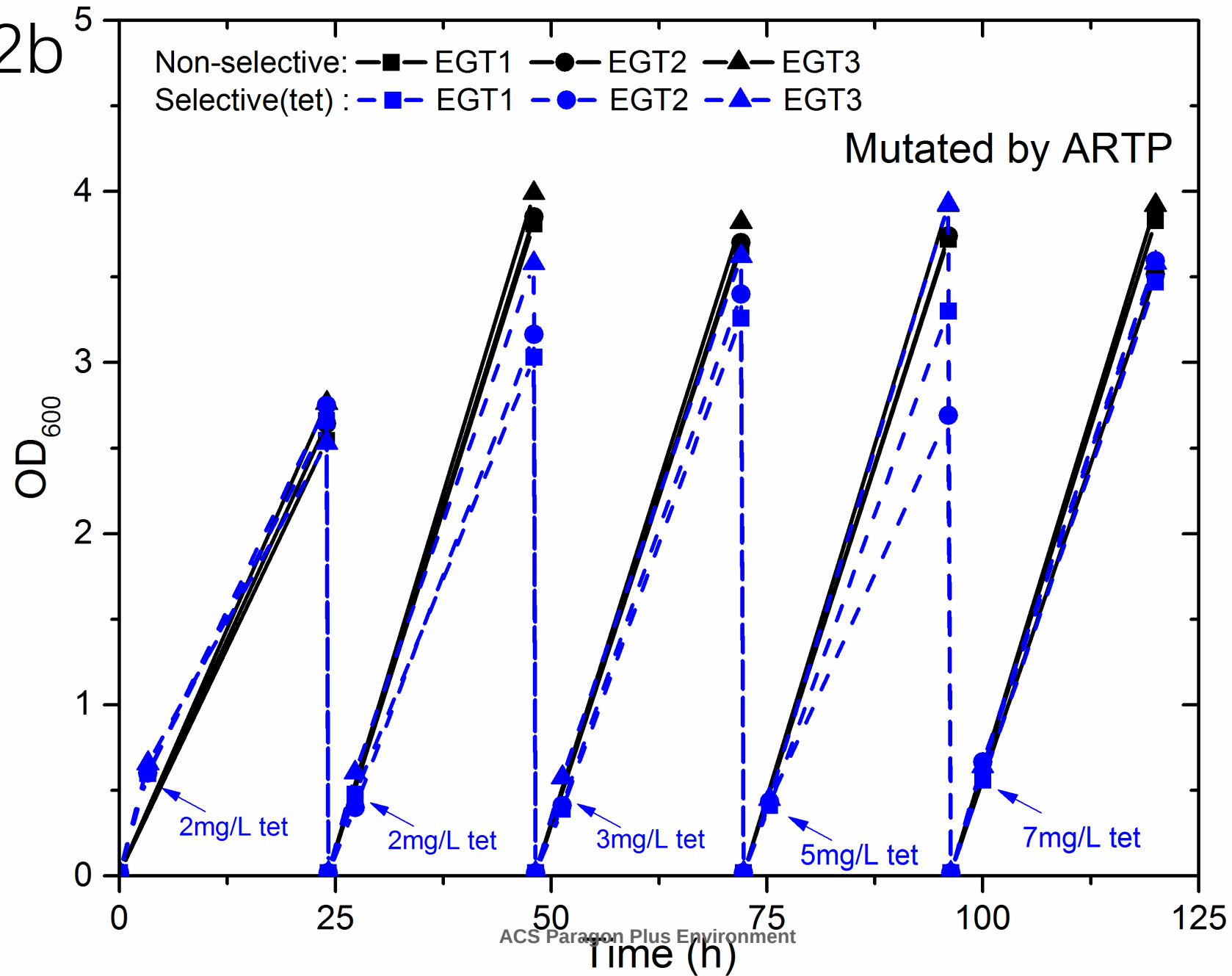


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