# Synergistic substrate cofeeding stimulates reductive metabolism

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#### Introduction

- 32 One of the greatest feats of metabolism is the ability to synthesize reduced compounds from input
- 33 substrates with varying oxidation states. Using reductive metabolism, cells reassemble the output
- of substrate catabolism for energy-dense bioproduct synthesis<sup>1</sup>. This process is often implemented
- in both laboratory and industry with single organic carbon sources (e.g., sugars) as inputs due to
- 36 simplicity<sup>2,3</sup>. Nonetheless, single substrates naturally impose stoichiometric constraints on
- 37 available carbons, energy, and redox cofactors, leading to biosynthetic imbalance and suboptimal
- 38 product yield. Thus, genetic rewiring of metabolic pathways is required to advantageously shift
- 39 these stoichiometries<sup>4</sup>, which precludes wide application of non-model organisms that lack suitable
- 40 genetic tools<sup>5</sup>.
- 41 Substrate mixtures, on the other hand, present the potential to alleviate such stoichiometric
- 42 constraints in reductive metabolism without genetic rewiring. Since each substrate has unique
- efficiencies for carbon, energy, and cofactor generation, varying the relative amounts of substrates
- in the mixture allows fine-tuning of carbon-to-energy-to-cofactor ratios. Furthermore, substrates
- 45 with different entry points to metabolism alleviate protein burdens by providing the required
- 46 components in fewer enzymatic steps. Nevertheless, mixed substrate metabolism is epitomized by
- 47 sequential (e.g., diauxie) and hierarchical (yet simultaneous) utilization based on substrate
- 48 preference<sup>6-8</sup>, reflecting the evolutionary fitness of cells in their native environments<sup>9</sup>. Despite the
- 49 recent success of substrate mixture batch fermentation using limited substrate pairs (that do not
- 50 trigger catabolite repression)<sup>10,11</sup>, genetic engineering<sup>12,13</sup>, and directed evolution<sup>14-16</sup>, the full
- 51 mixture spectrum remains inaccessible and thus unexplored.
- 52 Here we report a simple and universal solution to overcoming undesirable substrate preferences
- and improving carbon reduction in various organisms. We eliminate catabolite repression by
- 54 controlling the continuous feed rate of preferred superior substrates to maintain negligible
- 55 concentrations in systems dominated by inferior substrates. Using this method, we explored mixed
- substrate metabolism and therein observed enhanced metabolic productivity that exceeds the sum
- of individual-substrate productivities.
- 58 This substrate cofeeding scheme was applied to two widely divergent organisms to optimize
- 59 reductive metabolism of lipogenesis and acetogenesis. We cultured the oleaginous yeast *Y. lipolytica*
- on acetate and continuously fed limiting quantities of glucose, fructose, glycerol, or gluconate as
- "dopant substrates" to augment reductive metabolism. In this fed-batch setup, cells simultaneously
- 62 consumed acetate and the supplemented substrate with acetate remaining as the primary carbon
- 63 source. In particular, the rate of lipogenesis with gluconate doping was twice as fast as that of the
- 64 acetate-only control. Tracing <sup>13</sup>C from gluconate revealed that obligatory NADPH synthesis by
- 65 recursive use of the oxidative pentose phosphate pathway (oxPPP) was responsible for the
- observed synergy with acetate.
- 67 We then set out to source acetate via acetogenesis, a reductive metabolic process starting from CO<sub>2</sub>.
- 68 Acetogenic bacterium *M. thermoacetica* simultaneously consumes CO<sub>2</sub> and glucose with the latter
- 69 providing both ATP and electrons (e-) necessary for CO<sub>2</sub> fixation, cell maintenance, and growth<sup>17</sup>.
- 70 However, tracing <sup>13</sup>C-labeled glucose revealed that glucose metabolism dominated and e-
- 71 generation was coupled to undesirable decarboxylation. To shift cellular metabolism towards

- 72 greater CO<sub>2</sub> incorporation, we designed a chemostat that continuously supplied limiting glucose
- and ample H<sub>2</sub>. Under these conditions, CO<sub>2</sub> reduction metabolism dominated, glucose primarily
- 74 produced ATP sufficient for cell maintenance via pyruvate kinase, and carbon-free e- for net CO<sub>2</sub>
- 75 reduction was supplied by  $H_2$ . Importantly, with dopant substrate glucose, *M. thermoacetica* rapidly
- converted CO<sub>2</sub> into acetate exclusively, serving as the ideal input for gluconate-doped lipogenesis.
- 77 With the aforementioned synergy, we fixed CO<sub>2</sub> at 2.3 g per g cell dry weight per hour (g gCDW<sup>-1</sup> hr
- 78 1), substantially faster than  $\sim 0.05$  g gCDW<sup>-1</sup> hr<sup>-1</sup> of typical photosynthetic systems<sup>18</sup>. Using the
- resulting acetate, we produced lipids at 0.046 g gCDW<sup>-1</sup> hr<sup>-1</sup>, a more than two-fold improvement
- 80 over the previously optimized system ( $\sim 0.02$  g gCDW<sup>-1</sup> hr<sup>-1</sup>)<sup>19</sup>. Coordinating the glucose-doped
- 81 acetogenesis and gluconate-doped lipogenesis, we converted carbons in the most oxidized,
- undesirable state (CO<sub>2</sub>) to the reduced, energy-dense state (lipids) with 38% energetic efficiency.
- 83 Through substrate cofeeding, we overcame the limitation of ATP- and NADPH-dependent biological
- carbon reduction, paying the path for CO<sub>2</sub>-derived advanced bioproduct synthesis.

# Accelerating lipogenesis from acetate by enhancing NADPH generation in Y. lipolytica

- Lipogenesis requires a balanced supply of acetyl-CoA, ATP, and NADPH at a  $\sim$ 1:1:2 ratio. Single
- 87 substrates, such as glucose and acetate, can provide all three building blocks for lipids<sup>19-21</sup>.
- 88 However, lipid synthesis from acetate, despite acetate's direct contribution to acetyl-CoA and ATP,
- is slower compared to that from glucose<sup>22</sup> (**Fig. 1A**). This is because in *Y. lipolytica*, NADPH
- 90 generation is mainly through oxPPP, which takes a series of ATP-intensive reactions to arrive at
- 91 starting from acetate<sup>23</sup>.

