1 Reconstitution of ribosome self-replication outside a living cell

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19 Summary

Ribosome biogenesis, a recursive process of pre-existing ribosomes self-replicating 20 21 nascent ones, is pivotal in the self-replication of life. In Escherichia coli, three ribosomal RNAs (rRNAs) are transcribed, and 54 ribosomal proteins (r-proteins) 22 are synthesized by pre-existing ribosomes as structural components^{1,2}. They are 23 cotranscriptionally assembled in a cooperative hierarchy under the support of 24 ~100 accessory factors¹⁻³. The reconstitution of ribosome biogenesis outside a 25 26 living cell is an essential goal to understand the self-replication of life. However, this goal could not have been achieved so far due to its complexity. Here, we report 27 the successful *in vitro* reconstitution of the entire ribosome biogenesis process. We 28 hypothesized that mimicking *in vivo* ribosome biogenesis¹⁻⁶ could result in *in vitro* 29 30 ribosome biogenesis. Specifically, we found that coactivating the transcription of 31 an rRNA operon, as well as the transcription and translation of 54 r-protein genes the coordinated 32 encoding r-proteins, and ribosomal assembly in a cytoplasm-mimicking reaction solution, resulted in highly efficient *in vitro* 33 34 reconstitution of ribosome biogenesis. Our achievement represents a critical step toward revealing fundamental principles underlying the self-replication of life and 35 creating self-replicating artificial cells⁷. We also succeeded in engineering rRNA 36 and r-proteins by only adding mutant ribosomal genes in the reaction, enabling 37 38 high-throughput and unconstrained creation of artificial ribosomes with altered or enhanced functionality⁸⁻¹². 39

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41 **Main**

Ribosome biogenesis is a recursive process in which ribosomes, the universal decoders 42 43 of the genetic code, are self-replicated by pre-existing ribosomes. This process is pivotal in the self-replication of life and is universally conserved across living organisms. In 44 Escherichia coli, three rRNAs (16S, 23S, and 5S) are transcribed by the RNA 45 polymerase enzyme and 54 r-proteins are synthesized by pre-existing ribosomes as 46 structural components^{1,2}. They are cotranscriptionally assembled in a cooperative 47 hierarchy through multiple parallel assembly pathways^{13–22}. The assembly process is 48 supported, modified, and modulated by ~100 accessory factors^{1,2}. All these steps 49 concurrently occur in the cytoplasmic space in a highly coordinated manner, resulting in 50 the synthesis of the 2.5-MDa 70S ribosome, consisting of the 30S small and 50S large 51 subunits (SSU and LSU, respectively), in a few minutes²³. The SSU and LSU are 52 essential for translation and contain the decoding and the peptidyl transferase center, 53 respectively. Ribosomes play multifaceted roles in healthy cells, and ribosome 54 biogenesis dysregulation leads to the development of various aberrant states such as cell 55 death and cancer²⁴. 56

Reconstituting ribosome biogenesis outside a living cell is an essential goal in 57 biology to understand the self-replication of life. Intensive scientific efforts have been 58 invested in achieving this goal for decades. Ribosome assembly mapping revealed 59 assembly order and intermediates, as well as thermodynamic and kinetic parameters^{25–27}. 60 61 The *in vitro* integrated synthesis, assembly, and translation (iSAT) realized the coupling of rRNA synthesis and ribosome assembly using purified r-proteins^{4,5,28,29}. These efforts 62 in nonautonomous ribosome assembly with purified r-proteins encouraged attempts to 63 reconstitute ribosome biogenesis in vitro. A study describes an attempt to cogenerate 64

r-proteins from DNA templates in an *in vitro* one-pot reaction³⁰. Another study 65 conducted simultaneous expression of SSU structural components and certain accessory 66 factors on a chip in an attempt to reconstitute SSU biogenesis³¹. The latter study 67 reproduced hallmarks of SSU biogenesis on a chip; however, nascent SSU activity as 68 the decoding center was not confirmed³¹. To the best of our knowledge, reconstitution 69 of LSU biogenesis, a far more complex process than SSU biogenesis², has not even 70 71 been attempted yet. Hence, a big leap needs to be made forward to reconstitute 72 ribosome biogenesis in vitro.

73 In this study, we report the first successful *in vitro* reconstitution of the entire ribosome biogenesis process in E. coli. We hypothesized that mimicking the in vivo 74 ribosome biogenesis process^{1,2,4,5} and cytoplasmic chemical conditions^{4,6} could result in 75 76 in vitro ribosome biogenesis. Specifically, our approach involved coactivating the 77 transcription of an operon encoding three rRNAs, the transcription and translation of 54 genes encoding r-proteins, and the coordinated assembly of ribosomes in an optimized 78 79 E. coli S150 cell extract, containing the ~100 accessory factors for ribosome biogenesis 80 and imitating cytoplasmic chemical conditions. To test our hypothesis, we developed a highly specific, sensitive reporter assay to detect the translational activity of nascent 81 ribosomes. The reporter assay allowed for the stepwise, combinatorial exploration of the 82 reaction conditions, leading us to successful reconstitution of the entire ribosome 83 84 biogenesis process in vitro, that is, autonomous self-replication of the 2.5-MDa 70S 85 ribosome by concurrent transcription, translation, processing, modification, modulation, and assembly in a single reaction space. The reconstituted in vitro ribosome biogenesis 86 87 allows us for more freedom in controlling the process of ribosome biogenesis. Therefore, this achievement would generate a widespread impact on understanding the 88

self-replication of life, elucidating the ribosome assembly process^{1,2}, revealing the
multifaceted roles of ribosome biogenesis in cell physiology²⁴, creating self-replicating
artificial cells⁷, and designing artificial ribosomes with altered or enhanced
functionalities^{8–12}.

