1 Proteome reallocation enables the selective *de novo* biosynthesis of non-linear,

2 branched-chain acetate esters

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13 ABSTRACT

The one-carbon recursive ketoacid elongation pathway is responsible for making various 14 15 branched-chain amino acids, aldehydes, alcohols, and acetate esters in living cells. Controlling 16 selective microbial biosynthesis of these target molecules at high efficiency is challenging due to 17 enzyme promiscuity, regulation, and metabolic burden. In this study, we present a systematic 18 modular design approach to control proteome reallocation for selective microbial biosynthesis of 19 branched-chain acetate esters. Through pathway modularization, we partitioned the branched-20 chain ester pathways into four submodules including keto-isovalerate submodule for converting 21 pyruvate to keto-isovalerate, ketoacid elongation submodule for producing longer carbon-chain 22 keto-acids, ketoacid decarboxylase submodule for converting ketoacids to alcohols, and alcohol 23 acyltransferase submodule for producing branched-chain acetate esters by condensing alcohols 24 and acetyl-CoA. By systematic manipulation of pathway gene replication and transcription, 25 enzyme specificity of the first committed steps of these submodules, and downstream competing 26 pathways, we demonstrated selective microbial production of isoamyl acetate over isobutyl 27 acetate. We found that the optimized isoamyl acetate pathway globally redistributed the amino 28 acid fractions in the proteomes and required up to 23-31% proteome reallocation at the expense of 29 other cellular resources, such as those required to generate precursor metabolites and energy for 30 growth and amino acid biosynthesis. The engineered strains produced isoamyl acetate at a titer of 31 8.8 g/L (> 0.25 g/L toxicity limit), a yield of 0.17 g/g (47% of maximal theoretical value), and 32 86% selectivity, achieving the highest titers, yields and selectivity of isoamyl acetate reported to 33 date.

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Keywords: modular design, ester biosynthesis, pathway selectivity, isobutyl acetate, isoamyl
 acetate, proteomics, proteome reallocation, metabolic burden, *Escherichia coli*.

37 INTRODUCTION

38 Short-chain esters formulate volatile compounds commonly found in flowers, ripe fruits, and 39 fermenting yeasts (Sugimoto et al., 2021; Sumby et al., 2010). Some of these esters are suggested 40 to have an important ecological role in pollination (Knudsen and Tollsten, 1993). Industrially, 41 these esters have versatile utility as flavors, fragrances, solvents, and biofuels. For instance, 42 isoamyl acetate (3-methyl-1-butyl acetate) is known as banana oil with a global market value of 43 \$5 billion in 2019 (IndustryARC, 2019; IndustryResearch, 2021). An isomer of isoamyl acetate, 44 ethyl valerate, is fully compatible for blending with gasoline or diesel (Lange et al., 2010), 45 suggesting potential application of isoamyl acetate as drop-in biofuel. Currently, knowledge about 46 the microbial biosynthesis of these molecules from renewable and sustainable feedstocks is 47 limited, making it difficult to optimize their production without further interrogation.

48 Biologically, cells can synthesize an ester by condensing an alcohol and an acyl-CoA with an alcohol acyltransferase (AAT) (Mason and Dufour, 2000). Due to the abundance and 49 50 essentiality of acetyl-CoA in living cells, acetate esters are the most common esters found in 51 nature. By activating one-, two-, or three-carbon recursive elongation via the recursive fatty acid 52 biosynthesis (Liu et al., 2016; Youngquist et al., 2013), reverse beta-oxidation (Dellomonaco et 53 al., 2011), or Ehrlich pathways (Atsumi et al., 2008; Zhang et al., 2008), it is possible to synthesize 54 a large library of acetate esters containing unique alcohol moieties with linear, branched, even, 55 and/or odd carbon chains (Layton and Trinh, 2016a; Layton and Trinh, 2016b; Lee and Trinh, 56 2020). However, selective microbial biosynthesis of designer acetate esters at high efficiency has 57 been an outstanding metabolic engineering problem. For instance, branched-chain acetate esters 58 (e.g., isoamyl acetate) represent an important class of molecules that can be synthesized via the 59 one-carbon recursive ketoacid elongation pathway (Connor et al., 2010; Connor and Liao, 2008).

Starting from the precursor pyruvate, this pathway generates ketoacids that can be decarboxylated to aldehydes, reduced to branched-chain alcohols, and condensed to acetate esters. Isobutyl acetate is generated in the first cycle, followed by isoamyl acetate in the second cycle, and so on. Although microbial production of isoamyl acetate has been reported since early 2000s by the condensation of isoamyl alcohol and acetyl CoA, production titers (<1 g/L) and selectivities (< 30%) were relatively low (Abe and Horikoshi, 2005; Horton et al., 2003; Vadali et al., 2004a; Vadali et al., 2004b).

67 Many confounding factors might negatively affect selective microbial biosynthesis of 68 branched-chain acetate esters. In addition to the well-known toxicity of higher alcohols and esters 69 (Wilbanks and Trinh, 2017b) and required expression of multiple pathway enzymes (Tai et al., 70 2015), the recursive one-carbon elongation pathway generates intermediate alcohol byproducts 71 (e.g., isobutanol) that compete with the target biosynthesis of esters (e.g., isobutyl acetate instead 72 of isoamyl acetate) (Dellomonaco et al., 2011; Layton and Trinh, 2014; Marcheschi et al., 2012; 73 Martin et al., 2003; Zhang et al., 2008). Currently, understanding and controlling this recursive 74 elongation pathway for efficient biosynthesis of target branched-chain acetate esters remains 75 elusive. A cellular proteome constitutes ~50% of dry cell weight, requiring a significant resource 76 investment (Neidhardt et al., 1990). As rewiring cellular metabolism can severely impact overall 77 proteome allocation, especially when multiple enzyme pathways are introduced and/or 78 overexpressed, proteome allocation or reallocation must be considered to achieve optimal product 79 production. This reallocation, however, is complex and poorly understood because it requires a 80 precise control of the expression, specificities, and activities of multiple pathway enzymes in order 81 to achieve optimal metabolic fluxes for selective microbial production of the target molecule 82 (Lechner et al., 2016) and avoid metabolic burden (Wu et al., 2016).

83 In this study, we presented a systematic modular design approach to control proteome 84 reallocation for the selective microbial biosynthesis of branched-chain acetate esters via 85 manipulation of substrate specificity and expression level of multiple pathway enzymes. For proof-86 of-concept, we demonstrated the approach to enable selective production of isoamyl acetate over 87 isobutyl acetate by controlling the one-carbon recursive ketoacid elongation pathway. Using 88 quantitative proteomics, we shed light on pathway-level proteome reallocation, metabolic burden, 89 and bottlenecks, which guided the effective metabolic rewiring for the efficient target ester 90 biosynthesis.