- We aimed to enhance acetate-to-lipid conversion by better supplying NADPH. Since glucose can
- 93 flow more directly into oxPPP than acetate, we provided both acetate and glucose to a *Y. lipolytica*
- batch culture. Consistent with the widely accepted phenomenon of catabolite repression<sup>24</sup>, cells
- onsumed glucose only at first (**Supplementary Fig. 1**). To overcome this selective preference (i.e.,
- 96 diauxie), we devised a fed-batch system, in which the same amount of glucose was instead
- 97 continuously supplied over the course of fermentation to an acetate culture (Fig. 1B). The feed rate
- 98 was kept slow to maintain negligible glucose concentrations in the reactor. In this setup, despite
- 99 constant introduction of glucose, we observed steadily decreasing acetate and no glucose in the
- reactor, suggesting simultaneous consumption of the two carbon sources (**Fig. 1C**). Furthermore,
- the fed-batch cofeeding strategy enhanced both the growth and lipid production in *Y. lipolytica*
- significantly compared to the acetate-only control (Fig. 1D,E).
- 103 Using the same fed-batch system, we also tested supplementing other substrates (fructose, glycerol,
- and gluconate) that enter metabolism near oxPPP as metabolic "dopants" to provide NADPH (Fig.
- 105 2A). In all cases, we observed simultaneous consumption of acetate and the supplemented
- substrate (Supplementary Fig. 2). As with glucose, cell growth and lipid production were
- enhanced (**Supplementary Fig. 3**) despite the supplemental substrates constituting only small
- fractions of carbons (Fig. 2B). To distinguish whether the increase in lipid production was due to
- 109 cellular metabolism enhancements or simply having more cells in the culture, we determined
- specific growth rates and productivities. Substrate doping nearly doubled both the specific growth
- rate (**Fig. 2C**) and the specific lipid productivity during nitrogen-replete growth phase (**Fig. 2D**). In
- 112 nitrogen-depleted lipogenic phase, glucose, fructose, and glycerol cofeeding only modestly

113 enhanced specific productivity while gluconate cofeeding significantly outperformed all other 114 conditions (Fig. 2E). 115 Recursive NADPH generation via the pentose cycle To understand the mechanism of accelerated lipid production, we aimed to elucidate how 116 117 continuous gluconate supplementation rewires metabolism. Tracing the carbons from [U-<sup>13</sup>C<sub>6</sub>|gluconate by liquid chromatography-mass spectrometry (LC-MS), we observed that the <sup>13</sup>C 118 119 atoms were confined to the PPP and upper glycolysis (Fig. 3A and Supplementary Table 1). 120 Gluconate enters metabolism as 6-phosphogluconate (6PG), which can only go in the oxidative 121 direction through oxPPP because the combined thermodynamics of glucose-6-phosphate 122 dehydrogenase and 6-phosphogluconolactonase (ΔG°′=–29 kJ/mol) strongly favors the flow of 6PG 123 further into PPP<sup>25</sup>. This causes gluconate to obligatorily generate NADPH via 6PG dehydrogenase, 124 which is likely responsible for the acceleration of lipogenesis. On the other hand, metabolites in the 125 TCA cycle as well as fatty acids were completely unlabeled, indicating exclusive contribution of 126 lipogenic acetyl-CoA and ATP from acetate (Fig. 3A and Supplementary Table 1). These labeling data suggested the partitioned usage of metabolism where acetate primarily provided acetyl-CoA 127 128 and ATP while gluconate primarily provided NADPH to meet the metabolic demands of lipogenesis. 129 To further validate the hypothesis that gluconate enhances lipogenesis through NADPH 130 supplementation, we performed metabolic flux analysis using the labeling data, substrate uptake rates, and lipid production rate. The flux distribution that best fit all these measurements revealed a 131 132 strong flux through the oxPPP NADPH-generating steps (Fig. 3B and Supplementary Table 2). Interestingly, phosphoglucose isomerase operated in the reverse direction converting fructose-6-133 134 phosphate (F6P) to glucose-6-phosphate (G6P). The flux analysis also revealed that gluconeogenic, oxPPP, and non-oxPPP fluxes together form a metabolic cycle, which we termed the "pentose cycle" 135 136 (Fig. 3B and Supplementary Table 2). Akin to the TCA cycle, the pentose cycle recursively oxidized the carbons from gluconate into CO<sub>2</sub> while preserving the electrons as NADPH for 137 lipogenesis, maximizing the dopant substrate's role as a NADPH provider. 138 139 Preferential use of glucose leads to excessive decarboxylation in CO<sub>2</sub>-fixing M. thermoacetica Acetogenesis is a reductive metabolic process that produces acetate from CO<sub>2</sub>. In acetogenic 140 organisms, the reductive acetyl-CoA pathway incorporates CO<sub>2</sub> as carbonyl and methyl components 141 142 of the acetyl group<sup>26</sup> (**Fig. 4A**). The methyl branch of this pathway requires ATP, which acetogens may recover by acetate production. This ATP conservation contributes to efficient autotrophic CO<sub>2</sub> 143 144 fixation<sup>27</sup>, but autotrophic culture conditions, which derive energy solely from inorganic sources (e.g., oxidation of  $H_2$ ), results in slow metabolism and low culture density<sup>28,29</sup>. 145 Since glycolysis effectively produces ATP and e- necessary for operating the reductive acetyl-CoA 146 147 pathway, we co-fed CO<sub>2</sub> and [U-13C<sub>6</sub>]glucose to *M. thermoacetica* and looked for signs of CO<sub>2</sub> incorporation. If acetate were the only product, we would expect up to 100% carbon yield, that is, 148 149 three acetate molecules per glucose<sup>29</sup>. On the other hand, with potential other products (e.g.,

pyruvate) or biomass components (e.g., Ser/Gly, Asp, and Glu), net CO<sub>2</sub> utilization becomes feasible

as some pathways generate reducing agents without  $CO_2$  production or fix more  $CO_2$  than the amount produced (**Supplementary Fig. 4**). Since net  $CO_2$  utilization depends on the types and