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94 Development of a highly specific reporter assay for nascent ribosome detection

95 In an attempt to reconstitute ribosome biogenesis *in vitro*, a highly specific reporter 96 assay for detection of the nascent ribosome translational activity would be required as pre-existing and nascent ribosomes would coexist in a single reaction space. 97 Translational efficiency is mainly determined by the RNA-RNA base pairing between 98 99 the Shine–Dalgarno (SD) and anti-Shine–Dalgarno (ASD) sequences of mRNA and the 16S rRNA, respectively³². Therefore, generation of new SD and ASD leads to the 100 development of orthogonal translation systems^{33–36} useful for detecting nascent artificial 101 ribosomes (Fig. 1a). Among them, a two-sided orthogonal translation system would be 102 superior in specificity and sensitivity. A previous study described that certain pairs of 103 104 orthogonal SDs and ASDs (oSDs and oASDs, respectively) exhibit two-sided orthogonality in E. coli³⁴. However, whether any oSD·oASD pairs exhibit two-sided 105 orthogonality in vitro remains elusive²⁸. 106

We selected seven oSD·oASD pairs^{34–36} (named a, b, c, d, or1, or4, and j) as candidates to screen two-sided orthogonal translation systems available in *E. coli* cell extracts (**Supplementary Information 1**). First, we designed an experimental scheme to select oSDs that do not interact with native ribosomes in the cell extracts and designed fluorescent reporter constructs for each member of the selected candidate pairs (**Fig. 1b**). Either a WT-SD–sfGFP or an oSD–sfGFP reporter was mixed with two types

113 of cell extracts (sonicated S12 or French press S30) containing native ribosomes. We observed that six oSDs (b, c, d, or1, or4, and j) did not show any functional interaction 114 115 with the native ribosomes (Fig. 1c). Both cell extracts showed similar profiles; hence, we used the S12 extracts for the following screening processes due to their ease of 116 preparation. We thus further investigated the orthogonality of the top four oSDs (b, or1, 117 or4, and j) using LacZ reporters that were more sensitive than the GFP reporters, and 118 119 discovered that three oSDs (b, or1, and or4) displayed strong orthogonality against the 120 native ribosomes (Fig. 1d).

121 Next, we designed an experimental scheme to screen oSD·oASD pairs with 122 two-sided orthogonality in cell extracts (Fig. 1e). We prepared functional cell extracts using E. coli expressing an artificial rRNA operon with WT-ASD or oASD (b, or1, or 123 or4) and C1192U spectinomycin resistance (SpcR)³⁷ in the 16S rRNA (Extended Data 124 Fig. 1a). The cell extracts containing artificial ribosomes with b-, or 1-, or or 4-oASD did 125 not generate reporter signals when mixed with the WT-SD-LacZ reporter and 126 spectinomycin (Fig. 1f and Extended Data Fig. 1b). When mixed with the cognate 127 128 oSD-LacZ reporter and spectinomycin, the cell extract containing artificial ribosomes with or1-oASD generated a strong reporter signal (Fig. 1g). We verified in a follow-up 129 control experiment that the reporter signal certainly derived from the or1-oSD·oASD 130 pairing (Extended Data Fig. 1c). These results showed that the or1-oSD oASD pair 131 132 exhibited strong two-sided orthogonality in the cell extracts. We have not pursued the 133 reason why b- and or4-oSD oASD pairs were nonfunctional (Fig. 1g). A potential explanation is that our expression vectors did not allow the expression of the artificial 134 rRNAs with b- or or1-oASD in E. coli. 135

Encouraged by the success to develop the highly specific reporter assay, we 136 conducted a preliminary trial to reconstitute SSU biogenesis in vitro. We coactivated the 137 138 transcription of the artificial rRNA operon with or1-oASD and SpcR, the transcription and translation of 21 SSU r-protein genes, and the coordinated assembly in an 139 optimized S150 cell extract, containing the ~100 accessory factors for ribosome 140 biogenesis and imitating cytoplasmic chemical conditions. However, we observed no 141 142 nascent SSU-derived reporter signal (Extended Data Fig. 2), confirming the difficulty 143 to reconstitute such a complex process *in vitro*. Therefore, we conceived that a highly sensitive assay would also be required to detect the translational activity of nascent 144 ribosomes to explore the reaction conditions which would enable ribosome biogenesis 145 146 in vitro.

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148 Highly sensitive detection of the artificial ribosome translational activity

We devised a deep-leaning-assisted automated femtoliter droplet assay for sensitive, 149 scalable, and objective detection of the artificial ribosome translational activity. A 150 151 femtoliter droplet assay, in which a tiny amount of the reaction solution is confined to femtoliter droplets, allows for highly sensitive enzymatic activity detection³⁸ (Fig. 2a). 152 However, scalable and objective femtoliter droplet assay analysis is generally difficult 153 as the bright-field images of the droplets have an extremely low contrast, hampering 154 155 precise droplet segmentation. To address this problem, we developed a deep-learning-assisted automated analysis pipeline (Fig. 2b), using a trained U-Net³⁹ 156 deep-learning model to transform bright-field droplet images into binary segmented 157 images (droplet or background) with >90 % accuracy (Extended Data Fig. 3). We used 158

the binary segmented images to extract area, fluorescence intensity, and other features
 of each droplet by automated particle analysis using ImageJ⁴⁰.