91

92 **RESULTS**

93 Design, construction, and characterization of a generalizable modular, non-linear, 94 branched-chain acetate ester pathway

95 Modular pathway design principles. The branched-chain acetate ester biosynthesis 96 pathway is derived from pyruvate (Fig. 1a). Pyruvate is converted to 2-ketoisovalerate via the L-97 valine biosynthesis pathway (KIV submodule) then elongated to 2-ketoacids via the +1 recursive 98 ketoacid elongation cycle mediated by the LeuABCD operon (keto-acid elongation submodule). 99 The Ehrlich pathway (KDC submodule) converts 2-ketoacids to aldehydes and alcohols, then the 100 alcohol acyltransferase pathway (AAT submodule) condenses alcohols and acetyl-CoA to form 101 branched-chain acetate esters. The key enzymes governing each pathway submodule such as 102 acetolactate synthase (IlvB or AlsS) (Steinmetz et al., 2010), 2-isopropylmalate synthase (LeuA) 103 (Ulm et al., 1972; Wiegel and Schlegel, 1977), ketoacid decarboxylase (KDC) (de la Plaza et al., 104 2004; Mak et al., 2015), and alcohol acyltransferase (AAT) (Cumplido-Laso et al., 2012; Nancolas 105 et al., 2017) are promiscuous, formulating a generalizable non-linear, branched-chain acetate ester biosynthesis pathway derived from the interconnected submodules (Fig. 1b). Due to the enzyme promiscuity and pathway modularity, we hypothesized that balancing proteome of the individual submodules with manipulated key enzymes (i.e., AlsS, LeuA, Kdc, and AAT) is critical to control selectivity of designer acetate ester production with high titers and yields. As a proof of concept, we demonstrated the feasibility of controlling selective production of isoamyl acetate over isobutyl acetate as a byproduct.

112 Construction and characterization of KIV and KDC submodules. We first aimed to 113 construct a strong KIV submodule to produce 2-ketoisovalerate (KIV), the key precursor 114 metabolite of the branched-chain acetate ester pathway. Because metabolic balance between the 115 KIV and KDC submodules is also important for high production of branched-chain alcohols, we 116 started by optimizing the expression of these two submodules simultaneously that can be evaluated 117 by measuring isobutanol production. Since heterologous expression of acetolactate synthase 118 (AlsS) from *Bacillus subtilis* and 2-ketoisovalerate decarboxylase (KivD) from *Lactococcus lactis* 119 is critical for high-level isobutanol production (Atsumi et al., 2008), we constructed three different 120 plasmids (i.e., pACYC, pCDF, and pRSF) harboring *alsS* and *kivD* with different plasmid copy 121 numbers (PCNs) to rapidly optimize the production submodules. Then, we introduced them to a 122 BL21 (DE3) strain harboring an operon of *ilvC*, *ilvD*, and *yqhD* under the control of T7 promoter 123 in a medium copy number pET23a plasmid (Fig. 1c). Isobutanol production by the recombinant 124 E. coli strains were measured to identify the most efficient combination of the production 125 submodules. The result showed that HSEC0503 harboring alsS and kivD in a high copy number 126 plasmid (pRSFDuet-1) produced the highest level of isobutanol (6.4 g/L) within 48 hours (h), 127 while HSEC0501 carrying alsS and kivD in a low copy number plasmid (pACYCDuet-1) produced 128 only 0.03 g/L of isobutanol (Fig. 1c). This result suggested that the high-level expression of alsS

and *kivD* to increase enzyme levels is important to pull the metabolic flux towards the branched-chain acetate ester pathway.

131 Assembly and characterization of the de novo isoamyl acetate pathway module. 132 Combining the elongation and AAT submodules together with the KIV and KDC submodules 133 forms the isoamyl acetate pathway (Figs. 1a, 1b, 1d). To construct the elongation submodule, a 134 *leuABCD* operon was cloned in a medium copy number pCDFDuet-1 plasmid (Fig. 1d). While 135 overexpressing the elongation submodule pulls metabolic flux towards isoamyl acetate, it should 136 be noted that isobutyl acetate can still be produced as a byproduct due to the promiscuity of the 137 KDC submodule that can produce either isobutanol or isoamyl alcohol (de la Plaza et al., 2004). 138 To enhance selective production of isoamyl acetate in our design, we reasoned that high substrate 139 specificity towards isoamyl alcohol should be chosen to create the AAT submodule. Recently, a 140 chloramphenicol acetyltransferase (CAT) was engineered and repurposed as an AAT to produce a 141 broad range of esters, capable of converting isoamyl alcohol to isoamyl acetate with 95% 142 (mol/mol) efficiency in E. coli (Seo et al., 2021). Specifically, the engineered CATec3 Y20F 143 derived from *E. coli* exhibited 3.5-folds higher catalytic efficiency (k_{cat}/K_M) towards isoamyl 144 alcohol than isobutanol (Seo et al., 2021), showing a higher selectivity against isoamyl alcohol 145 than isobutanol as compared to other available AATs (Tai et al., 2015) (Fig. S1). Therefore, we 146 deployed CATec3 Y20F to build the AAT submodule for selective production of isoamyl acetate 147 (Fig. 1d).

By introducing the KIV, elongation, KDC, and AAT submodules into *E. coli* BL21(DE3), we created the strain HSEC1006 capable of performing the *de novo* biosynthesis of isoamyl acetate from fermentable sugars. The characterization results showed that HSEC1006 produced 0.08 g/L ethyl acetate, 0.32 g/L isobutyl acetate and 0.29 g/L isoamyl acetate from glucose with 44.3% selectivity (Fig. 1d). While the *de novo* isoamyl acetate biosynthesis was successfully

153 demonstrated, the titer and selectivity were still low and hence required further pathway 154 optimization.

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156 Enhancing selective production of isoamyl acetate module

157 To boost isoamyl acetate production with higher selectivity, we applied three push-and-pull 158 metabolic engineering strategies: deletion of competing pyruvate and acetyl-CoA pool related 159 genes (i.e., *adhE* encoding aldehyde-alcohol dehydrogenase used for ethanol synthesis and *dld* 160 encoding quinone-dependent D-lactate dehydrogenase used for lactate synthesis), overexpression of a feedback insensitive LeuA G462D mutant (Mikhail Markovich Gusyatiner, 1999), and 161 overexpression of a longer chain keto-acid specific KivD F381L/V461A (Zhang et al., 2008). We 162 163 constructed four strains by implementing combinations of these strategies and measured acetate 164 ester production (Fig. 2a). Deletion of *adhE* and *dld* in the strain HSEC1207 improved isoamyl 165 acetate by 1.9-fold (0.5 g/L) as compared to HSEC1006, while isobutyl acetate titer was not 166 significantly changed regardless of the increased isobutanol (Fig. 2c), suggesting that CATec3 167 Y20F was effective for selective isoamyl acetate production. A combination of KivD 168 F381L/V461A overexpression and adhE and dld deletion in the strain HSEC1208 further 169 improved isoamyl acetate titer up to 0.8 g/L, while isobutyl acetate production decreased to 0.2 170 g/L (Fig. 2a). Interestingly, HSEC1209 expressing feedback insensitive LeuA (G462D) and wild-171 type KivD produced the similar titers of isoamyl acetate as compared to HSEC1208, while only 172 0.06 g/L of isobutyl acetate was produced (Fig. 2a). The results indicate that both Kdc and LeuA 173 enzymatic steps are critical for selective branched-chain acetate ester production.

HSEC1210 expressing both KivD F381L/V461A and LeuA G462D did not improve isoamyl acetate production (Fig. 2a). Like HSEC1209, HSEC1210 significantly reduced the byproduct isobutyl acetate from 0.2 g/L to 0.07 g/L. Due to the reduced production of isobutyl

177 acetate, selectivity of isoamyl acetate in the strain HSEC1210 increased 2.1-fold (91.3%), as 178 compared to HSEC1006 (44.3%) (Fig. 2b). We observed that more than 92% (w/w) of isobutyl 179 acetate and isoamyl acetate were extracted to the hexadecane layer, consistent with a previously 180 reported extraction efficiency (Rodriguez et al., 2014). However, isobutanol and isoamyl alcohol 181 were accumulated at a high level in HSEC1210, up to 1.5 g/L and 2.5 g/L in the culture medium, 182 respectively (Figs. 2c, 2d). Because isoamyl alcohol at 2.5-3.0 g/L concentration inhibits 50-80% 183 of cell viability (Connor and Liao, 2008; Wilbanks and Trinh, 2017a), the accumulated alcohols 184 might have likely caused the 30% lower cell mass of HSEC1210 than the other strains (Fig. 2e).