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- fractions of fermentation products, we quantified the cell growth, the secreted molecules, and their
- carbon yields relative to glucose consumption (Fig. 4B). We observed the activity of the reductive
- acetyl-CoA pathway as the produced acetate accounted for 77% of glucose carbons, exceeding what
- is possible via glycolysis (67%). However, as glucose carbon consumption rate approximately
- matched the total carbon output rate of major products (i.e., biomass, acetate, and formate
- accounted for 93%), we did not observe net CO<sub>2</sub> utilization.
- We hypothesized that our observed carbon yield was due to insufficient reducing agents available
- 160 for new CO<sub>2</sub> utilization and cells preferentially consuming glucose over CO<sub>2</sub>. To trace the fate of <sup>13</sup>C-
- 161 glucose carbons and to visualize metabolic pathway usage, we measured <sup>13</sup>C enrichment in cellular
- metabolites using LC-MS. Unlabeled CO<sub>2</sub> was provided in the headspace and CO<sub>2</sub> remained mostly
- unlabeled (**Supplementary Fig. 5**). The carbons of glycolytic intermediates were ≥90% labeled
- except for pyruvate, which was ~50% labeled (**Fig. 4C**, **Supplementary Table 3**). The lower
- labeling in pyruvate was due to reversible pyruvate: ferredoxin oxidoreductase (PFOR), which can
- 166 form pyruvate by combining unlabeled CO<sub>2</sub> and acetyl group derived from the reductive acetyl-CoA
- pathway. With phosphoenolpyruvate (PEP) remaining mostly labeled, the contrasting pyruvate
- labeling indicated that pyruvate kinase (PEP + ADP  $\rightarrow$  Pyr + ATP) was forward-driven to produce
- 169 ATP.
- 170 Interestingly, serine, glycine, as well as other amino acids derived from pyruvate and TCA cycle
- intermediates were also half-labeled (Fig. 4C, Supplementary Table 3). These labeling data
- suggested shared usage of central metabolism, where glucose and CO<sub>2</sub> jointly contributed to the
- 173 TCA cycle (and thus non-aromatic amino acid biosynthesis). However, because glycolysis and the
- pentose phosphate pathway (and thus the synthesis of nucleotide ribose rings and aromatic amino
- acids) were driven mainly by glucose, cells incorporated more carbons from glucose. Therefore,
- despite the simultaneous consumption of CO<sub>2</sub> and glucose, lack of observable net CO<sub>2</sub> fixation was
- the result of cells prioritizing ATP production (and cell growth). Prioritizing ATP production
- involves faster glycolysis via faster glucose uptake. This substrate hierarchy favoring glucose
- subsequently led to excessive pyruvate decarboxylation via PFOR (Fig. 4D, Supplementary Table
- 4) which, together with CO<sub>2</sub>-producing biosynthetic pathways (**Supplementary Fig. 6**), outpaced
- 181  $CO_2$  incorporation.

#### Accelerating acetate production from CO<sub>2</sub> by decoupling e<sup>-</sup> supply from decarboxylation

- 183 Since undesirable decarboxylation is coupled to the PFOR step for e-generation from glucose, we
- aimed to limit the function of glucose as an e- source and to stimulate net CO<sub>2</sub> incorporation. On the
- other hand, sufficient ATP is still required from glucose through pyruvate kinase to avoid slow
- metabolism and sustain CO<sub>2</sub> reduction. We note that acetate production via the reductive acetyl-
- 187 CoA pathway does not consume ATP leading to cell maintenance (e.g., housekeeping) being the only
- ATP requirement for converting CO<sub>2</sub> to acetate (**Supplementary Fig. 7**). Hence, we implemented
- 189 glucose-limiting culture environments in a chemostat to reduce the rate of glycolysis such that it
- supplies the required ATP but overall decarboxylation is slowed (Fig. 5A). To compensate for the
- decreased e- availability, cells were provided with H<sub>2</sub> as a carbon-free e- source that yields reducing
- agents without CO<sub>2</sub> generation. In addition, low dilution rates (0.009 and 0.017 hr<sup>-1</sup>) were selected
- to minimize biomass formation and maximize cell residence time in the reactor.

- 194 Using this glucose doping system, productivities and yields at various fractions of electrons derived
- from glucose versus H<sub>2</sub> were obtained (**Fig. 5B**). In this plot, we also included batch results with or
- without H<sub>2</sub> in the headspace (**Supplementary Table 5**). Interestingly, the presence of H<sub>2</sub> decreased
- 197 glucose consumption rate, shifting carbon substrate preferences towards CO<sub>2</sub> (**Supplementary Fig.**
- 198 8). At steady state, acetate concentration in the effluent from the chemostat could exceed 13 g/L.
- 199 With decreasing fractions of electrons from glucose, acetate production rate could be more than 80
- 200 times as fast as the glucose feed rate, and the carbon yield monotonically increased to >80 g acetate
- produced per g glucose consumed. This high yield indicated that the overwhelming majority of
- acetate and biomass was derived from CO<sub>2</sub> rather than glucose. While cell growth rates were slow
- in the chemostat (growth rate = dilution rate), acetate production remained fast (**Fig. 5B**).
- Importantly, we found that, at 2% of e- from glucose, glucose doping simultaneously enabled a very
- 205 high yield (>50 g acetate/g glucose) and a substantial acetate productivity (>9 mmol gCDW<sup>-1</sup> hr<sup>-1</sup>,
- 206  $\sim \frac{1}{3}$  of the maximum observed productivity).

- 207 Across the glucose+H<sub>2</sub> energy landscape, CO<sub>2</sub> fixation rates peaked at 52.7 mmol gCDW<sup>-1</sup> hr<sup>-1</sup> (2.3 g
- 208 gCDW<sup>-1</sup> hr<sup>-1</sup>) (**Fig. 5C**). Such high rates implied that we not only decreased CO<sub>2</sub> generation from
- 209 pyruvate decarboxylation but also increased the reductive acetyl-CoA pathway flux. Furthermore,
- 210 the maximum rate occurring between the two extremes (glucose-only and H<sub>2</sub>-only) demonstrated
- 211 that CO<sub>2</sub> fixation rate is determined by a balance between reducing agents and ATP supplied via H<sub>2</sub>
- and glucose, respectively. Thus, by controlled glucose doping, we decoupled e- supply from
- 213 decarboxylation, shifted cellular metabolism towards favoring CO<sub>2</sub> utilization over glucose, and
- 214 achieved rapid and continuous CO<sub>2</sub> conversion into acetate.