161 Next, we evaluated the sensitivity of the deep-learning-assisted automated femtoliter droplet assay. We prepared two types of S12 cell extracts: one contained 162 native ribosomes and $4.9 \,\mu\text{M}$ of artificial ribosomes with or1-oASD and SpcR 163 (Extended Data Fig. 4), and the other was a control cell extract containing only native 164 165 ribosomes. We performed a control experiment by mixing the control cell extract with 166 the or1-oSD-LacZ reporter. Unexpectedly, we observed native ribosome-derived fluorescence (Extended Data Fig. 5a), not detected in the bulk assay (Fig. 1d), 167 indicating the high sensitivity of the femtoliter droplet assay. We observed that $100 \,\mu M$ 168 spectinomycin supplementation in the reaction solution enabled us to specifically detect 169 170 the artificial ribosome translational activity (Extended Data Fig. 5a and b). Then, to 171 evaluate the sensitivity of the assay, we diluted the cell extract containing the artificial 172 ribosomes using the control cell extract and mixed it with the or1-oSD-LacZ reporter and 100 µM spectinomycin. As a result, we successfully detected the translational 173 activity of the artificial ribosomes even at 49 pM (dilution ratio of 10^5) (Fig. 2c). Our 174 Poisson distribution-based calculation suggested that the assay enabled translational 175 activity detection down to the single ribosome level (Extended Data Fig. 6). 176

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178 Reconstitution of SSU biogenesis in vitro

We tackled again the reconstitution of SSU biogenesis *in vitro* using the two-sided orthogonal translation system and the deep-leaning-assisted automated femtoliter droplet assay. We hypothesized that mimicking *in vivo* ribosome biogenesis would result in *in vitro* ribosome biogenesis. Our experimental scheme was divided into two

sequential reactions (Fig. 3a). In the first reaction, we aimed at coactivating the 183 transcription of the artificial rRNA operon with or1-oASD and SpcR, the transcription 184 185 and translation of 21 SSU r-protein genes, and the coordinated assembly in an optimized S150 cell extract, containing the ~100 accessory factors for ribosome 186 biogenesis and imitating cytoplasmic chemical conditions. The second reaction was 187 designed for detecting nascent artificial SSU translational activity using the 188 189 or1-oSD-LacZ reporter. We observed no reporter signal during the initial trial for 190 reconstituting SSU biogenesis even using the deep-leaning-assisted automated 191 femtoliter droplet assay, confirming again the difficulty to reconstitute SSU biogenesis (Extended Data Fig. 7a). Then, we thoroughly explored the reaction conditions using a 192 simplex-lattice design and optimized the concentrations of the native ribosomes, the 193 194 artificial rRNA operon, and 21 SSU r-protein genes. We hypothesized that increasing ribosomal gene concentrations could be beneficial to reconstituting SSU biogenesis as 195 higher DNA concentrations usually produce robust expression profiles⁴¹ (Extended 196 197 **Data Fig. 4a**). However, contrary to our expectations, reducing their concentrations was 198 pivotal and led to slight reporter signal detection (Fig. 3b). We conducted a follow-up optimization and successfully optimized the reaction conditions that generated almost 199 saturated reporter signals in the femtoliter droplet assay (Fig. 3c and Extended Data 200 Fig. 7b). Using the optimized reaction condition, we detected a strong, reconstituted 201 202 SSU biogenesis-derived fluorescence signal even in the bulk assay (Fig. 3d). This 203 fluorescence signal was stronger than that derived from the nonautonomous iSAT 204 assembly, suggesting that the autonomous *in vitro* ribosome self-replication is highly efficient. 205

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207 Reconstitution of LSU biogenesis in vitro

We moved ahead to reconstitute LSU biogenesis in vitro. Our experimental scheme was 208 209 similar to that for SSU (Fig. 4a). The first reaction consisted of coactivating the transcription of an artificial rRNA operon with A2058U clindamycin resistance 210 (CldR)⁴² in the 23S rRNA, the transcription and translation of 33 LSU r-protein genes, 211 and the coordinated assembly in the optimized S150 cell extract. The second reaction 212 213 was designed for detecting nascent artificial LSU translational activity using the WT-SD-LacZ reporter in the presence of 1.5 mM clindamycin. We expected that 214 detection of the nascent artificial LSU translational activity would be difficult for three 215 reasons: 1) LSU biogenesis is far more complex than SSU biogenesis²; 2) the two-sided 216 orthogonal translation system is not available as the nascent artificial LSU requires 217 218 native SSU for translation, the nascent artificial LSU could thus translate both LacZ and 33 LSU r-proteins; 3) ribosomes with the A2058U CldR mutation retain only ~30 % of 219 their translational activity in the presence of clindamycin¹². Surprisingly, a simple 220 exploratory experiment based on the optimized reaction condition for the reconstituted 221 222 SSU biogenesis enabled us to detect significant fluorescence signals derived from the nascent artificial LSU (Fig. 4bc). As expected, the fluorescence signal obtained from 223 the reconstituted LSU biogenesis was lower than that from the reconstituted SSU 224 biogenesis (Fig. 3d and 4c). Using an improved LacZ reporter with a modified 5'UTR 225 226 sequence, we successfully enhanced by 3.8-fold the nascent artificial LSU-derived fluorescence signal (Fig. 4d). 227