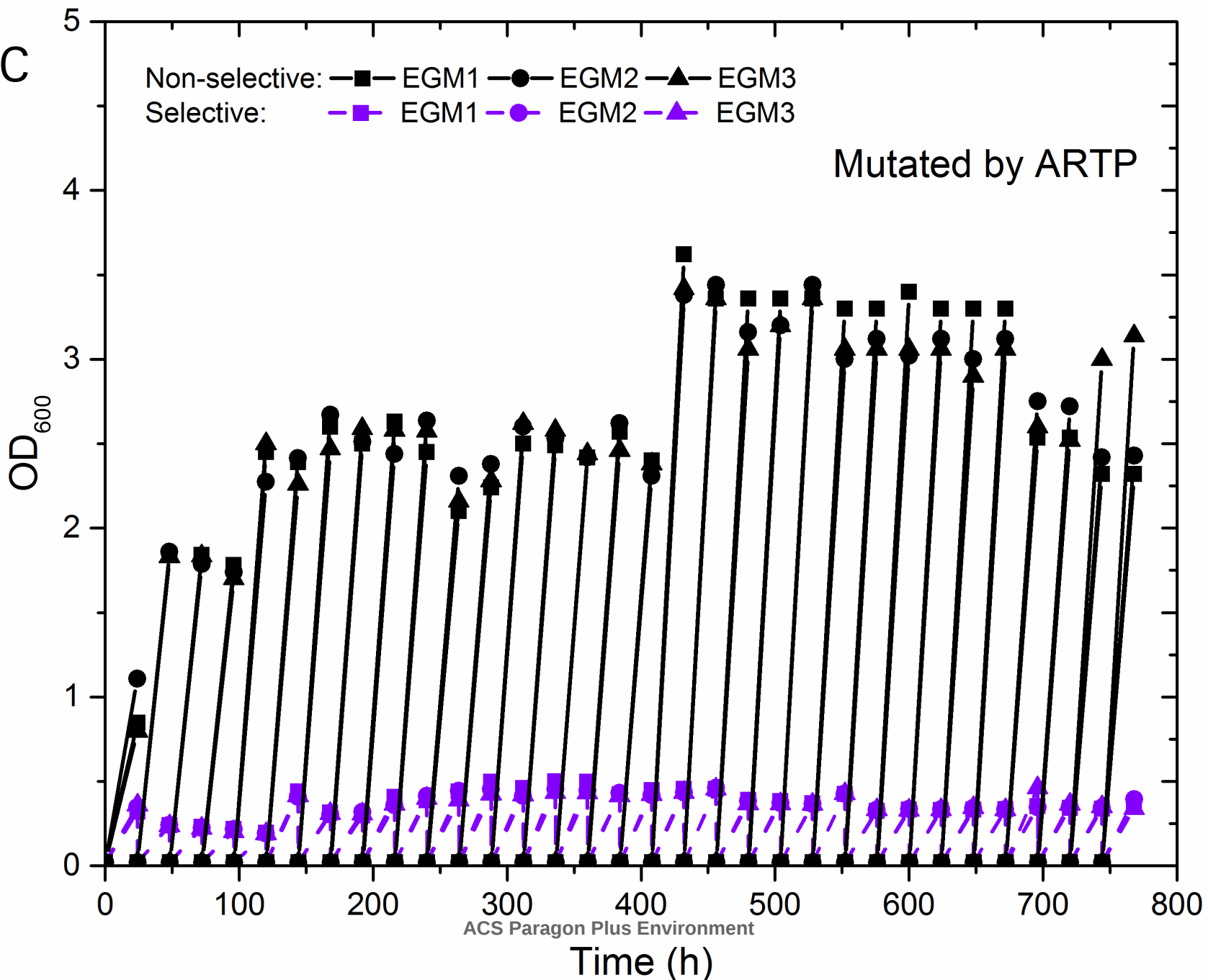