#### Coordination of "doped" acetogenesis and lipogenesis

- 216 Coordinating acetogenesis and lipogenesis allows CO<sub>2</sub>-to-acetate-to-lipid conversion. Interestingly,
- the observed acetate and fatty acid productivities from glucose- and gluconate-doping  $(V_{12})$
- exceeded not only the measured productivities with individual substrates  $(V_1 \text{ or } V_2)$  but also the
- expected productivity for the two substrates combined  $(V_1 + V_2)$  (Fig. 6A). The expected
- 220 productivity was linearly extrapolated from the combination of supplemental glucose feeding with
- $CO_2+H_2$  batch fermentation for acetogenesis and the combination of supplemental gluconate
- feeding with acetate batch fermentation for lipogenesis (**Supplementary Information**).
- We attributed the observed synergy  $(V_{12}>V_1+V_2)$  to complementary substrate cofeeding. While our
- <sup>13</sup>C labeling experiments showed the roles of glucose and gluconate in ATP and cofactor synthesis,
- respectively, we sought to define the theoretical framework that illustrates the feasibility of this
- 226 synergy. To this end, stoichiometric analysis of the different fates of individual substrates was
- combined with experimentally measured rates of single-substrate acetogenesis and lipogenesis.
- The maximum carbon, ATP, and electron attainable with mixed substrates were then evaluated for
- the two processes (**Supplementary Information**). We identified that the ATP and NADPH
- 230 generation by glucose and gluconate doping relieved the limiting ingredients for acetate and lipid
- 231 synthesis, respectively, and, in conjunction with the primary substrates, better balanced the energy
- and cofactor ratio requirements for reduced bioproduct synthesis (**Fig. 6B**).
- 233 In terms of organic carbon yield, the integrated acetogenesis-lipogenesis process converted 1 g of
- glucose to  $\sim$ 13 g of lipids (0.154 g lipids/g acetate  $\times$   $\sim$ 82 g acetate/g glucose) by extensive CO<sub>2</sub>

- utilization. Increasing mass transfer rates of gases improves H<sub>2</sub> (and CO<sub>2</sub>) utilization efficiency, and
- it has been reported that ~95% of supplied  $H_2$  can be used by commercial  $CO_2$ -fixing microbes<sup>30,31</sup>.
- By continuously converting CO<sub>2</sub> and H<sub>2</sub> to lipids via coordinated acetogenesis and lipogenesis, 38%
- of energy from H<sub>2</sub> was stored as lipids and 14% as yeast biomass (**Fig. 6C**). Nearly all carbons
- 239 ( $\sim$ 99%) in lipids originated from  $CO_2$ .
- To further explore the potential of our synergistic cofeeding approach, we applied the
- 241 stoichiometric analysis to other acetyl-CoA derived products and determined the gains in
- productivities (Fig. 6D and Supplementary Information). Similar to the results for fatty acids, the
- 243 model predicted synergy between the substrate pair in producing other reduced compounds such
- as polyhydroxybutyrate (PHB) and isopentenyl pyrophosphate (IPP, precursor for isoprenoids),
- leading to increases in productivities over the extrapolated sum  $(V_{12}>V_1+V_2)$ . Therefore, our
- substrate cofeeding strategy may stimulate conversion of CO<sub>2</sub> into a wide array of advanced
- 247 bioproducts.

#### Discussion

- One of the greatest biotechnological challenges is engineering metabolism. Current engineering
- efforts often focus on funneling metabolic fluxes through product synthesis pathways via
- assembling various gene pools and knocking out competing pathways with existing genetic tools<sup>32</sup>.
- In addition, most processes start from sugars as the sole substrate, which inherently causes some
- 253 metabolic intermediates to be out of balance and surplus components to be wasted because of the
- 254 differences in chemical properties between the substrate and the product. This further necessitates
- 255 the use of genetic engineering for flux rewiring in order to achieve industrially relevant production
- metrics. Such approaches set a limit on the choice of microbial hosts based on genetic
- 257 manipulability and the existing strategies are not generalizable to all organisms.
- Here we presented the potential of mixed substrate cofeeding as a generalizable method and a
- 259 more effective starting point for bioproduct synthesis. As the first step, we overcame the difficulties
- 260 that arise due to organisms' preferential substrate usage. Controlled continuous feeding of a
- preferred substrate as a metabolic dopant did not inhibit the consumption of the less favored
- substrate. Using this approach, we enhanced the utilization of CO<sub>2</sub> and acetate, which are typically
- the end products of metabolism and therefore least preferred by organisms. This was demonstrated
- in both *M. thermacetica* and *Y. lipolytica*, two organisms with distinct metabolism and genetic
- 265 manipulability, using various substrates (glucose and H<sub>2</sub>/CO<sub>2</sub> as well as acetate and gluconate).
- 266 Correspondingly, we expect this design to be widely applicable to other substrates and organisms.
- Surprisingly, substrate cofeeding synergistically enhanced product synthesis. In both cases, the
- total product carbon flux resulting from co-utilized substrates  $(V_{12})$  exceeded the sum of the
- individual substrate fluxes  $(V_1 + V_2)$ . However, previous models describing substrate co-utilization
- have overlooked this synergistic effect<sup>11</sup>. The observation of  $V_{12}>V_1+V_2$  could be explained by the
- two substrates having distinct yet complementary functions in cellular metabolism. Our
- 272 stoichiometric analysis of metabolic requirements and burdens suggested that glucose and
- 273 gluconate as dopant substrates could indeed complement ATP and NADPH generation, alleviating
- the limitations seen in acetogenesis and lipogenesis, respectively. Importantly, the observed