We tried to obtain further pieces of evidence that ensure the successful reconstitution of SSU and LSU biogenesis. We investigated r-protein production profiles using heavy L-arginine (${}^{13}C_6$, ${}^{15}N_4$) and L-lysine (${}^{13}C_6$, ${}^{15}N_2$) to label nascent

231 r-proteins during the reconstituted SSU and LSU biogenesis. Our mass spectrometric analyses revealed that nascent r-proteins derived from the plasmids encoding r-proteins 232 233 but not from residual E. coli chromosomal fragments or mRNAs in the S150 cell extracts (Extended Data Fig. 8a). Furthermore, we conducted a reconstitution 234 experiment using a mutant r-protein gene encoding uS12 K43T, which confers 235 streptomycin resistance (StrR) to ribosomes^{28,43}. We observed that the reporter signals 236 237 remained unaffected by streptomycin only when we used the mutant r-protein gene as a 238 starting material (Extended Data Fig. 8b). In addition, a previous study showed that most r-proteins do not exchange between ribosomes⁴⁴. Taken together, we concluded 239 that the nascent artificial ribosomes consisted of nascent rRNAs and r-proteins. 240

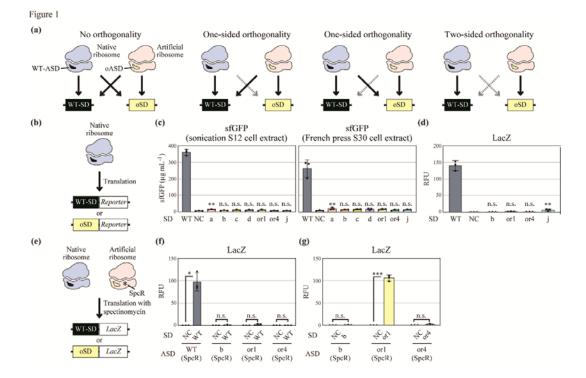
Finally, we investigated whether LSU and SSU could be reconstituted in a single reaction. We coactivated the transcription of an artificial rRNA operon with or1-oASD, SpcR in the 16S rRNA, and CldR in the 23S rRNA, and the production of 54 r-proteins in the optimized S150 cell extract (**Extended Data Fig. 9a**), leading to the successful reconstitution of both LSU and SSU biogenesis in a single reaction space (**Extended Data Fig. 9b**). Therefore, we finally succeeded in reconstituting the entire ribosome biogenesis process *in vitro*.

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249 Conclusions

In this study, we achieved the reconstitution of the entire ribosome self-replication process outside a living cell, which has been one of the largest long-standing challenges in synthetic biology. The reconstituted *in vitro* ribosome biogenesis would provide us with more freedom in controlling the process of ribosome biogenesis. Therefore, this achievement would pave the way to reveal fundamental principles underlying ribosome

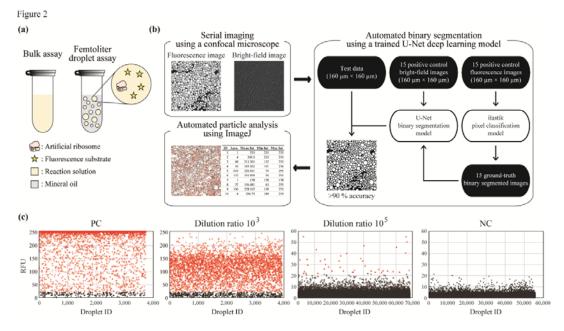
biogenesis and to elucidate the mechanisms of ribosomopathies²⁴. Furthermore, our 255 achievement brings the bottom-up creation of self-replicating artificial cells within 256 257 reach as life scientists now have successfully activated in vitro all the processes necessary for the autonomous central dogma, i.e., DNA replication^{45,46}, transcription⁴⁷, 258 translation^{48,49}, and in this study, ribosome biogenesis. Finally, the nature of our 259 platform (autonomous ribosome assembly in vitro from DNA and the lack of cell 260 261 viability constraints) opens new opportunities for the high-throughput and unconstrained creation of artificial ribosomes with altered or enhanced properties⁸⁻¹², 262 significantly expanding types of polymers available to humankind. 263

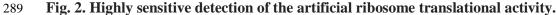


265 **Figures and figure legends**

266 Fig. 1. Screening orthogonal oSD·oASD pairs with two-sided orthogonality in vitro. (a) Four types of orthogonalities. Black and gray arrows indicate functional and 267 268 nonfunctional interactions, respectively. SD, Shine-Dalgarno sequence; ASD, anti-Shine–Dalgarno sequence; oSD, orthogonal SD; oASD, orthogonal ASD. (b) 269 Experimental scheme to screen oSDs that do not interact with native ribosomes in cell 270 271 extracts. (c) oSD selection. Either a WT-SD-sfGFP or an oSD-sfGFP reporter (named a, b, c, d, or1, or4, and j) was mixed with S12 or S30 cell extracts prepared using BL21 272 StarTM (DE3) *lacZ::kmr*. NC, negative control without a reporter. The data represent the 273 mean \pm SD (n = 3). **, p < 0.01; n.s., not significant; Dunnett's test against NC. (d) 274 Further oSD selection. Either a WT-SD-LacZ or an oSD-LacZ reporter (b, or1, or4, 275 and j) was mixed with S12 cell extracts. RFU, relative fluorescence unit; NC, negative 276 control without a reporter. The data represent the mean \pm SD (n = 3). **, p < 0.01; 277