Figure 3a

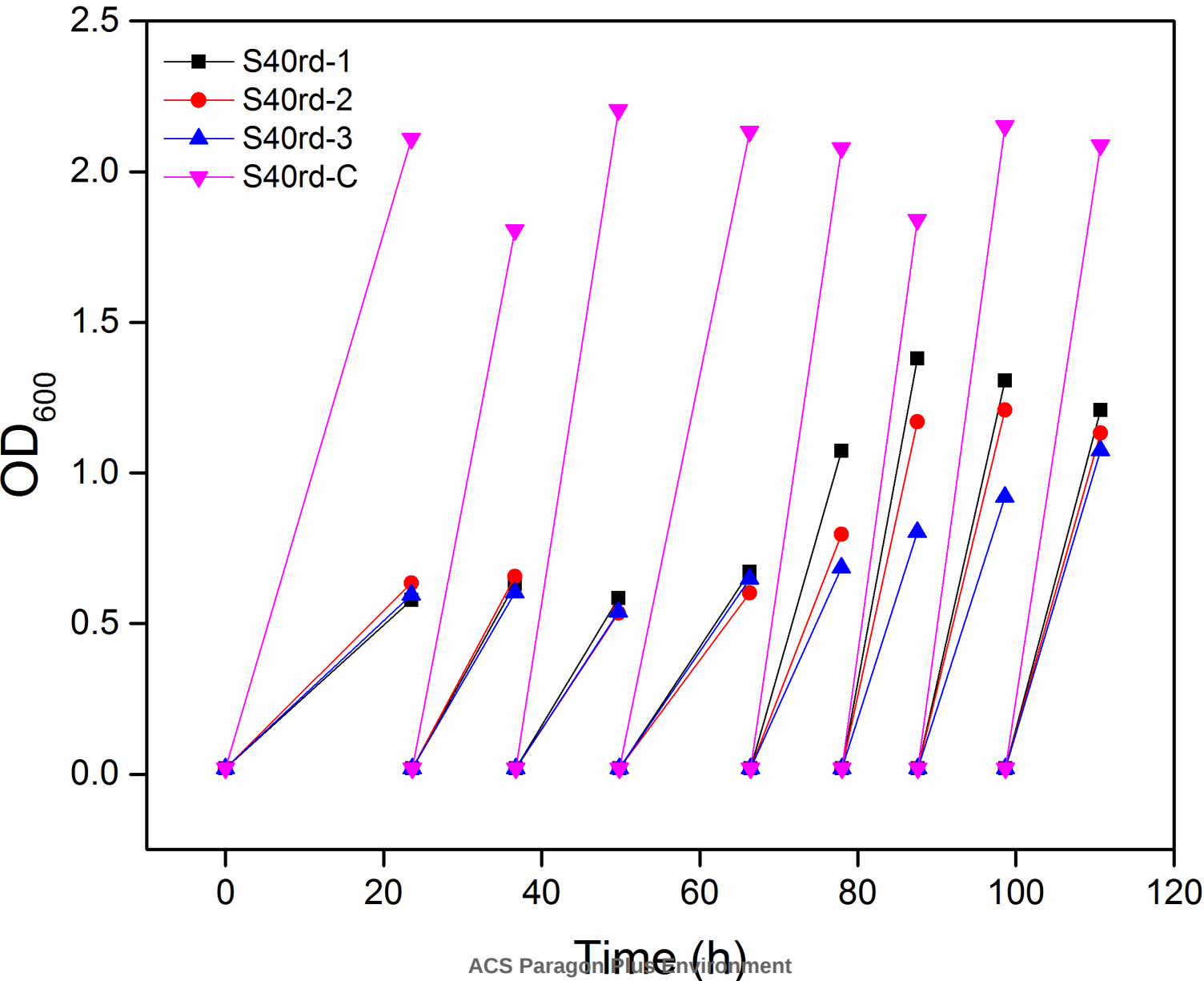


Figure 3b

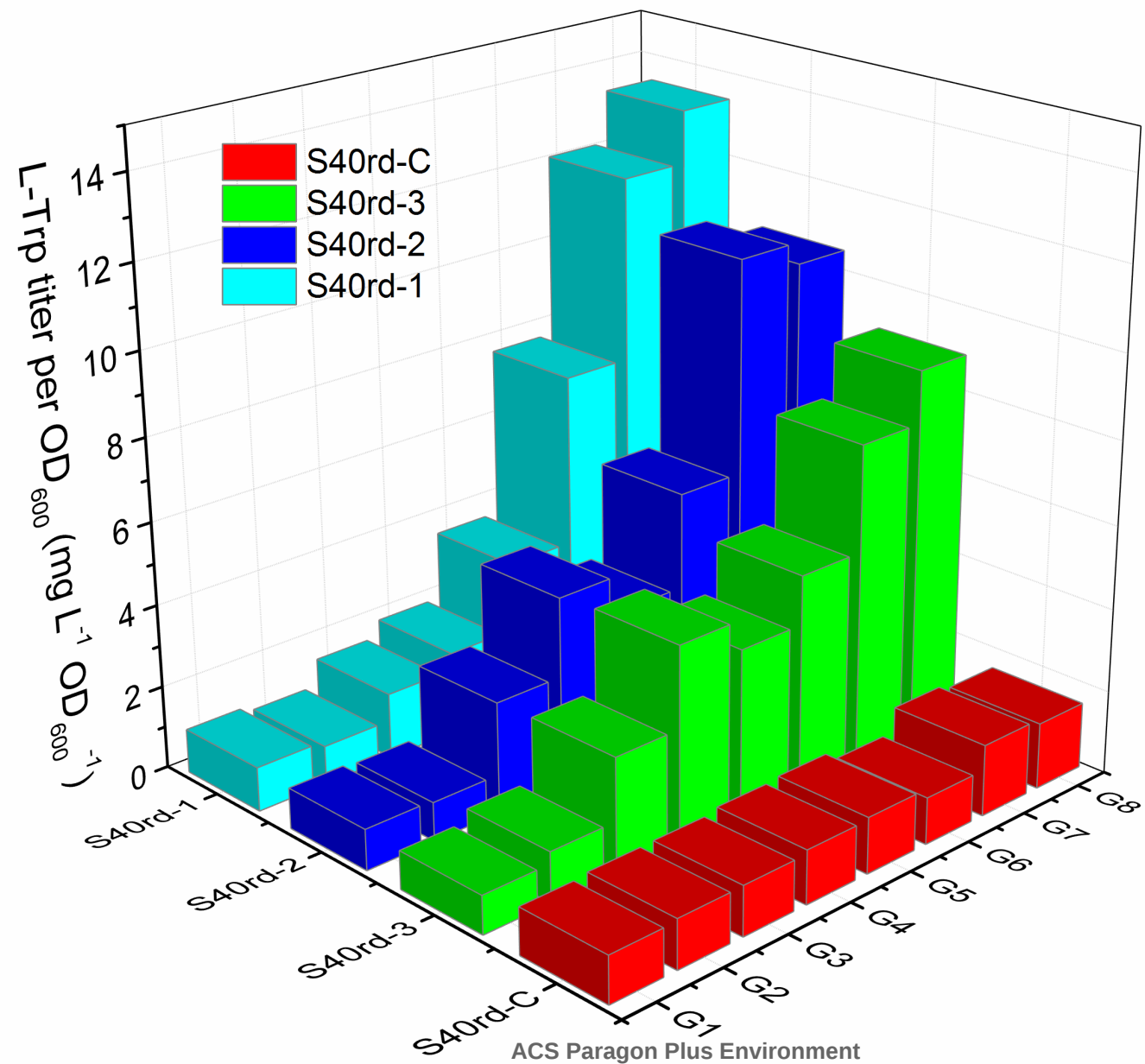