- significant enhancements in  $CO_2$  and acetate reduction metabolism required only minor addition of
- "valuable" glucose and gluconate.
- 277 To understand how the dopant substrates can strikingly achieve such efficiency in enhancing
- 278 reductive metabolism, we also elucidated the underlying mechanisms. Tracing <sup>13</sup>C-labeled glucose
- and gluconate revealed that nearly all of these supplements went into ATP and NADPH production,
- respectively. We identified pyruvate kinase (PEP+ADP  $\rightarrow$  Pyr+ATP) in *M. thermoacetica* and the
- pentose cycle (6PG  $\rightarrow$  R5P  $\rightarrow$  F6P  $\rightarrow$  G6P  $\rightarrow$  6PG + 2 NADPH) in *Y. lipolytica* to be important cofactor
- generating steps. In particular, activating pyruvate kinase by cofeeding glucose solved the challenge
- of slow CO<sub>2</sub> fixation, which is due to ATP-limited metabolism in autotrophic fermentations<sup>31,33</sup>.
- Activating the pentose cycle by cofeeding gluconate solved the challenge of limited NADPH
- production through oxPPP in acetate-fed cells. Therefore, we rewired metabolism without genetic
- engineering by cofeeding dopant substrates.
- Finally, akin to the widespread use of dopants in the electronics industry to enhance material
- 288 properties, we envision the dopant substrate cofeeding scheme becoming valuable in a wide array
- of biotechnological applications. Our demonstration of CO<sub>2</sub>/H<sub>2</sub>-to-acetate-to-lipids conversion at
- 290 high productivity and energetic efficiency serves as an exemplary renewable energy storage
- strategy using substrates that do not interfere with food supply. Since acetate is closely related to
- acetyl-CoA, a focal point in many metabolic pathways, other acetate-based processes applying
- 293 proper doping substrates could enable rapid synthesis of a wide repertoire of bioproducts such as
- fatty acid derived oleochemicals<sup>34</sup> and mevalonate pathway derived natural products<sup>35</sup>. By coupling
- 295 this to the glucose-doped acetogenesis, CO<sub>2</sub> could become the initial feedstock for all subsequent
- acetate-driven processes, benefiting both the environment and carbon economy. Moreover, the
- metabolic enhancements by cofeeding superior substrates is not limited to CO<sub>2</sub>- and acetate-based
- fermentations. The imbalance of carbon building blocks, cofactors, and energy with respect to the
- 299 desired product requirement can also be seen in many other single-substrate substrate
- 300 bioconversions. In these cases, identification of complementary substrates and implementation of
- 301 controlled dopant substrate cofeeding would optimally coordinate pathway usage for superior
- 302 biosynthesis. Consequently, substrates previously considered infeasible for industrial bioprocesses
- due to limited productivity may become well-suited as economically and technologically viable
- 304 feedstocks<sup>36</sup>.
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- 310 K.M.H performed experiments and flux analysis. J.O.P., N.L., B.M.W., and C.V. developed LC-MS and
- GC-MS methods. J.O.P., N.L., D.F.E., J.X. designed the bioreactors. J.O.P. and M.A.I. developed the
- 312 updated metabolic model. J.O.P., N.L., K.Q., Z.L., P.R.G. and G.S. analyzed the data.

## 314 Figures

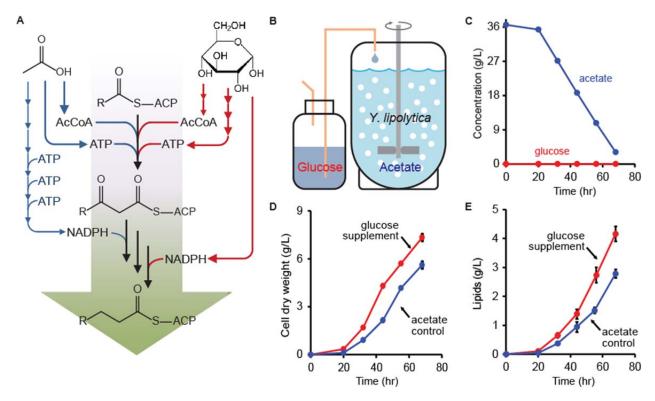
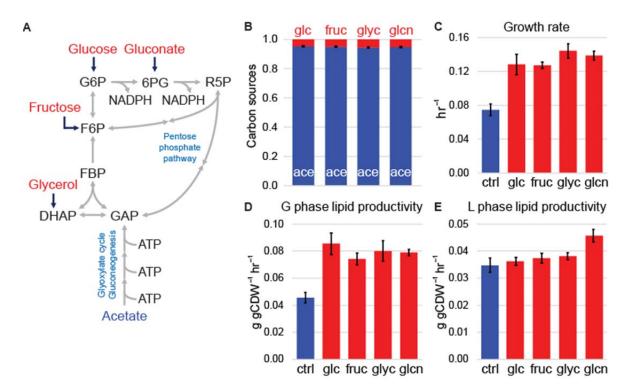
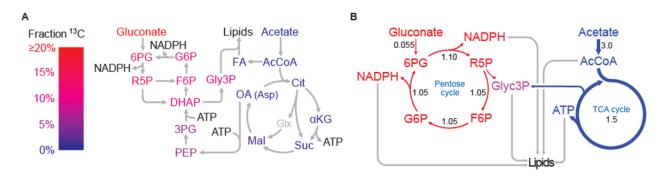


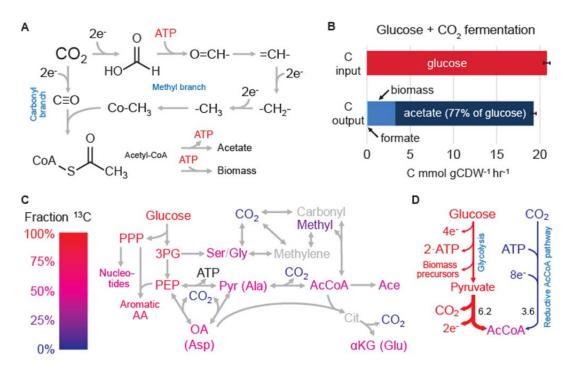
Figure 1. Continuous glucose cofeeding relieves repression of acetate in *Y. lipolytica*. (A) Acetate can efficiently support acetyl-CoA and ATP generation through the TCA cycle but not NADPH generation, which requires many enzymatic steps and ATP. Glucose, on the other hand, can produce NADPH more directly through oxPPP. (B) Since glucose batch feeding suppresses acetate consumption, glucose was continuously supplemented in small quantities to the acetate culture. (C) Despite the continuous feeding of glucose, its concentration in the reactor remained at 0 and acetate concentration decreased. Thus, the fed-batch system enabled simultaneous consumption of acetate and glucose. (D) Biomass and (E) lipid production was faster and higher with glucose-"doping" compared to the acetate-only control.



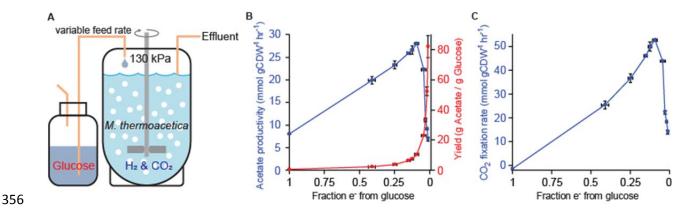
**Figure 2. Cofeeding substrates near oxidative pentose phosphate pathway accelerates cell growth and lipogenesis from acetate.** (**A**) Glucose, fructose, glycerol, and gluconate enter central carbon metabolism through upper glycolysis and PPP. (**B**) Supplementation of these four substrates accounted for ~5% of the total carbon consumed by the cells and the primary carbon source was acetate. (**C**) Specific growth rates nearly doubled with substrate cofeeding compared to the acetate-only control. (**D**) Growth phase (nitrogen-replete) specific lipid productivity nearly doubled with substrate cofeeding. (**E**) Lipogenic phase (nitrogen-depleted) specific lipid productivity was mildly enhanced by glucose, fructose, or glycerol supplementation. Gluconate-"doping" significantly outperformed the other conditions.