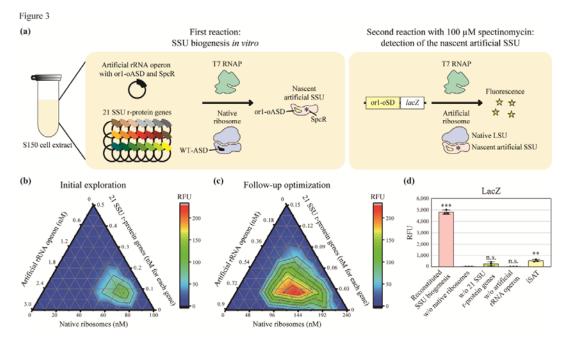
Dunnett's test against NC. (e) Experimental scheme to screen oSD oASD pairs with 278 two-sided orthogonality in cell extracts. Cell extracts were prepared using BL21 StarTM 279 280 (DE3) *lacZ::frt* expressing an artificial rRNA operon with WT-ASD or oASD (b, or1, or or4) and C1192U spectinomycin resistance (SpcR). (f) Screening oASDs that do not 281 interact with the WT-SD-LacZ reporter. The cell extracts were mixed with the 282 WT-SD-LacZ reporter and spectinomycin. NC, negative control without the reporter. 283 284 The data represent the mean \pm SD (n = 3). *, p < 0.05; Welch's *t*-test. (g) Screening 285 oSD oASD pairs with two-sided orthogonality. The cell extract was mixed with the cognate oSD-LacZ reporter and spectinomycin. NC, negative control without a reporter. 286 The data represent the mean \pm SD (n = 3). ***, p < 0.001; Welch's *t*-test. 287 288





290 (a) Comparison between a conventional bulk assay and a femtoliter droplet assay. (b) Deep-learning-assisted automated femtoliter droplet assay. After cell-free transcription 291 292 and translation in femtoliter droplets, bright-field and fluorescence images of the droplets are obtained using a confocal fluorescence microscope. The bright-field images 293 are binary segmented (droplet or background) using a trained U-Net deep-learning 294 295 model. The binary segmented images are obtained for particle analysis using ImageJ, and the results are redirected to corresponding fluorescence images. Finally, we obtain 296 the features of each droplet including area and relative fluorescence unit (RFU). (c) 297 298 Highly sensitive detection of the artificial ribosome translational activity. We prepared 299 two types of S12 cell extracts; one contained native ribosomes and 4.9 μ M of artificial ribosomes with or1-oASD and C1192U spectinomycin resistance (SpcR) and the other 300 only native ribosomes. The cell extract containing the artificial ribosomes was diluted 301 302 by the control cell extract at the indicated ratio. The cell-free transcription and 303 translation in femtoliter droplets were carried out in the presence of the or1-oSD-LacZ

304	reporter and 100 μM of spectinomycin. In the scatter plots, the vertical and the
305	horizontal axes indicate the mean RFU and the ID of each droplet, respectively.
306	Droplets over the threshold (the mean RFU \geq 22) are indicated in red. PC, positive
307	control without dilution; NC, negative control using only the control cell extract.
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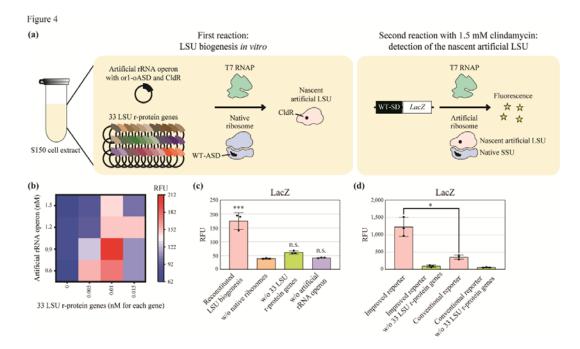


309 Fig. 3. Reconstitution of SSU biogenesis in vitro.

310 (a) Experimental scheme to reconstitute SSU biogenesis in vitro. (b) Exploring optimal conditions for the first reaction using a simplex-lattice design. The concentrations of the 311 native ribosomes, the artificial rRNA operon with or1-oASD and C1192U 312 spectinomycin resistance (SpcR), and 21 SSU r-protein genes were 0-100, 0-3, and 313 314 0-0.5 nM each, respectively. RFU, mean relative fluorescence unit of the fluorescent droplets. (c) Follow-up optimization of the first reaction. The concentrations of the 315 316 native ribosomes, the artificial rRNA operon, and 21 SSU r-protein genes were 0–240, 0-0.9, and 0-0.15 nM each, respectively. (d) Successful detection of the nascent 317 318 artificial SSU translational activity using the bulk assay under the optimized reaction condition. The concentrations of the native ribosomes, the artificial rRNA operon, and 319 21 SSU r-protein genes were 80, 0.3, and 0.05 nM each, respectively. RFU, relative 320 fluorescence unit. The data represent the mean \pm SD (n = 3). ***, p < 0.001; 321