Figure 3c

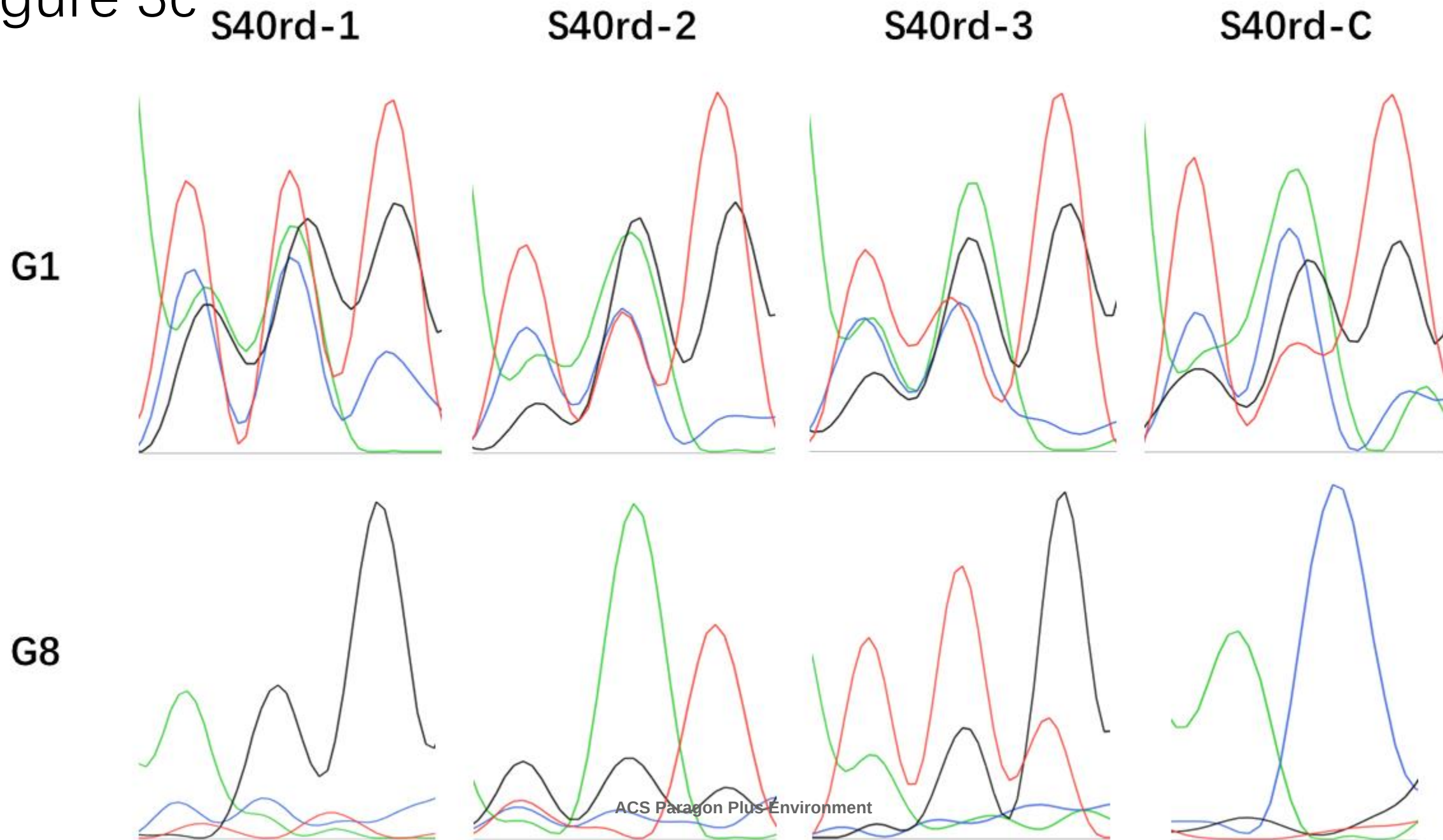


Figure 3d

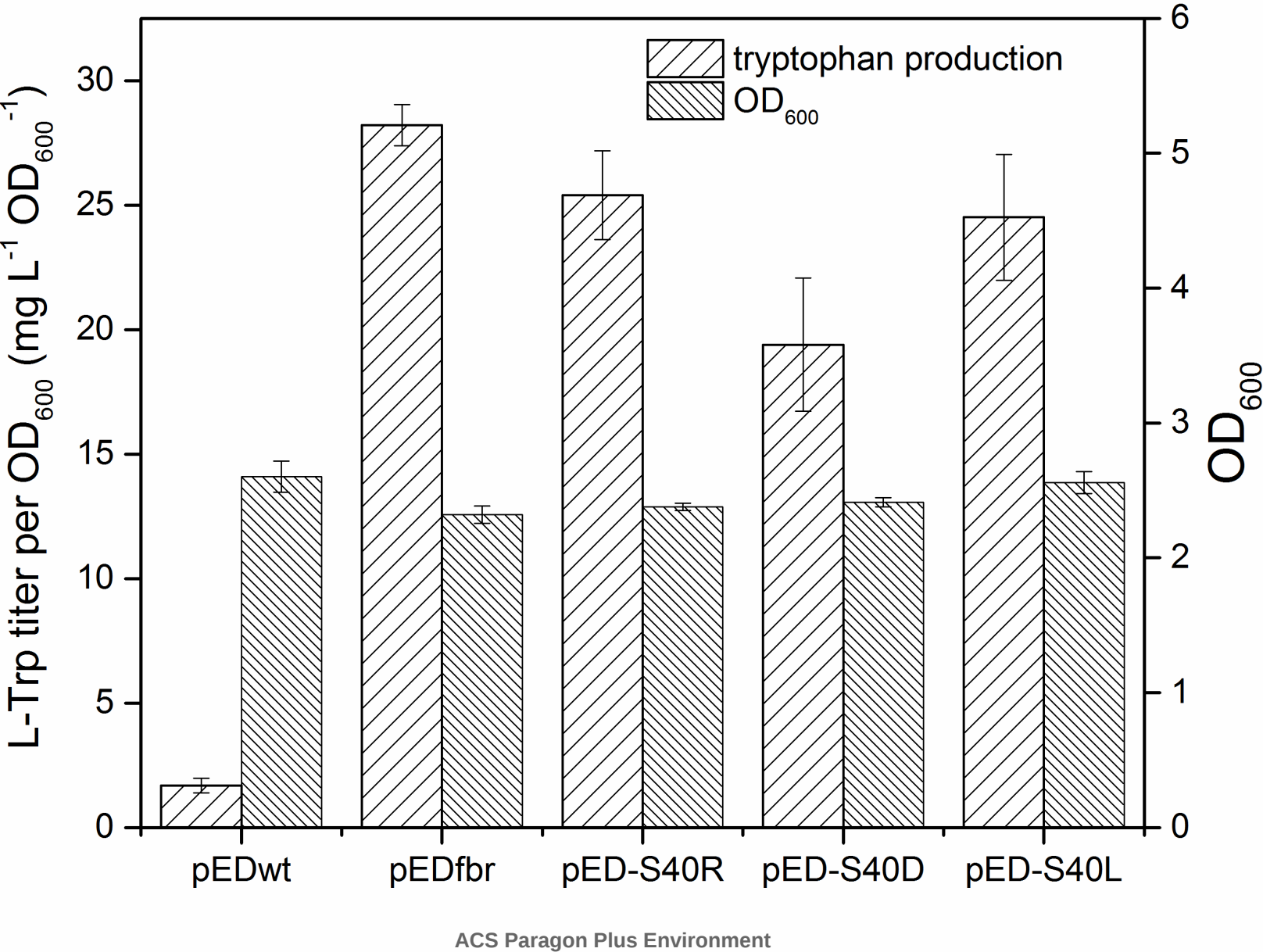