Taken together, manipulating the key metabolic enzymes AlsS, Kivd, and LeuA can effectively control selective production of isoamyl acetate over isobutyl acetate. However, metabolic bottleneck(s) in the engineered pathway module is still present in HSEC1210, likely limiting its isoamyl acetate production.

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190 **Proteomic analysis reveals proteome reallocation by isoamyl acetate pathway overexpression**

191 Identification of metabolic bottlenecks due to imbalanced pathway protein allocation. 192 Higher accumulation of alcohols in HSEC1210 implies that the metabolic flux of isoamyl acetate 193 module was not well balanced. We hypothesized that this imbalance might have been caused by a 194 metabolic burden imparted by the necessary overexpression of multiple heterologous and 195 endogenous genes in the isoamyl acetate pathway. To understand this imbalance and identify the 196 potential metabolic bottlenecks that might have limited isoamyl acetate production, we examined 197 proteome reallocation of HSEC1210 growing under conditions with and without IPTG induction 198 of the target pathway. As expected, the uninduced HSEC1210 (1.09 ± 0.03 1/h) grew faster than 199 IPTG-induced HSEC1210 (0.63 \pm 0.01 1/h) (Fig. 3a). Without the IPTG induction, HSEC1210 200 did not produce any detectable amount of isoamyl alcohol and isoamyl acetate likely due to the

201 tight regulation of the isoamyl acetate pathway genes under the T7 and T7lac promoters. With 202 IPTG induction, the isoamyl acetate biosynthetic proteins were significantly more abundant than 203 the control, confirming all ten genes were successfully overexpressed (Figs. 3b, 3c). Especially, 204 the three proteins AlsS, KivD*, and LeuA* represented an outsized share of protein expression 205 relative to the whole proteome, exhibiting the highest levels of protein abundances in the pathway and were ranked at 1, 11, and 19 in increased abundances in the proteome, achieving 602-, 60-, 206 207 and 47-fold more abundant than the control (without IPTG), respectively. These proteins represent 208 three important metabolic steps to direct metabolic fluxes towards the high production of isoamyl 209 acetate.

210 Overexpression of the isoamyl acetate module resulted in significant proteome 211 *reallocation*. Upon IPTG induction, the mass fraction of the isoamyl acetate pathway proteome 212 increased about 8-fold, representing 3.9% of total protein abundance in the uninduced control and 213 31.9% upon induction. This increase in protein abundances is seemingly at the expense of other 214 cellular systems, pathways, and resources such as those invested for generation of precursor 215 metabolites and energy (i.e., glycolysis, TCA cycle, mixed acid fermentation, acetyl CoA 216 biosynthesis, respiration, pentose-P-phosphate, ATP biosynthesis, and glyoxylate pathway) and 217 amino acid biosynthesis (Fig. 3d). For instance, by examining the glycolysis, we observed that the 218 abundances of many glycolysis-related proteins, such as glucose-6-phosphate isomerase (Pgi), 6-219 phosphofructokinase (Pfk), fructose-and bisphosphate aldolases (Fba), were significantly reduced 220 upon the isoamyl acetate pathway overexpression (Fig. 3f). The decreased abundances of the 221 pyruvate dehydrogenase enzyme complex (i.e., AceE, Lpd, and AceF) of the acetyl-CoA 222 biosynthesis pathway correlated well with the increased flux towards the isoamyl acetate pathway. 223 Since 0.1mM IPTG concentration has little inhibitory effect on E. coli growth (Kosinski et al., 224 1992) and isoamyl alcohol accumulation (0.13 g/L) was relatively low during the exponential

growth phase, the reduced growth was likely attributed to the metabolic burden caused by simultaneous overexpression of multiple enzymes.

By examining the isoamyl acetate pathway proteins, we could further identify an imbalanced overexpression among the target genes. Even though the target pathway genes that were expressed on higher copy plasmids yielded more abundant proteins as expected, the genes belonging to the same operons exhibited different levels of protein abundances. For instance, AlsS was much more abundant than CATec3 Y20F in the *alsS-cat* operon, IlvC more abundant than YqhD in the *ilvC-ilvD-yqhD* operon, and LeuA* more abundant than LeuB, LeuC, and LeuD in the *leuABCD* operon (Figs. 2d, 3c).

234 Globally, we observed a large perturbation in the amino acid reallocation constituting the 235 proteome. The mass fraction contributions of cysteine (+27%), methionine (+10%), serine (+7%), 236 glycine (+5%), aspartate (+3.2%) and alanine (+2.3%) in the proteome increased at least 2% while 237 those of tryptophan (-13%), valine (-5.2%), threonine (-3.8%), glutamate (-3.8%), proline (-3.5%), 238 tyrosine (-2.5%), phenylalanine (-2.5%), arginine (-2.2%), and histidine (-2.1%) decreased at least 239 2% (Fig. 3e). This analysis was based on the aggregate abundance for isoamyl acetate pathway 240 proteins and their amino acid distributions relative to those observed in the quantifiable proteome. 241 Since the isoamyl acetate pathway proteins represent an outsized share of protein abundance upon 242 induction, the resource demand of the pathway module could impart a sizable burden on the rest 243 of the system (i.e., amino acid biosynthesis, transcription and translation machinery, energetics, 244 etc.)

Taken together, overexpression of the isoamyl acetate pathway and its effect on proteome allocation suggest an imposed metabolic burden. The severe fold-change abundance difference of CATec3 Y20F upon induction, as compared to AlsS, and high accumulation of isoamyl alcohol implied that CATec3 Y20F might be the rate limiting step.

249 Tuning the isoamyl acetate pathway by enhancing CATec3 Y20F expression. To test 250 whether the AAT activity was the bottleneck for the isoamyl acetate production, we introduced an 251 additional monocistronic CATec3 Y20F gene under the control of T7lac promoter on the medium 252 copy pCDF plasmid (Fig. 4a). The additional expression of CATec3 Y20F in HSEC1311 did not 253 affect cell growth as compared to HSEC1210 (Fig. 4b) but improved isoamyl acetate production 254 by 4.3-fold, reaching a titer of 3.1 g/L (Fig. 4c). Isoamyl alcohol accumulation in HSEC1311 was 255 significantly reduced by 10-fold from 2.93 g/L to 0.22 g/L (Fig. 4d). This perturbation reduced the 256 enzyme aggregate abundance of the isoamyl acetate pathway from 31.9% to 22.6%, while the 257 reallocation for generation of precursor metabolites and energy and amino acids were enhanced 258 (Figs. 4g, S2). The CATec3 Y20F abundance was 10.2-folds higher in HSEC1311 than HSEC1210 259 while other proteins of the isoamyl acetate pathway exhibited a 1.7- to 3-folds decrease in protein 260 abundance (Fig. 4f), likely due to the transcriptional and/or translational competition by the 261 introduction of an additional CATec3 Y20F operon. Remarkably, the additional expression of 262 CATec3 Y20F resulted in the amino acid reallocation in the global proteome (Fig. 4e). Mass 263 fractions of some amino acids in the proteome became more abundant in HSEC1311 than 264 HSEC1210 while others were reduced. The trend observed here is reciprocal to the scenario of 265 HSEC1210 growing in the media with and without IPTG induction. The mass fraction 266 contributions of tryptophan (+7.0%), tyrosine (+3.1%), and phenylalanine (+2.7%) in the proteome 267 increased at least 2% while those of cystine (-6.7%), serine (-2.9%), and methionine (-2.5%) 268 decreased at least 2 %.