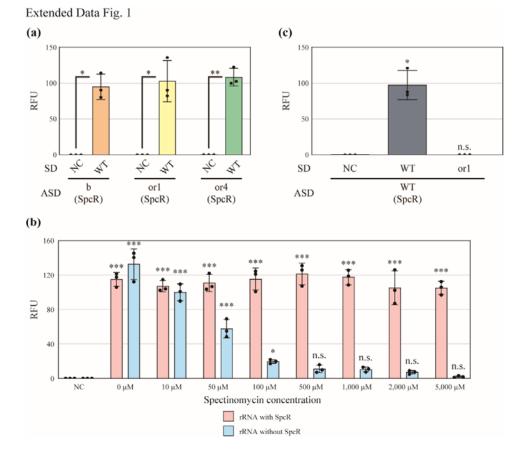
322 **, p < 0.01; n.s., not significant; Dunnett's test against the negative control without

323 native ribosomes.



325 Fig. 4. Reconstitution of LSU biogenesis in vitro.

(a) Experimental scheme to reconstitute LSU biogenesis in vitro. (b) Exploring optimal 326 conditions for the first reaction using the bulk assay. The concentrations of the native 327 328 ribosomes, artificial rRNA operon with A2058U clindamycin resistance (CldR), and 33 LSU r-protein genes were 80, 0.6–1.5, and 0–0.015 nM each, respectively. RFU, 329 relative fluorescence unit. (c) Reproducible detection of the nascent artificial LSU 330 translational activity under the optimized reaction condition. The concentrations of the 331 332 native ribosomes, the artificial rRNA operon, and 33 LSU r-protein genes were 80, 0.9, 333 and 0.01 nM each, respectively. The data represent the mean \pm SD (n = 3). ***, p < 0.001; n.s., not significant; Dunnett's test against the negative control without 334 native ribosomes. (d) Improvement of the nascent LSU-derived fluorescence signal 335 336 using an improved LacZ reporter with a modified 5'UTR sequence. The data represent the mean \pm SD (n = 3). *, p < 0.05; Welch's *t*-test. 337

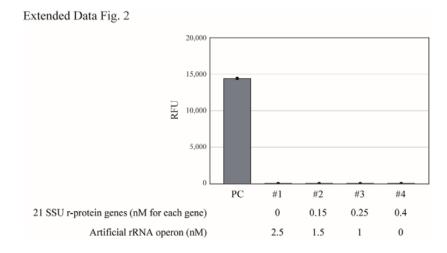


339 Extended data figures/tables

Extended Data Fig. 1. Supporting experiments for screening oSD·oASD pairs with
 two-sided orthogonality.

(a) Functional cell extract preparation. S12 Cell extracts were prepared using E. coli 342 expressing an artificial rRNA operon with oASD (b, or1, or or4) and C1192U 343 spectinomycin resistance (SpcR). The cell extracts were mixed with a WT-SD-LacZ 344 reporter. The cell extracts that generated strong fluorescence signals were considered 345 functional. RFU, relative fluorescence unit; NC, negative control without the reporter. 346 The data represent the mean \pm SD (n = 3). *, p < 0.05; **, p < 0.01; Welch's *t*-test. (b) 347 Optimizing spectinomycin concentrations. S12 cell extracts were prepared using BL21 348 StarTM (DE3) *lacZ::frt* expressing an rRNA operon with WT-ASD and/or SpcR. The 349

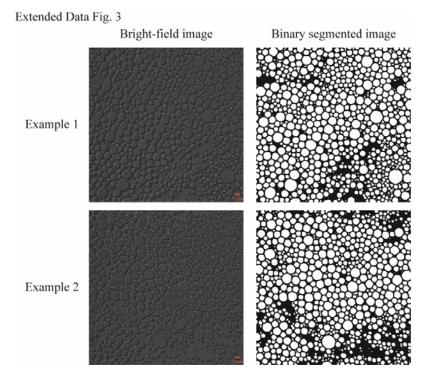
350 cell extracts were mixed with the WT-SD-LacZ reporter at various spectinomycin 351 concentrations. We concluded that 5 mM spectinomycin completely inactivated native 352 ribosomes but left the artificial ribosomes with SpcR unaffected. We used spectinomycin at 5 mM in the following experiments if not specified. NC, negative 353 control without the reporter. The data represent the mean \pm SD (n = 3). *, p < 0.05; 354 ***, p < 0.001; n.s., not significant; Dunnett's test against NC. (c) A follow-up control 355 356 experiment to verify two-sided orthogonality of the or1-oSD oASD pair. A cell extract 357 was prepared using E. coli expressing an artificial rRNA operon with WT-ASD and SpcR. The extract was mixed with the WT-SD-LacZ or the or1-oSD-LacZ reporter in 358 the presence of spectinomycin. The cell extract generated no fluorescence signal when 359 mixed with the or1-oSD-LacZ reporter, indicating that SpcR did not contribute to the 360 361 fluorescence signal observed in Fig. 1g. NC, negative control without a reporter. The data represent the mean \pm SD (n = 3). *, p < 0.05; n.s., not significant; Dunnett's test 362 against NC. 363