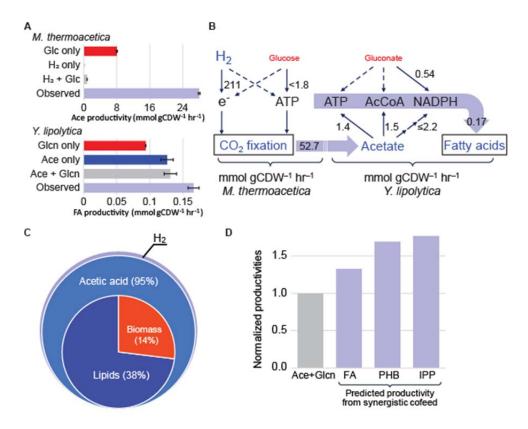
**Figure 3. Gluconate generates NADPH via the pentose cycle. (A)** Tracing carbons from [U- $^{13}$ C<sub>6</sub>]gluconate revealed partitioned usage of metabolism. The heavy  $^{13}$ C of gluconate remained mainly in upper glycolysis and PPP. Acetyl-CoA and TCA intermediates were completely unlabeled, indicating exclusive contribution from acetate. **(B)** Metabolic flux analysis via isotope mass balancing revealed the cyclic reaction sequence generating NADPH. The "pentose cycle" consisted of the NADPH-producing oxPPP, transketolase, transaldolase, and phosphoglucose isomerase. Flux values are in mmol gCDW- $^{1}$  hr- $^{1}$ .



**Figure 4. Glucose generates ATP for CO<sub>2</sub> fixation but leads to decarboxylation in** *M.* **thermoacetica.** (**A**) The reductive acetyl-CoA pathway consists of the carbonyl and methyl branches for conversion of CO<sub>2</sub> into acetyl group. The methyl branch requires ATP. (**B**) Analysis of carbon input and output in batch cofeeding of *M. thermoacetica* with glucose and CO<sub>2</sub> revealed the preferential use of glucose. (**C**) Batch cofeeding [U-<sup>13</sup>C<sub>6</sub>]glucose and CO<sub>2</sub> revealed the simultaneous use of glucose and CO<sub>2</sub>. Glucose carbons contributed mainly to glycolysis and PPP while partially to TCA cycle. A substantial fraction of TCA carbons was traced to CO<sub>2</sub>. (**D**) Despite simultaneous utilization of CO<sub>2</sub>, preferred glucose use led to undesirable decarboxylation outpacing CO<sub>2</sub> uptake. Flux values are in mmol gCDW-<sup>1</sup> hr-<sup>1</sup> of acetyl-CoA.



**Figure 5. Continuous glucose cofeeding accelerates acetogenesis from CO<sub>2</sub> fixation at the autotrophic limit.** (**A**) Since glucose batch feeding leads to undesirable decarboxylation, glucose was continuously supplemented in small quantities to gas-fermenting *M. thermoacetica* culture. (**B,C**) Acetate productivity, yield, and CO<sub>2</sub> fixation rate at varying ratios of electrons (e-) derived from H<sub>2</sub> and glucose. The plots include both batch and chemostat data (**Supplementary Table 5**). (**B**) Acetate productivity peaked when 91% of e- were derived from H<sub>2</sub> and 9% glucose. On the other hand, carbon yield (acetate produced per glucose consumed) increased with increasing fraction of electrons from H<sub>2</sub>. (**C**) CO<sub>2</sub> fixation rate peaked when 9% of e- were derived from glucose and remained high near the autotrophic limit.



**Figure 6. Synergy and coordination of substrate cofeeding accelerate the conversion of CO<sub>2</sub> and H<sub>2</sub> into lipids.** (**A**) Glucose- and gluconate-doping resulted in synergy that accelerated acetogenesis and lipogenesis beyond the linear extrapolation of additional carbon supplement. (**B**) The maximum CO<sub>2</sub> fixation and fatty acid production rates were attained by cofeeding glucose and gluconate in limiting quantities. Stoichiometric analysis of metabolic requirements and burdens revealed the key role of glucose and gluconate in generating ATP and NADPH. The dashed arrows denote negligible contributions. (**C**) In terms of energy efficiency, 95% of H<sub>2</sub> energy can be stored as acetate by *M. thermoacetica* and 55% of acetate energy can be stored as lipids by *Y. lipolytica*. Coordination of acetogenesis and lipogenesis enabled storage of 38% of H<sub>2</sub> energy as lipids and 14% as biomass. (**D**) The cofeeding approach can also be applied to synthesizing other products with predicted synergistic productivity that exceeds the sum of individual-substrate productivities.

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#### Methods

#### Strains and culture conditions

- Yarrowia lipolytica strains based on the ACCDGA strain (MTYL065)<sup>37</sup> were pre-cultured at 30 °C in 483
- 484 14 mL test tubes containing YPD media (20 g/L glucose, 20 g/L peptone, 10 g/L yeast extract). After
- 24 hr, 1 mL culture was transferred to a shake flask containing 40 mL of acetate media (50 g/L 485
- 486 sodium acetate, 1.7 g/L YNB-AA-AS, and 1.34 g/L ammonium sulfate). The shake flask culture was
- 487 carried out for 24 hr to adapt the cells to acetate. Afterwards, the cells were pelleted at 18,000 g for
- 488 5 min, washed once with acetate media, and used for inoculation at an initial  $OD_{600}$  of 0.05 for all Y.
- 489 *lipolytica* experiments.
- 490 Mixed substrate batch cultures were carried out in shake flasks with 40 mL of acetate media except
- that 6 mol% of the total carbon from acetate was replaced with the supplemental substrate 491
- 492 (glucose, fructose, glycerol, or gluconate). Continuous fed-batch supplementation cultures were
- carried out in 250 mL bioreactors (Applikon Biotechnology) with 150 mL working volume. Acetate 493
- 494 media was used under batch conditions while the supplemented substrate was continuously fed at
- 495 a rate of 0.13 mmol C/hr. For the acetate-only control case, the supplemented substrate was
- replaced with acetate and fed at the same rate to ensure that cells had equal amounts of carbon 496
- 497 substrates throughout all conditions. All bioreactor cultures were carried out at 30 °C, pH 7.0
- 498 (controlled with 10 wt% sulfuric acid), and 0.2 LPM air sparging. The dissolved oxygen levels were
- 499 controlled at 20% during the growth phase and ~2% during the lipogenic phase for optimal lipid
- 500 production and minimal citrate excretion<sup>4</sup>. For gluconate <sup>13</sup>C tracing experiments, natural gluconate
- 501 in the supplementation feed stream was replaced with [U-13C<sub>6</sub>]gluconate (99%, Cambridge Isotope
- 502 Laboratories).
- 503 In all *Y. lipolytica* experiments having gluconate as a substrate, an ACCDGA strain overexpressing its
- 504 native gluconate kinase (glucK) under the *TEFin* promoter was used. The expression of *TEFin*-glucK
- 505 was performed through genome integration. This was to ensure that gluconate uptake and
- 506 incorporation into central carbon metabolism was not inhibited by inadequate levels of the kinase.
- 507 All other experiments were performed using the same ACCDGA strain with an empty control vector