Overall, CATec3 Y20F was the rate limiting step in HSEC1210. The additional overexpression of this protein in HSEC1311 helped alleviate both the metabolic bottleneck and metabolic burden.

272

273 Demonstration of high-level isoamyl acetate production

274 Further deletion of upstream competing pathways did not improve isoamyl acetate 275 *production.* We next examined whether additional deletion of competitive upstream pathways in 276 HSEC1311 could further improve production of isoamyl acetate. Our deletion targets included 277 *ldhA* (L-lactate dehydrogenase), *ackA-pta* (an operon of acetate kinase and phosphate 278 acetyltransferase), *ilvE* (branched chain amino acid aminotransferase), and *tyrB* (aromatic amino-279 acid aminotransferase), which can potentially help reduce the lactate and acetate formation as 280 byproducts and improve ketoacid availability (Fig. 5a). The isoamyl acetate production modules 281 were plugged into the engineered strains and isoamyl acetate yields were compared (Figs. 5b, S3). 282 Our results showed that deletion of the upstream pathway enzymes did not significantly improve 283 isoamyl acetate yield, suggesting that the upstream competitive pathways were not major 284 metabolic bottlenecks in our system. Isoamyl acetate yield reached up to 0.17 (g/g glucose) that 285 corresponds to 47% of the maximum theoretical yield (0.36 g/g).

286 Fed-batch fermentation boosted high-level production of isoamyl acetate. The 287 considerable isoamyl acetate yield prompted us to investigate whether glucose-fed batch 288 fermentation with pH control could increase isoamyl acetate production. Because the *ilvE* and *tyrB* 289 deletions can affect amino acid utilization (Iwasaki et al., 2021) during a prolonged isoamyl acetate 290 production, we characterized and compared the isoamyl acetate production of the two engineered 291 strains, including HSEC1513 (BL21 (DE3) $\triangle adh E \triangle dld \triangle ldh A \triangle ack A-pta$ harboring the isoamyl 292 acetate production modules) and HSEC1715 (BL21 (DE3) $\Delta adhE \Delta dld \Delta ldhA \Delta ackA-pta \Delta ilvE$ 293 $\Delta tyrB$ harboring the isoamyl acetate production modules) over 144 h (Figs. 5c, 5d, 5e). 294 Remarkably, we observed accumulation of isoamyl alcohol from both strains for the first 24 h and 295 optical density (OD_{600nm}) decreased from 3.2 to 1.4 between 12 to 36 h, probably due to alcohol 296 toxicity (Fig. 5c). The OD_{600nm} later increased up to 4.3, and the accumulated isoamyl alcohol was

297 converted to isoamyl acetate for the next 72 h. HSEC1513 and HSEC1715 produced isoamyl 298 acetate up to 8.4 g/L (82% selectivity) and 8.8 g/L (86% selectivity), respectively, reporting the 299 highest microbial production of isoamyl acetate titers up to date (Figs. 5d, 5e). The byproduct 300 isobutyl acetate was produced up to 1.4 g/L. Since HSEC1513 and HSEC1715 showed little 301 difference in cell growth and isoamyl acetate production, we concluded that the aminotransferases 302 were not the major bottlenecks in our engineered strains.

303

304 **DISCUSSION**

305 The one-carbon recursive elongation pathway is important for making branched-chain amino 306 acids, aldehydes, alcohols, and esters. Due to this complex and highly branched pathway, 307 controlling selective microbial biosynthesis of these target molecules has been an outstanding 308 metabolic engineering problem. To address the problem, we developed a generalizable modular 309 design framework to systematically tune selective microbial biosynthesis of branched-chain 310 acetate esters that require the integration of four submodules including the KIV submodule, the 311 elongation submodule, the KDC submodule, and the AAT submodule. We validated this 312 framework by demonstrating selective biosynthesis of isoamyl acetate over isobutyl acetate as an 313 ester byproduct, achieving the highest titer (8.7 g/L), yield (0.17 g/g), and selectivity (86%) 314 reported to date.

Critical to selective microbial biosynthesis of branched-chain acetate esters is control of protein expression and specificity of the first committed steps of the four submodules including AlsS, LeuA*, Kivd*, and CAT*. To achieve high production of isoamyl acetate, the engineered pathway required overexpression of 10 genes, which made up about 23-31% of total proteome allocation and represented a relatively large fractional share of overall proteome abundance as

320 compared to the non-overexpressed control. This metabolic pathway rewiring caused global 321 perturbations that can be seen in the fraction of amino acids within the proteome. This metabolic 322 tradeoff occurred at the expense of other cellular processes such as the fueling pathways 323 responsible for generating precursor metabolites, and energy and amino acid biosynthesis, which 324 could explain the observed metabolic burden affecting cell growth and yield. While the push-and-325 pull strategy of metabolic fluxes towards the target pathway(s) is commonly practiced in metabolic 326 engineering, our study provides direct quantitative evidence of the proteome reallocation required 327 to achieve pathway efficiency and potential metabolic tradeoffs.

328 Remarkably, close examination of the engineered pathway proteins shows that increase in 329 abundances of target proteins might be significantly different even though their encoding genes 330 are organized in the same operon. Upstream genes exhibited larger relative increases in protein 331 abundance relative to downstream ones within an operon. Different amino acid requirements, 332 codon usage, and/or protein folding efficiency for each protein might have contributed to this 333 discrepancy. Our result further revealed that a single limiting enzymatic step, such as AAT, could 334 impose a detrimental metabolic bottleneck/burden due to flux imbalance and hence accumulation 335 of alcohol intermediates that become inhibitory.

336 Medium chain length (C_6 - C_{10}) branched esters are relatively hydrophobic metabolites and 337 therefore, toxic to cells as they interfere with cell membranes (Wilbanks and Trinh, 2017a). Due 338 to low solubility of these esters in aqueous solutions, our study demonstrated the feasibility of 339 producing them at much higher concentrations than their reported toxicity limit (0.25 g/L) via in 340 situ fermentation and extraction. Our data also demonstrate that ester biosynthesis could help 341 detoxify alcohols as intermediates via overexpression of AAT whereby the resulting esters are 342 immediately extracted by a non-toxic solvent overlay such as hexadecane. Even though the 343 enhanced expression level of CATs improved isoamyl acetate production, accumulation of

isoamyl alcohol and decrease in cell growth observed during the fed-batch fermentation suggestedthat the AAT activity was still a major bottleneck (Fig. 5c).

346 Unlike other eukaryotic AATs, use of CATec3 Y20F is beneficial for designer ester 347 production due to higher solubility, thermostability, and selectivity (Seo et al., 2021). However, 348 it has relatively lower catalytic efficiency towards short chain alcohols such as isobutanol and 349 isoamyl alcohol. Thus, future protein engineering of CATec3 Y20F for improved catalytic 350 efficiency towards isoamyl alcohol can help reduce the alcohol accumulation while not requiring 351 high protein expression. Although our study focused on the selective microbial biosynthesis of 352 isoamyl acetate as a proof-of-concept, the generalizable modular design of the recursive one-353 carbon elongation pathway can be extended to produce longer branched-chain acetate esters such 354 as isohexyl acetate and isoheptyl acetate. Since CATec3 Y20F has higher catalytic efficiency 355 towards longer chain alcohols (Seo et al., 2021), it is expected that the selectivity of KDC and/or 356 LeuA needs to be further engineered to achieve selective microbial biosynthesis of designer acetate 357 esters with longer carbon chain lengths.