365 Extended Data Fig. 2. An initial trial to reconstitute SSU biogenesis.

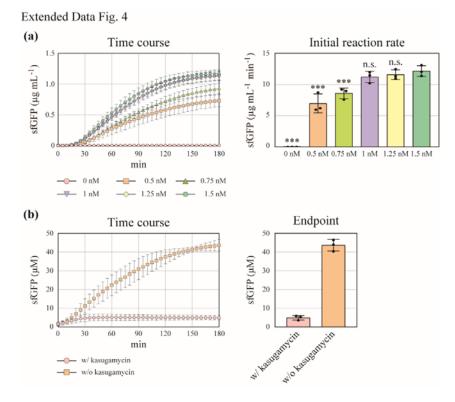
Experimental scheme to reconstitute SSU biogenesis in vitro is shown in Fig. 3a. 366 Briefly, the first reaction is designed for coactivating the transcription of the artificial 367 rRNA operon with or1-oASD and SpcR, the transcription and translation of 21 SSU 368 369 r-protein genes, and coordinated assembly in an optimized S150 cell extract, containing 370 the ~100 accessory factors for ribosome biogenesis and imitating cytoplasmic chemical 371 conditions. The second reaction aimed at detecting the translational activity of nascent artificial SSU using the or1-oSD-LacZ reporter. Exploring several reaction conditions 372 did not generate any fluorescence signals derived from nascent SSU. The concentrations 373 of the native ribosomes, the artificial rRNA operon with or1-oASD and C1192U 374 375 spectinomycin resistance (SpcR), and 21 SSU r-protein genes were 20, 0-2.5, and 0–0.4 nM each, respectively. RFU, relative fluorescence unit; PC, positive control using 376 377 native ribosomes and the WT-SD-LacZ reporter.

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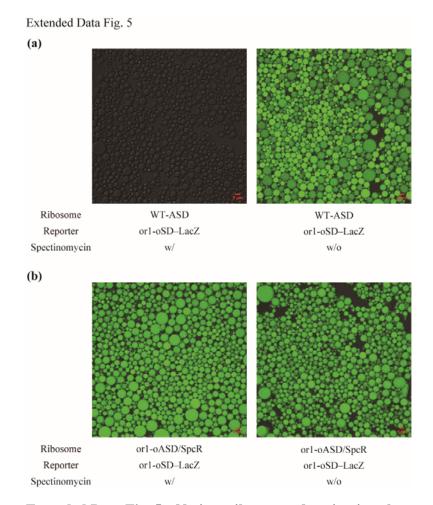
Extended Data Fig. 3. Binary segmentation by the trained U-Net deep-learning
 model.

Bright-field images of the droplets (left panels) were processed into binary segmented images (right panels; droplet or background) with >90 % accuracy (number of correctly classified pixels/total number of pixels) using the trained U-Net deep-learning model. In the right panels, white and black regions indicate the droplets and background, respectively. Scale bars = 5 μ m.



Extended Data Fig. 4. Estimation of the artificial ribosome concentration with
 or1-oASD and C1192U spectinomycin resistance (SpcR).

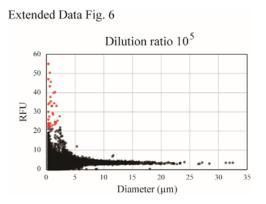
(a) Determining non-rate-limiting concentrations of the or1-oSD-sfGFP reporter. The 390 S12 cell extract was prepared using BL21 StarTM (DE3) lacZ::frt expressing the 391 392 artificial rRNA operon with or1-oASD and SpcR. The cell extract was mixed with spectinomycin and 0–1.5 nM of the or1-SD–sfGFP reporter. We found that transcription 393 394 was not rate-limiting when reporter concentrations were over 1 nM. The data represent the mean \pm SD (n = 3). ***, p < 0.001; n.s., not significant; Dunnett's test against 395 396 1.5 nM. (b) Quantification of the number of the artificial ribosomes with or1-oASD and SpcR. The cell extract was mixed with spectinomycin and 1 nM of the or1-oSD-sfGFP 397 reporter. In the presence of kasugamycin, the concentration of produced sfGFP equals 398 that of the artificial ribosomes. The estimated concentration of the artificial ribosomes 399 400 was 4.9 μ M. The data represent the mean \pm SD (n = 3).



Extended Data Fig. 5. Native ribosome deactivation by spectinomycin in the
 femtoliter droplet assay.

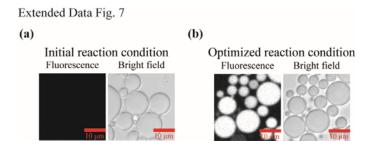
(a) Representative micrographs of droplets after the femtoliter droplet assay using 403 control S12 cell extracts containing only native ribosomes. The concentration of the 404 405 or1-oSD-LacZ reporter was 5 nM. The droplets emitted strong fluorescence without spectinomycin as the femtoliter droplet assay is so sensitive that a very weak interaction 406 407 between the native ribosomes and the or1-oSD-LacZ reporter could be detected. The 408 addition of $100 \,\mu$ M spectromycin eliminated this nonspecific fluorescence signal. 409 Scale bars = 5 μ m. (b) Representative micrographs of droplets after the femtoliter droplet assay using S12 cell extracts containing artificial ribosomes with or1-oASD and 410