- integrated into the genome. Overexpressing gluconate kinase did not have any appreciable effects
- on the strain's capability to produce lipids on acetate, as shown in **Supplementary Fig. 9**.
- 510 *Moorella thermoacetica* (ATCC 39073 and 49707) were cultured in balch-type tubes containing
- culture medium with 8 g/L glucose, 7.5 g/L NaHCO<sub>3</sub>, 7 g/L KH<sub>2</sub>PO<sub>4</sub>, 5.5 g/L K<sub>2</sub>HPO<sub>4</sub>, 2 g/L
- 512  $(NH_4)_2SO_4$ , 0.5 g/L MgSO<sub>4</sub> 7H<sub>2</sub>O, 0.3 g/L cysteine, 0.02 g/L CaCl<sub>2</sub> 2H<sub>2</sub>O, 1% (v/v) trace minerals
- 513 (ATCC MD-TMS), and 1% (v/v) vitamins (ATCC MD-VS) at 55 °C pH 6.8. Cysteine scavenged
- residual dissolved oxygen in the medium<sup>38</sup>. The headspace was pressurized to either 170 kPa with
- $CO_2$  or 240 kPa with 80:20 H<sub>2</sub>/ $CO_2$ . For <sup>13</sup>C tracing experiments, natural glucose was replaced with
- 516 [U-13C<sub>6</sub>]glucose (99%, Cambridge Isotope Laboratories) and the headspace was pressurized to 170
- kPa with natural CO<sub>2</sub>. The balch-tube cultures were incubated inside a strictly anoxic glovebox with
- 518 magnetic stirring.

- For bioreactor experiments, *M. thermoacetica* (ATCC 49707) was cultured in a strictly anoxic vessel
- with pH and temperature control set to 6.6 (using 10M sodium hydroxide) and 55°C. Low glucose
- but otherwise identical culture media were fed as follows (media glucose concentrations and media
- feed rates): 0.25 g/L at 11.5 mL/hr; 0.25 g/L at 9.1 mL/hr; 0.25 g/L at 6.9 mL/hr; 0.25 g/L at 4.3
- 523 mL/hr; 0.25 g/L at 2.3 mL/hr; 0.25 g/L at 1.2 mL/hr; and 0.13 g/L at 1.2 mL/hr. The rate of
- effluent was the same to keep the culture volume constant at 135 mL. H<sub>2</sub> and CO<sub>2</sub> were mixed at
- 525 60:40 and sparged into the culture at 200 mL/min. The headspace pressure was maintained at 130
- kPa. All the data and conditions are shown in **Supplementary Table 5**.

#### Metabolite extraction and measurement

- To extract metabolites, *Y. lipolytica* cells were collected during exponential and lipogenic phases.
- Cells were filtered on  $0.45 \mu m$  nylon membrane filters and immediately transferred to a precooled
- 40:40:20 acetonitrile/methanol/water solution. After 20 minutes at -20°C, the filters were washed,
- and extracts were moved to Eppendorf tubes. The samples were then centrifuged for five minutes
- and the supernatants were dried under nitrogen.
- In mid-exponential phase, the *M. thermoacetica* cultures were collected from balch-type tubes using
- 534 syringes inside the anaerobic glovebox. Immediately after, cellular metabolism was quenched and
- metabolites were extracted by quickly transferring filtered cells (on 0.2 µm nylon membrane filter)
- to plates containing precooled 80% acetonitrile on ice<sup>39</sup>. After 20 minutes at 4°C, the membrane
- 537 filters were washed, and the metabolite extracts were moved to Eppendorf tubes. The supernatants
- were obtained after five minutes of centrifugation and lyophilized.
- 539 Dried samples were resuspended in HPLC-grade water for LC-MS analysis. These samples were
- analyzed on a Dionex UltiMate 3000 UPLC system (Thermo) with a ZIC-pHILIC (5 μm polymer
- particle) 150 × 2.1 mm column (EMD Millipore) coupled to a QExactive orbitrap mass spectrometer
- 542 (Thermo) by electrospray ionization. With 20 mM ammonium carbonate, 0.1% ammonium
- 543 hydroxide as solvent A and acetonitrile as solvent B, the chromatographic gradient was run at a
- flow rate of 0.150 mL/min as a linear gradient from 80% B to 20% B between 0 and 20 mins, a
- linear gradient from 20% B to 80% B between 20 and 20.5 mins, and 80% B held from 20.5 to 28
- mins. The column and autosampler tray temperature were at 25 °C and 4 °C. The mass
- spectrometer was operated in polarity switching mode scanning a range of 70-1,000 m/z. The

- resolving power was set to 70,000 for <sup>13</sup>C labeling experiments. With retention times determined
- by authenticated standards, resulting mass spectra and chromatograms were identified and
- processed using MAVEN software<sup>40</sup>. To obtain labeling information of cellular bicarbonate and
- acetate, the labeling of carbamoyl group was obtained by comparing (i.e., computing the inverse
- 552 Cauchy product) citrulline to ornithine, and the labeling of acetyl group was obtained by comparing
- N-acetyl-glutamate to glutamate.