Figure 4a

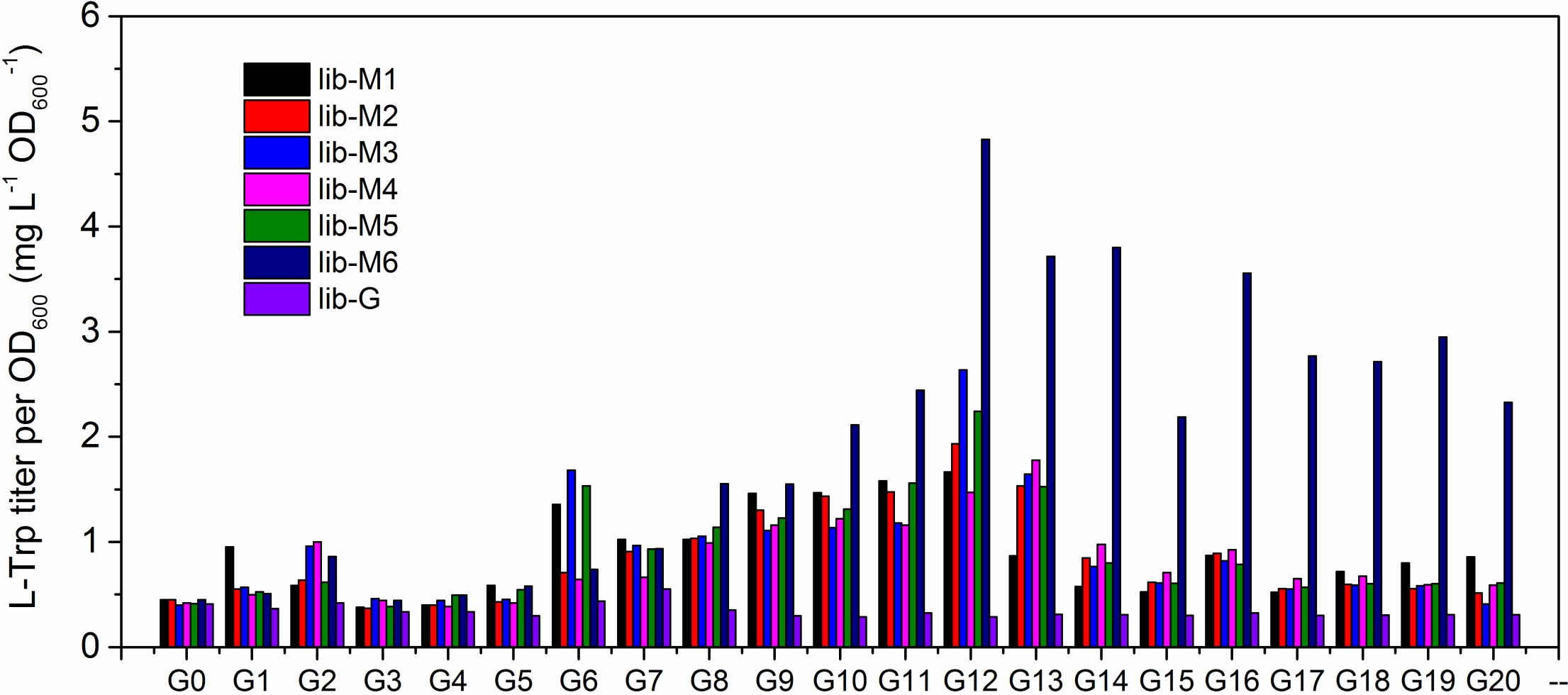


Figure 4b

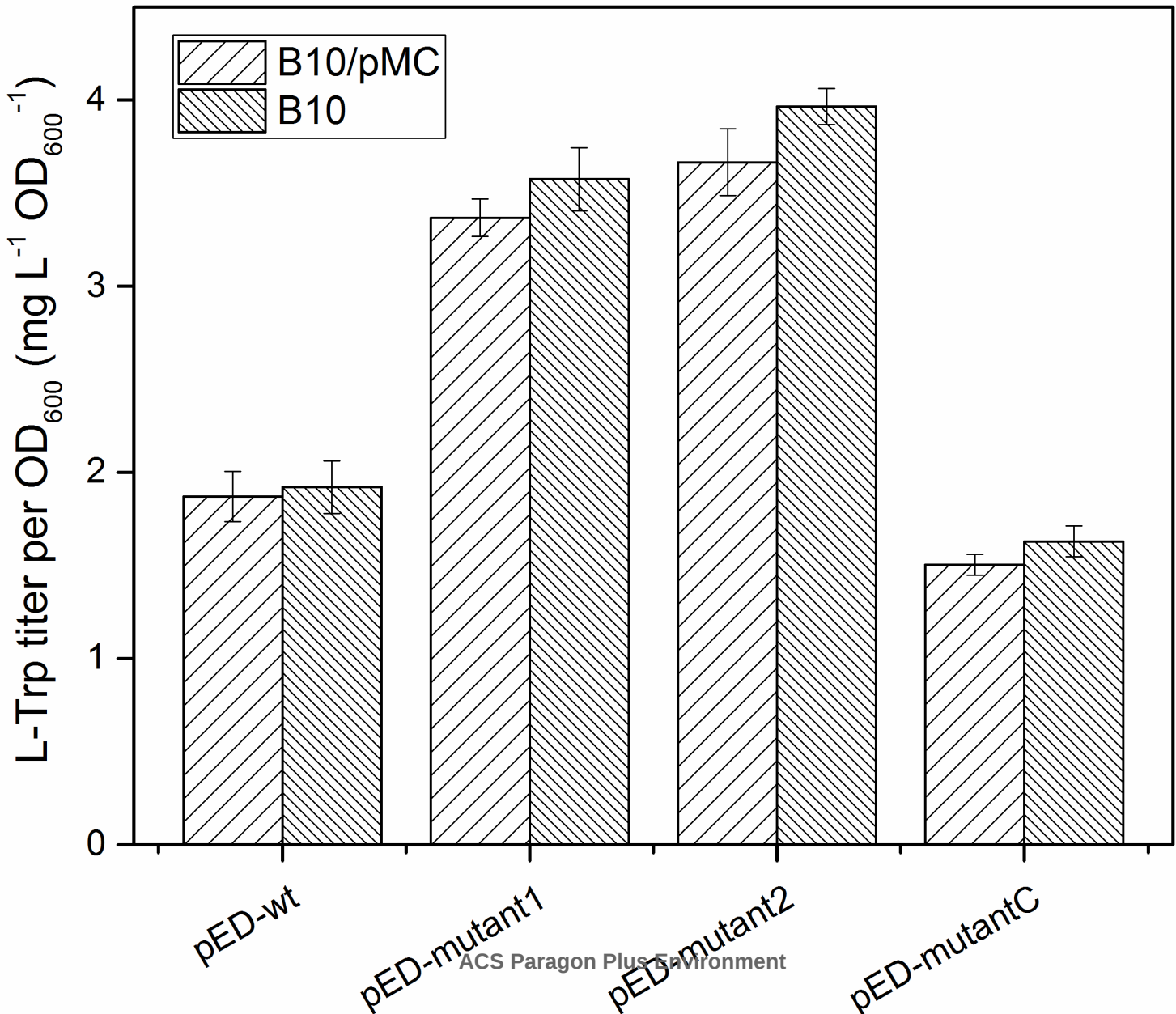


Figure 5a