358 One potential challenge of branched chain acetate ester biosynthesis is the stoichiometric 359 redox imbalance that might cause growth inhibition and/or impaired production. Fermentative 360 isoamyl acetate production requires two moles of glucose to produce two acetyl-CoAs and one 361 isoamyl alcohol (2 Glucose + 5 NAD(P)+ = 1 Isoamyl acetate + $5CO_2$ + 5NAD(P)H). Therefore, 362 the pathway generates five moles of excess NAD(P)H that could inhibit the fermentation under an 363 oxygen limited condition without an appropriately coupled electron sink(s). Indeed, HSEC1311 364 was not able to grow without oxygen (Fig. S4), suggesting the possible inhibition of fermentation 365 by the cofactor imbalance under the oxygen limited conditions. Recent studies suggest that 366 modular cell design principle can harness such electron redundancy for multi-objective strain 367 design by coupling production pathways with cell growth (Garcia and Trinh, 2019; Wilbanks et

al., 2018). Therefore, further optimization should include process engineering and chassis celldesign for improved production of branched-chain acetate esters.

370

371 MATERIALS AND METHODS

372 Strains and plasmids. *E. coli* DH5α and BL21(DE3) were used for molecular cloning and ester
373 production, respectively. The strains and plasmids used are listed in Table 1.

374

375 **Media and cultivation.** *E. coli* strains were grown in lysogeny broth (LB) medium or M9 hybrid 376 medium containing glucose as a carbon source and 5 g/L yeast extract supplemented with 100 377 μ g/mL ampicillin and/or 100 μ g/mL spectinomycin and/or 50 μ g/mL kanamycin when 378 appropriate.

379 For the batch fermentation, cells were cultured microaerobically in a 125 mL screw-capped 380 shake flask with a working volume of 20 mL in M9 medium containing 30 g/L glucose and 5 g/L 381 yeast extract. 10 mL of hexadecane (50% v/v) was overlaid to extract esters produced during the fermentation. To compare performance of the engineered strains, cells were cultured at 37°C for 382 383 48 h and the culture supernatant and hexadecane layer were analyzed. For the fed-batch 384 fermentation, 20g/L glucose working concentration was intermittently added to the culture using 385 600 g/L glucose stock when the glucose concentration was below 5 g/L. The pH was adjusted with 386 5M KOH to maintain its value between 6.0 and 7.5 every 12 h after 24 h until 120 h.

387

388 Molecular cloning

389 *Plasmid construction.* Plasmids were constructed by ligation-dependent cloning and/or 390 Gibson DNA assembly. Briefly, DNA fragments were amplified using the Phusion DNA 391 polymerase (cat# F530S, Thermo Fisher Scientific, MA, USA) and then purified by DNA 392 purification and gel extraction kits (Omega BioTek, GA, USA). For the ligation-dependent 393 cloning, the vectors and inserts were digested by restriction enzymes and ligated together using a 394 T4 DNA ligase. In the case of Gibson DNA assembly cloning, the purified DNA fragments of the 395 vector and insert were mixed together with the Gibson master mix (Gibson et al., 2009) and 396 assembled at 50°C for 1 h. Using the DNA mixtures, *E. coli* DH5α was transformed by heat-shock 397 transformation and selected on LB agar plates (15 g/L agar) with appropriate antibiotics. All the 398 constructed plasmids were checked by PCR amplification and/or restriction enzyme digestion, 399 and/or Sanger sequencing. The primers used in this study are listed in Table S1.

400 **Recombineering.** E. coli gene deletions were carried out using recombineering (Sharan et 401 al., 2009). A temperature sensitive low-copy plasmid that contains exo, bet, and gam in their native 402 phage operon, pL, under λ CI repressor control (pSIM6) was used to induce homologous 403 recombination of double strand DNA into the genome (Datta et al., 2006). Briefly, E. coli strains 404 harboring pSIM6 was cultured in 3 mL LB medium at 30°C overnight. The grown cells were 405 transferred to fresh 20 mL LB medium in a 250 mL flask with 1% inoculum size (200 µL) and 406 cultured for 2-3 hours in a water bath shaking incubator at 200 rpm and 32°C. At OD_{600nm} of 0.4~0.6, the cell culture flask was transferred to a preheated 42°C water bath shaking incubator at 407 408 200 rpm for 15 minutes (min). Then, the cells were immediately cooled down in ice for 10 mins 409 and centrifuged at 4,700 rpm for 10 min. The cell pellets were washed twice with 50 mL ice-cool 410 sterile Millipore water and then suspended in the 200 µL ice-cool sterile Millipore water. 80 mL 411 of the concentrated cells were mixed with ~100 ng of linear double-stranded DNA containing

412 FRT-Kan-FRT cassette, amplified by PCR. Then, the cells were transferred to an ice-chilled 1-413 mm gap electroporation cuvette (BTX Harvard Apparatus, MA, USA) followed by an exponential 414 decay pulse with 1.8 kV, 350 Ω , and 25 μ F, which gave usual pulse duration of 4.5-6.0 ms. The 415 cells were immediately mixed with 700 mL LB medium and recovered in a shaking incubator at 416 30°C for 2 h. The recovered cells were plated on LB solid medium with 25 mg/mL kanamycin and 417 incubated at 30°C for 2 days. Successful gene deletion was confirmed by colony PCR using 418 multiple combinations of primers specifically binding at upstream and/or downstream of the target 419 location and/or Kan in the FRT-Kan-FRT cassette (Table S1). The kanamycin resistance marker 420 was subsequently disrupted by FLP mediated recombination of FRT by pCP20 (Datsenko and 421 Wanner, 2000). 422

423 Analytical methods

424 *Cell growth measurement.* Cell growth was measured by optical density (OD) with a 425 spectrophotometer (Spectronic 200+, Thermo Fisher Scientific, MA, USA) and/or a microplate 426 reader (Synergy HTX microplate reader, BioTek) at 600 nm wavelength.

427 *3,5-dinitrosalicylic acid (DNS) assay.* Slightly modified DNS method was used to quickly 428 quantify and monitor the glucose consumption during the glucose fed-batch culture (Miller, 1959). 429 Briefly, 10 μ L of 1-, 2-, and 4-times diluted culture supernatants were mixed with 200 μ L of the 430 DNS reagent consisting of 16 g/L NaOH, 5 g/L phenol, 5 g/L sodium sulfite, and 300 g/L 431 potassium sodium tartrate, and 10 g/L DNS, and incubated at 98°C for 10 mins. The samples were 432 read by a microplate reader at 540nm. The M9 medium with 0 g/L, 1 g/L, 3 g/L, 5 g/L, and 10 g/L 433 glucose concentration was used as standard for every reaction.

434 *Proteomics.* Engineered *E. coli* strains (HSEC1210 uninduced; HSEC1210 induced with
435 IPTG; HSEC1311 induced with IPTG) were cultured as described above and harvested at 24 h in

biological triplicates. Cells were pelleted, supernatants removed, and pellets snap frozen and stored at -80°C. Frozen pellets (~100 μ L pellet volume) were then processed for LC-MS/MS-based proteomic measurements by resuspending in cold 100 mM Tris-HCl buffer, pH 8.0, adding ~200 μ L of 0.15 zirconium oxide beads, and bead beating with a Geno/Grinder 2010 (SPEX SamplePrep) for 5 min at high speed (1,750 rpm). Crude cell protein lysates were then further processed and proteolytically digested with trypsin as previously described (Walker et al., 2021).