## Substrate uptake and product secretion measurement

- For *Y. lipolytica*, 1 mL of culture was taken at each time point for media and cell dry weight (CDW)
- analysis. The cells were centrifuged at 18,000 g for 10 min and the supernatant was subsequently
- extracted, filtered (0.2 μm syringe filters), and analyzed on a high-performance liquid
- 558 chromatography (HPLC). The cell pellet was then wash once with 1 mL water to remove residual
- media components and dried in a 60 °C oven until its mass remains unchanged. This mass was
- taken to be the CDW per mL of culture. As for lipids, a small volume was extracted from the culture
- such that it contains  $\sim$ 1 mg of CDW. The supernatant was discarded after centrifugation at 18,000g
- 562 for 10 min. 100 μL of an internal standard containing 2 mg/mL methyl tridecanoate (Sigma-
- Aldrich) and 2 mg/mL glyceryl triheptadecanoate (Sigma-Aldrich) in hexane was added to each
- sample. Transesterification was then carried out in 500 µL 0.5 N sodium methoxide solutions with
- continuous vortexing at 1200 rpm for 60 min. Afterwards, 40 µL of 98% sulfuric acid was added to
- neutralize the pH and 500 μL of hexane was used for extraction. Additional vortexing at 1200 rpm
- for 30 min was carried out and centrifugation at 6,000 g for 1 min was performed to remove
- cellular debris. The top hexane layer was used for analysis on a GC-FID system. All *Y. lipolytica*
- specific rate data were normalized to the lipid-free CDW, which was the difference between the
- 570 measured CDW and the lipid titer.
- For media analysis in *M. thermoacetica* cultures, small aliquots of the cultures were collected with
- 572 syringes inside the anaerobic glovebox over their exponential phase. Filtered media samples (0.2
- 573 μm syringe filters) were analyzed by YSI biochemistry analyzer for glucose and by HPLC for acetate
- and formate along with other potential products (e.g., lactate and ethanol). Culture density was
- measured by spectrophotometry (0.45 gCDW  $L^{-1}$  OD<sub>660</sub><sup>-1</sup>) at the time of sampling. The rates of
- substrate uptake and product secretion were determined using the rates at which substrates,
- 577 products, culture density change over time. The carbon output rate for biomass was determined
- using growth rate and elemental biomass composition of  $CH_{2.08}O_{0.53}N_{0.24}$  <sup>41</sup>. The net  $CO_2$  fixation
- rates were calculated based on the measured acetate and biomass carbon production rates less the
- 580 corresponding measured glucose carbon consumption rates. The fraction of electrons derived from
- 581 H<sub>2</sub> was inferred from the fraction of acetate and biomass carbons generated from net CO<sub>2</sub> fixation
- since the average oxidation state of acetate and biomass carbons is nearly the same as that of
- 583 glucose.
- For HPLC, 10 μL sample was injected into an Agilent 1200 High-Performance Liquid
- 585 Chromatography system coupled to a G1362 Refractive Index Detector (Agilent Technologies). A
- 586 Bio-Rad HPX-87H column was used for separation with 14 mM sulfuric acid as the mobile phase
- flowing at 0.7 mL/min. For GC-FID, 1 μL of sample was injected at a split ratio of 50:1 into an
- Agilent 7890B GC-FID system coupled to a J&W HP-INNOWax capillary column (Agilent

Technologies). The column was held at a constant temperature of 200 °C with helium as the carrier

590 gas (1.5 mL/min). The injection and FID temperatures were set to 260 °C.

# Headspace gas measurement

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- 592 After collecting the *M. thermoacetica* cultures from balch-type tubes inside the anaerobic glovebox
- for intracellular and extracellular metabolite analysis, the empty balch-type tubes containing only
- the headspace gas were stored at 4 °C until gas chromatography-mass spectrometry (GC-MS)
- analysis. To measure CO<sub>2</sub> isotope labeling, 100 μl of headspace sample was collected from each tube
- 596 with a gastight syringe and injected in a multimode inlet, which was maintained at 180 °C, with a
- split of 10. Samples were analyzed on a 7890A GC system with a 60 m GS-GasPro (0.320 mm
- 598 diameter) column coupled with a 5975C quadrupole mass spectrometer (Agilent). The oven was
- kept at 90 °C for 3 minutes before heating to 260 °C at 45 °C/min and held at 260 °C for 1 minute.

## Flux balance analysis and isotope tracing flux analysis

- 601 *M. thermoacetica* model based on the published genome-scale metabolic reconstruction<sup>42</sup> was
- 602 employed for constraint-based flux analysis (see **Supplementary Information**). Among the
- 603 feasible metabolic flux distributions that satisfy steady-state mass balance and nutrient availability
- 604 constraints, optimal solutions that maximize/minimize objective functions were obtained using the
- 605 COBRA toolbox and a Gurobi solver<sup>43</sup>. To determine CO<sub>2</sub> utilization capability, the objective was to
- 606 maximize CO<sub>2</sub> consumption, or equivalently, minimize CO<sub>2</sub> production. To determine the growth
- 607 potential using H<sub>2</sub> as the energy source, the objective was to maximize biomass production (i.e., cell
- 608 growth). Substrate uptake and product secretion rate constraints were selected based on
- 609 experimental or previously reported values.
- To determine flux distributions, isotopomer mass balance constraints were also imposed based on
- the  $^{13}$ C labeling results. For this purpose, the metabolic networks including glycolysis and PPP for *Y*.
- 612 *lipolytica* as well as lower glycolysis, the TCA cycle, anaplerosis, the reductive acetyl-CoA pathway
- and the serine/glycine pathway for *M. thermoacetica* were constructed with carbon atom mapping.
- The labeling of following metabolites were simulated by the elementary metabolite unit (EMU)
- framework<sup>44</sup>: for *Y. lipolytica*, G6P, F6P, 3PG, S7P, 6PG, R5P, PEP, and Pyr (**Supplementary Table**
- **1**); for *M. thermoacetica*, 3PG, PEP, Ala, acetyl-CoA, Ser, Gly, Asp, Glu, and CO<sub>2</sub> (**Supplementary**
- 617 **Table 3**).
- The flux distribution that best simulated the metabolite labeling and uptake-secretion rates was
- found by minimizing the variance weighted-sum of squared residuals (SSR) between simulation
- 620 and experiment:

$$\min_{v} \sum_{v} \left( \frac{iso_{exp} - iso(v)}{s_{iso}} \right)^{2} + \sum_{v} \left( \frac{v_{exp} - v}{s_{v}} \right)^{2}$$

- 621 v and iso(v) denote in vector form the metabolic flux distribution and the simulated <sup>13</sup>C labeling of
- metabolites as a function of v.  $v_{exp}$  and  $iso_{exp}$  denote measured fluxes and measured metabolite
- labeling;  $s_v$  and  $s_{iso}$ , their measurement standard deviation. The 95% confidence interval for each
- best fit flux was obtained by searching for the minimum and maximum flux values that increase the
- 625 minimum SSR by less than the  $\chi^2$  cutoff (1 degree of freedom) of 3.84.45

## Code availability

- The code for metabolic flux and free energy analysis is available on the GitHub public repository:
- 628 https://github.com/jopark/moorella\_yarrowia

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