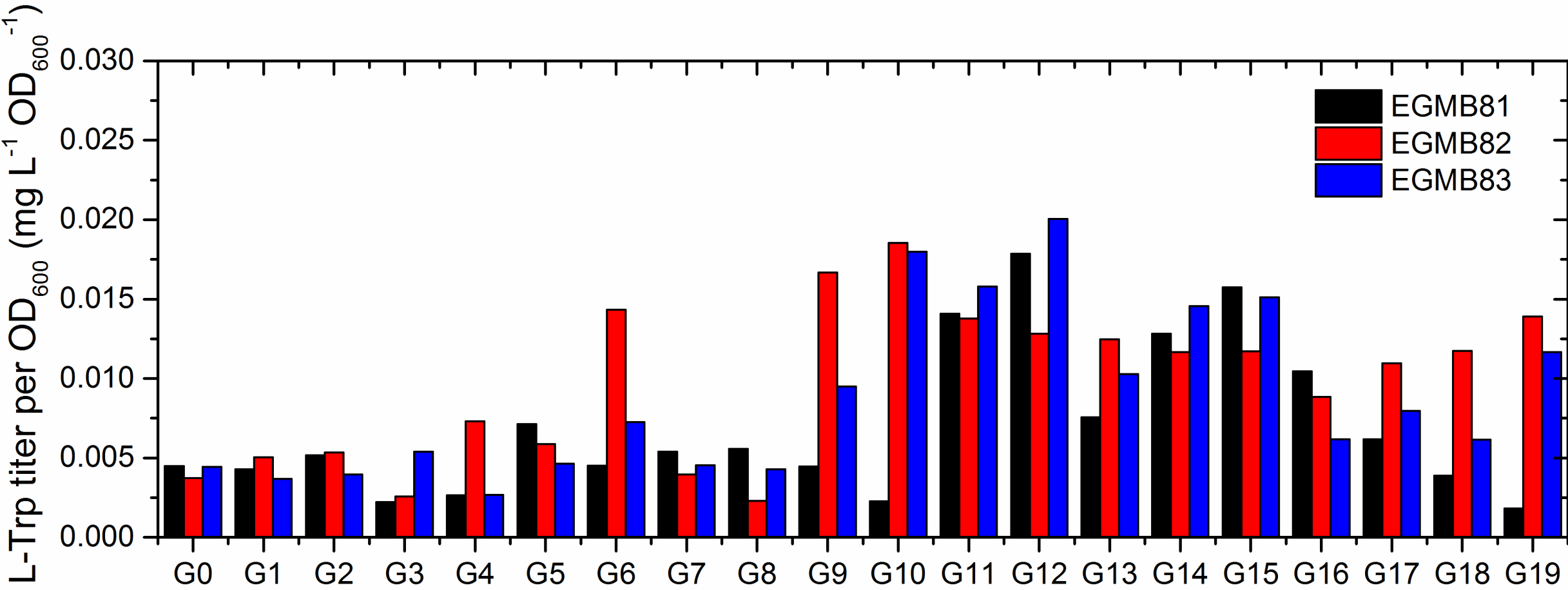
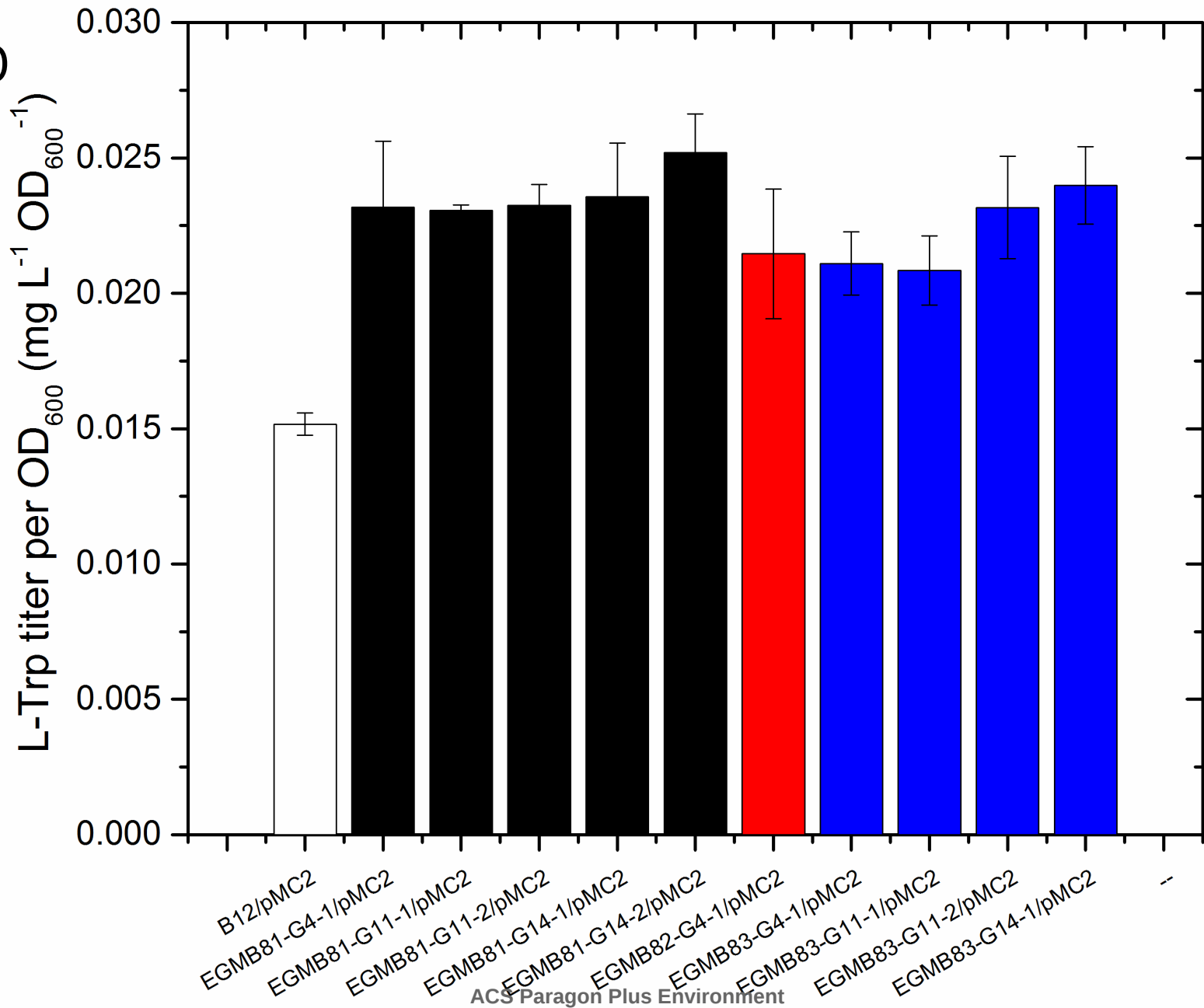


Figure 5b



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Maltose Utilization as a Novel Selection Strategy for Continuous Evolution of Microbes with Enhanced Metabolite Production

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