442 Peptide samples were analyzed by automated 1D LC-MS/MS analysis using a Vanquish 443 UHPLC plumbed directly to a Q Exactive Plus mass spectrometer (Thermo Scientific) outfitted 444 with a trapping column coupled to an in-house pulled nanospray emitter (Walker et al., 2021). For 445 each sample, 3 µg of peptides were loaded, desalted, and separated by uHPLC with the following 446 conditions: sample injection followed by 100% solvent A (95% H₂O, 5% acetonitrile, 0.1% formic 447 acid) chase from 0-30 min (load and desalt), linear gradient 0% to 30% solvent B (70% 448 acetonitrile, 30% water, 0.1% formic acid) from 30-220 min (separation), and column re-449 equilibration at 100% solvent A from 220-240 min. Eluting peptides were measured and sequenced 450 by data-dependent acquisition on the Q Exactive MS as previously described (Clarkson et al., 451 2017).

High-performance liquid chromatography (HPLC) analysis. Extracellular metabolites
were quantified using HPLC system (Shimadzu Inc., MD, USA). 800 μL of culture samples were
centrifuged at 17,000 xg for 3 m followed by filtering through a 96-well filter plate with 0.45
micron. The samples were run with 10 mM sulfuric acid at 0.6 mL/min flow rate on an Aminex
HPX-87H (Biorad Inc., CA, USA) column at 50°C. Concentrations of sugars, organic acids, and
alcohols were determined by refractive index detector (RID) and ultra-violet detector (UVD).

458 Gas chromatography coupled with mass spectroscopy (GC/MS) analysis. Esters were 459 quantified by GC (HP 6890, Agilent, CA, USA) equipped with a MS (HP 5973, Agilent, CA, 460 USA). A Zebron ZB-5 (Phenomenex, CA, USA) capillary column (30 m x 0.25 mm x 0.25 µm) 461 was used with helium as the carrier gas at a flow rate of 0.5 mL/min. The oven temperature was 462 programed as follows: 50°C initial temperature, 1°C/min ramp up to 58°C, 25°C/min ramp up to 463 235°C, 50°C/min ramp up to 300°C, and 2-minutes bake-out at 300°C. 1 µL sample was injected 464 into the column with the 1:50 split mode at an injector temperature of 280°C. For the MS system, 465 selected ion mode (SIM) was used to detect and quantify esters with the parameters described 466 previously(Seo et al., 2021). As an internal standard, 10 mg/L n-decane were added in initial 467 hexadecane layer and detected with m/z 85, 99, and 113 from 12 to 15 m retention time range.

468

469 **Computational analysis**

470 Proteomic analysis. MS/MS spectra were searched against the E. coli BL21(DE3) 471 proteome (UniProt; Aug21 build) appended with relevant exogenous protein sequences and 472 common protein contaminants using the MS Amanda v.2.0 algorithm in Proteome Discoverer 473 v.2.3 (Thermo Scientific). As described previously (Walker et al., 2021), peptide spectrum matches 474 (PSM) were required to be fully tryptic with up to 2 miscleavages; a static modification of 475 57.0214 Da on cysteine (carbamidomethylated) and a dynamic modification of 15.9949 Da on 476 methionine (oxidized) residues. PSMs were scored and filtered using Percolator and false-477 discovery rates initially controlled at < 1% at both the PSM- and peptide-levels. Peptides were then 478 quantified by chromatographic area-under-the-curve, mapped to their respective proteins, and 479 areas summed to estimate protein-level abundance. Protein abundances were log2 transformed, 480 and sample abundance distributions normalized by LOESS then median centered in InfernoRDN

481 (Taverner et al., 2012). Missing values were imputed and sample groups statistically assessed in
482 Perseus(Tyanova et al., 2016).

All raw mass spectra for quantification of proteins used in this study have been deposited in the MassIVE and ProteomeXchange data repositories under accession numbers MSV000088838 (MassIVE) and PXD031694 (ProteomeXchange), with data files available at ftp://massive.ucsd.edu/MSV000088838/.

487 Proteome reallocation analysis. EcoCyc version 25.5 was used to extract annotated genes, 488 proteins, and pathways for proteome mapping of core metabolism using *E. coli* BL21(DE3) (Caspi 489 et al.). These pathways include i) generation of metabolites and precursors (glycolysis, pentose 490 phosphate pathway, Krebs cycle, glyoxylate cycle, respiration, fermentation, ATP biosynthesis, 491 acetyl CoA biosynthesis, and Entner Doudoroff pathway), ii) amino acid biosynthesis, iii) 492 aminoacyl-tRNA charging, and iv) isoamyl acetate biosynthesis. Amino acid sequences of each 493 protein in the proteome were retrieved from UniProt (UniProt, 2021).

494 Mass fraction of protein P_i, f_{Pi}, in the proteome is calculated as follows:

495
$$f_{Pi} = \frac{PA_i}{\sum_{i=1}^{N} PA_i} [1]$$

where PA_i is the abundance of protein i in the proteome, N is the total number of proteins in the proteome measured, and $\sum_{i=1}^{N} f_{Pi} = 1$. For a metabolic pathway with M proteins, the mass fraction of pathway proteome, f_{Path} , is determined as follows:

499 $f_{Path} = \sum_{k=1}^{M} f_{Pi} [2]$

500 Mass fraction of amino acid j, f_{Aj} , in the proteome is calculated as follows:

501
$$f_{Aj} = \frac{\sum_{i=1}^{N} AA_{ij} f_{Pi}}{\sum_{i=1}^{20} \sum_{i=1}^{N} AA_{ij} f_{Pi}} [3]$$

502 where AA_{ij} is the abundance of amino acid j in protein i of the proteome and $\sum_{j=1}^{20} f_{Aj} = 1$.

503 ACKNOWLEDGMENTS

504 This research was financially supported in part by the DOE BER award (DE-SC0022226) and the 505 DOE subcontract grant (DE-AC05-000R22725) by the Center of Bioenergy Innovation, the U.S. 506 Department of Energy Bioenergy Research Center funded by the Office of Biological and 507 Environmental Research in the DOE Office of Science, and the U.S. Department of Energy Joint 508 Genome Institute. The work conducted by the U.S. Department of Energy Joint Genome Institute, 509 a DOE Office of Science User Facility, is supported under Contract No. DE-AC02-05CH11231. 510 The authors would like to thank the Center of Environmental Biotechnology at UTK for using the 511 GC/MS instrument.

512

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520

521 **COMPETING INTERESTS**

522 The authors declare that they have no competing interests.

523

524 SUPPLEMENTARY DATA

525 **Supplementary File S1** contains Table S1 and Figures S1, S2, S3, S4.

- 526 **Table S1:** A list of primers used in this study.
- 527 **Figure S1.** Relative catalytic efficiency of AATs towards isoamyl alcohol over isobutanol.
- 528 Figure S2. Comparative proteomics of HSEC1311 and HSEC1210 growing in media with IPTG
- 529 induction at 24h.
- 530 Figure S3. Isoamyl acetate titers of engineered strains with sequential gene deletions after 48 h
- 531 culturing.
- 532 Figure S4. Growth of HSEC1311 under anaerobic and microaerobic conditions.
- 533
- 534

| Name | Descriptions | Source |
|--------------------|---|---|
| Plasmids | - | |
| pET29a | pBR322 ori, Kan ^R , lacI, T7lac promoter | Novagen |
| pET_CATec3 Y20F | CATec3 Y20F encoding gene in pET29a, 6X His-tag at C-terminus | This study |
| pACYCDuet-1 | p15A ori, Cm ^R , lacI, T7lac promoter | Novagen |
| pCDFDuet-1 | CloDF ori, Sm ^R , lacI, T7lac promoter | Novagen |
| pRSFDuet-1 | RSF ori, Kan ^R , lacI, T7lac promoter | Novagen |
| pET23a | pBR322 ori, Amp ^R , T7 promoter | Novagen |
| pSIM6 | pSC101 repA ^{ts} , Gam, Beta, Exo under the control of a temperature sensitive promoter | (Datta et al., 2006) |
| pCP20 | repA101 ^{ts} , Cm ^R , Amp ^R , FLP recombinase under the control of a temperature sensitive promoter. | (Cherepanov and Wackernage 1995) |
| pHM46 | pCDFDuet-1::alsS::kivD | (Seo et al., 2016) |
| pHM47 | pET23a:: <i>ilvC</i> , <i>ilvD</i> , <i>yqhD</i> | (Seo et al., 2016) |
| pHS121 | pRSFDuet-1::alsS::kivD | This study |
| pHS122 | pACYCDuet-1::alsS::kivD | This study |
| pHS133 | pRSFDuet-1:: alsS, catec3 Y20F::kivD | This study |
| pHS144 | pCDFDuet-1::LeuABCD | This study |
| pHS155 | pCDFDuet-1:: LeuABCD:: catec3 Y20F | This study |
| E. coli | | |
| DH5a | Host for molecular cloning | NEB |
| BL21(DE3) | F– ompT gal dcm lon hsdSB(rB–mB–) λ(DE3 [lacI lacUV5-T7p07 ind1 sam7 nin5]) [malB+]K-12(λS) | Novagen |
| HSEC01 | BL21(DE3) harboring pET_CATec3 Y20F | This study |
| HSEC0501 | BL21(DE3) harboring pHM47 and pHS122 | This study |
| HSEC0502 | BL21(DE3) harboring pHM46 and pHS47 | This study |
| HSEC0503 | BL21(DE3) harboring pHM47 and pHS121 | This study |
| HSEC0201 | BL21(DE3) $\Delta adhE$, Δdld | This study |
| HSEC0302 | BL21(DE3) $\Delta adhE$, Δdld , $\Delta ldhA$ | This study |
| | | |

535 **Table 1:** A list of plasmids and strains used in this study.

| HSEC0403 | BL21(DE3) $\Delta adhE$, Δdld , $\Delta ldhA$, $\Delta ackA$ -pta | This study |
|----------|---|------------|
| HSEC0504 | BL21(DE3) $\Delta adhE$, Δdld , $\Delta ldhA$, $\Delta ackA$ -pta, $\Delta ilvE$ | This study |
| HSEC0605 | BL21(DE3) $\Delta adhE$, Δdld , $\Delta ldhA$, $\Delta ackA$ -pta, $\Delta ilvE$, $\Delta tyrB$ | This study |
| HSEC1006 | BL21(DE3) harboring pHM47, pHS133, and pHS144 | This study |
| HSEC1207 | HSEC0201 harboring pHM47, pHS133, and pHS144 | This study |
| HSEC1208 | HSEC0201 harboring pHM47, pHS133/kivD V461A, F381L, and pHS144 | This study |
| HSEC1209 | HSEC0201 harboring pHM47, pHS133, and pHS144/LeuA G462D | This study |
| HSEC1210 | HSEC0201 harboring pHM47, pHS133/kivD V461A, F381L, and pHS144/LeuA G462D | This study |
| HSEC1311 | HSEC0201 harboring pHM47, pHS113/kivD V461A,F381L, and pHS155/LeuA G462D | This study |
| HSEC1412 | HSEC0302 harboring pHM47, pHS113/kivD | This study |
| HSEC1513 | V461A,F381L, and pHS155/LeuA G462D HSEC0403 harboring pHM47, pHS113/kivD V461A,F381L, and pHS155/LeuA G462D | This study |
| HSEC1614 | HSEC0504 harboring pHM47, pHS133/kivD V461A, | This study |
| HSEC1715 | F381L, and pHS155/LeuA G462D HSEC0605 harboring pHM47, pHS133/kivD V461A, F381L, and pHS155/LeuA G462D | This study |

537 FIGURE LEGENDS

538

Figure 1. Modular design of branched-chain acetate ester production pathway. (a) A metabolic 539 540 map of branched-chain acetate ester biosynthesis pathway. (b) The four submodules of the 541 branched-chain acetate ester pathway designed for controlling selective microbial biosynthesis of 542 acetate esters useful for various industries. (c) Optimization of isobutanol production module. 543 Shown are the genetic architecture of the two isobutanol operons and characterization of isobutanol 544 production by varying plasmid copy numbers (PCNs) in the engineered strains. Plasmid copy 545 numbers of pRSF, pCDF, pET, and pACYC are $>100, 20\sim40, 15\sim20, and 10\sim12$, respectively. (d) 546 Genetic architecture of operons designed for isoamyl acetate production and design validation. 547 Each data in panels (c) and (d) represents a mean ± 1 standard deviation from at least three 548 biological replicates.

549

Figure 2. Controlling selective microbial production of isoamyl acetate. (a) Systematic characterization and comparison of push-and-pull metabolic engineering strategies for selective microbial biosynthesis of isoamyl acetate over isobutyl acetate. (b) Selectivity of isoamyl acetate production by HSEC1006 and HSEC1210. (c-d) Accumulation of isobutanol and isoamyl alcohol by the engineered strains. \notin Comparison of cell growth of the engineered strains during 48 h culturing. Each data represents mean ± 1 standard deviation from at least three biological replicates.

557

Figure 3. Analysis of proteome reallocation of HSEC1210 growing in media with and without IPTG induction. (a) Cell growth. (b) A volcano plot comparing HSEC1210 proteomes at 24h. The red dots indicate the isoamyl acetate pathway proteins. (c) Proteomic fold-change of enzymes in the isoamyl acetate pathway upon IPTG induction. (d) Mass fractions of the fueling pathways for generating precursor metabolites and energy and biosynthesis pathways of amino acid \in (e) Percent of change in amino acid reallocation in the proteome upon IPTG induction. (f) Metabolic map displaying protein fold-changes of enzymes in the central metabolism. Significance (pval) and abundance fold-change (diff) were presented by $-\log_{10}(p-value)$ and $\log_2(difference)$, respectively. Each data represents mean ± 1 standard deviation from at least three biological replicates.

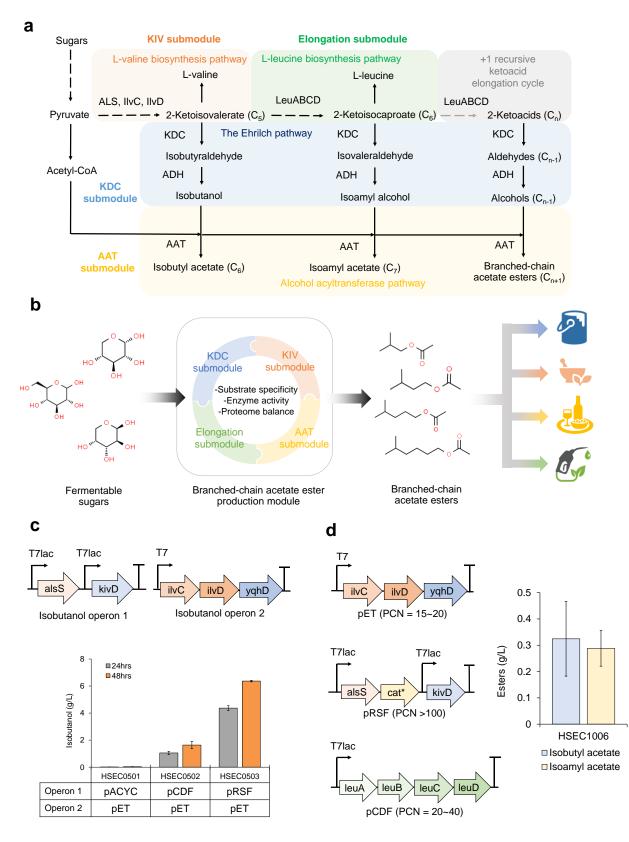
567

568 Figure 4. Alleviation of metabolic bottleneck and burden of the isoamyl acetate pathway by 569 overexpression of CATec3 Y20F. (a) Genetic architecture of operons in the pCDFDuet-1 backbone 570 plasmid of HSEC1210 and HSEC1311. In addition to having CATec3 Y20F in the pRSF plasmid 571 like HSEC1210, HSEC1311 was designed to express additional CATec3 Y20F in the pCDF 572 plasmid. (b-d) Comparison of cell growth (b) and production of isoamyl alcohol (c) and isoamyl 573 acetate (d) by HSEC1210 and HSEC1311 after 48 h. (e) Percent of change in amino acid 574 reallocation in the proteome upon additional expression of CATec3 Y20F. (f) Comparison of 575 proteomic fold-changes of enzymes in the isoamyl acetate pathway between HSEC1210 and 576 HSEC1311 at 24 h. (g) Mass fractions of the pathways for generating precursor metabolites and 577 energy and biosynthesis pathways of amino acids in the proteomes. Each data represents mean \pm 578 1 standard deviation from at least three biological replicates.

Figure 5. Optimization of isoamyl acetate production. (a) Metabolic map displaying deletion of genes participating in pathways that might compete for isoamyl acetate biosynthesis. The red marks indicate gene deletions and their reactions. (b) Comparison of isoamyl acetate yield on glucose between the engineered strains. (c) Profiles of cell growth and accumulated isoamyl alcohol production during fed-batch culture by HSEC1412 and HSEC1614. (d-e) Kinetics of

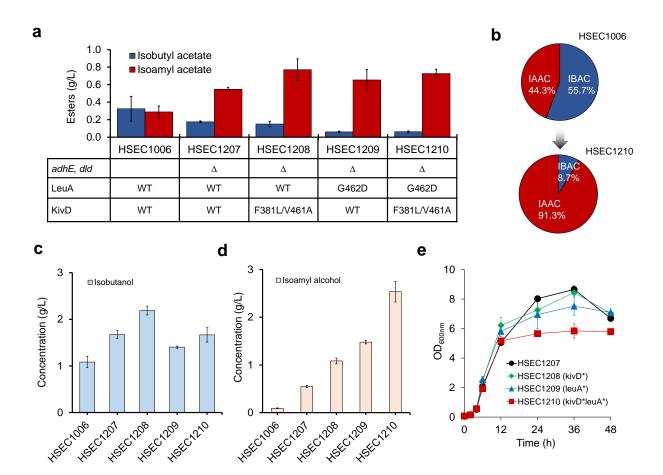
- 585 glucose consumption, isobutyl acetate production, and isoamyl acetate production from fed-batch
- 586 culture by (d) HSEC1412 and (e) HSEC1614. Each data represents mean ± 1 standard deviation
- 587 from at least three biological replicates.

588 **Figure 1**



590 **Figure 2**

591



593 **Figure 3**

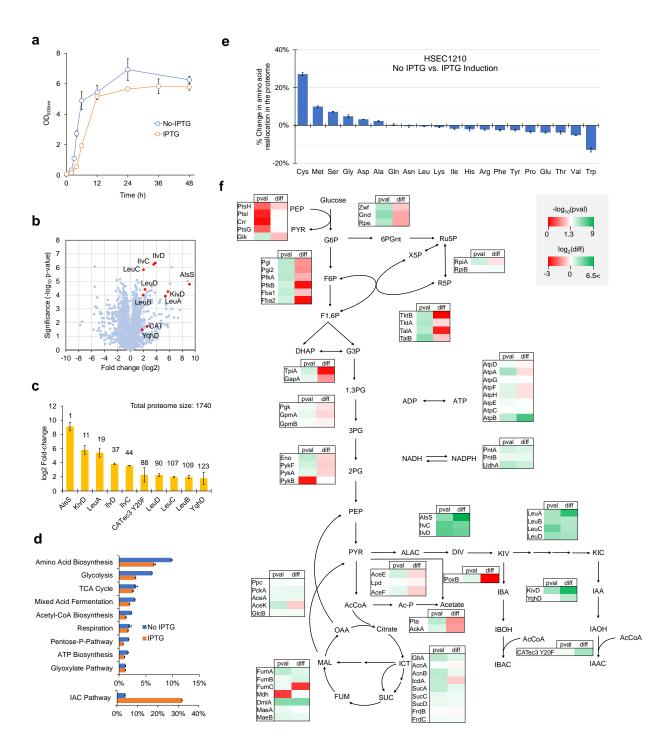
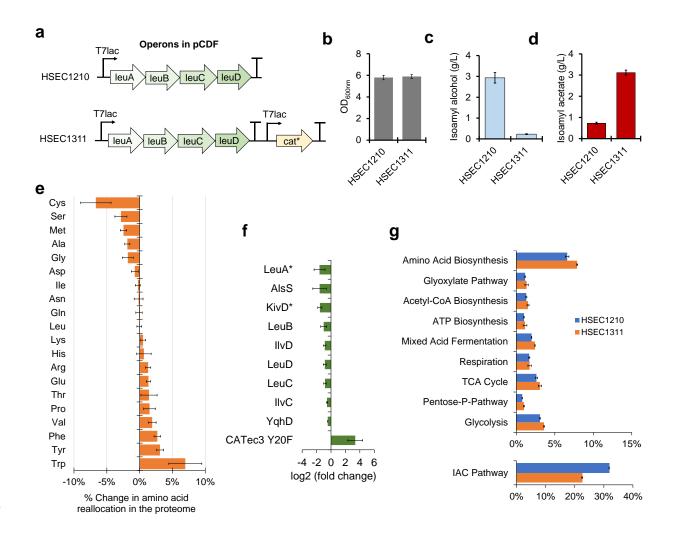
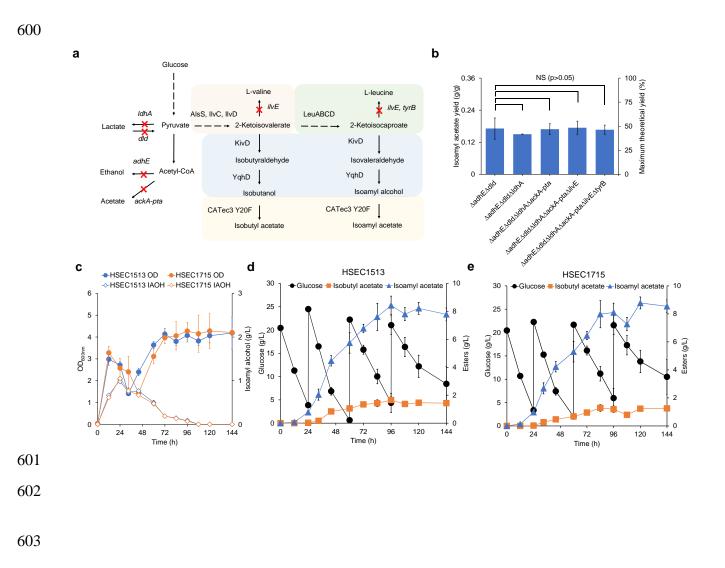


Figure 4



599 **Figure 5**



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