- 411 C1192U spectinomycin resistance (SpcR). The concentration of the or1-oSD-LacZ
- 412 reporter was 5 nM. The droplets emitted strong fluorescence with or without 100 μ M
- 413 spectinomycin. Scale bars = $5 \mu m$.
- 414



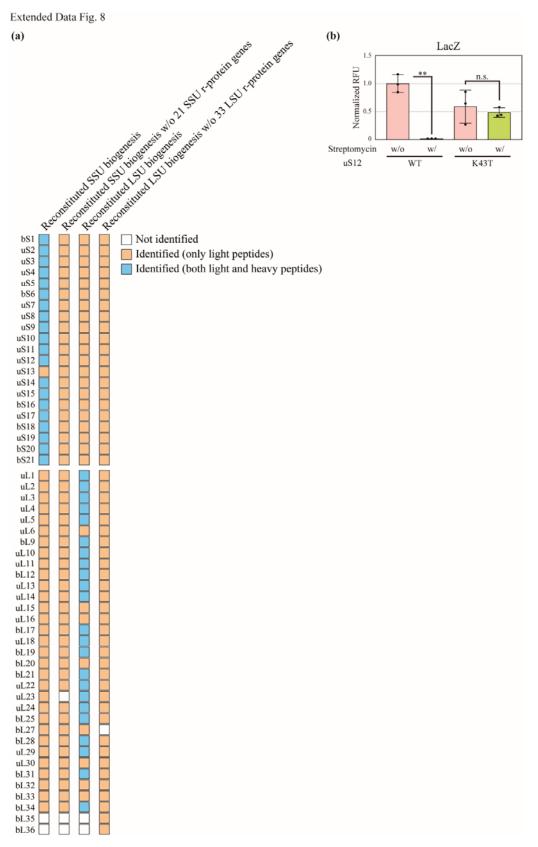
415 Extended Data Fig. 6. Single-ribosome-level detection of the artificial ribosome
416 translational activity.

417 Scatter plot of the mean relative fluorescence unit (RFU) against the diameter of each 418 droplet was generated using the dataset of **Fig. 2c**. Droplets over the threshold (the 419 mean RFU \geq 22) are shown in red. From the Poisson distribution formula, most of the 420 fluorescent droplets (89 %) were estimated to contain only one artificial ribosome.



422 Extended Data Fig. 7. Representative images of the femtoliter droplet assay.

(a) A representative micrograph of droplets in the initial trial. In the first reaction, the concentrations of the native ribosomes, the artificial rRNA operon with or1-oASD and C1192U spectinomycin resistance (SpcR), and 21 SSU r-protein genes were 20, 1, and 0.25 nM each, respectively. Scale bars = $10 \mu m$. (b) A representative micrograph of droplets in the optimized reaction condition. The concentrations of the native ribosomes, the artificial rRNA operon, and 21 SSU r-protein genes were 80, 0.3, and 0.05 nM each, respectively. Scale bars = $10 \mu m$.



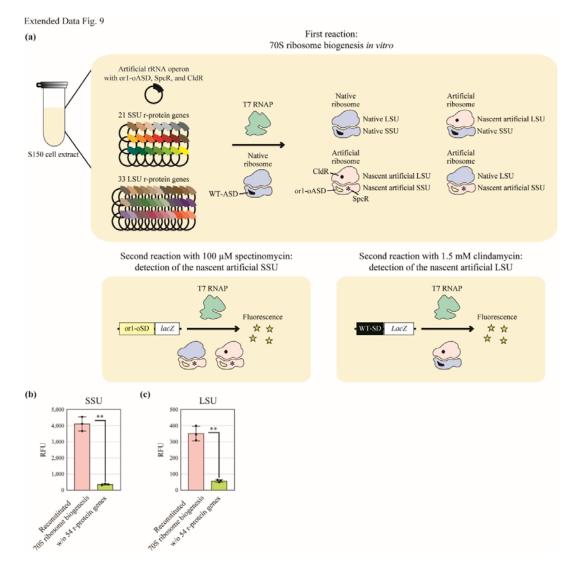
432 Extended Data Fig. 8. Supporting pieces of evidence for the *in vitro* SSU and LSU

(a) Detection of pre-existing and nascent r-proteins. We replaced unlabeled (light) 434 L-arginine and L-lysine with stable isotope-labeled (heavy) L-arginine $({}^{13}C_6, {}^{15}N_4)$ and 435 L-lysine $({}^{13}C_6, {}^{15}N_2)$ to label nascent r-proteins in the reaction solutions during the 436 reconstituted SSU or LSU biogenesis (Fig. 3 and 4). As negative controls, we omitted 437 438 the r-protein genes from the reaction solutions. Certain r-proteins were not identified 439 (e.g., bL35 and bL36 in the reconstituted SSU biogenesis) because r-proteins are very small and difficult targets for proteomics. The heavy peptides of certain r-proteins were 440 not identified (e.g., uS13 in the reconstituted SSU biogenesis); the absence of heavy 441 peptides does not mean the absence of nascent proteins because of the stochastic nature 442 443 of the protein identification algorithm. (b) Direct evidence for the incorporation of newly synthesized r-proteins into nascent ribosomes. The concentrations of the native 444 ribosomes, the artificial rRNA operon with or1-oASD and C1192U spectinomycin 445 resistance (SpcR), and 21 SSU r-protein genes were 80, 0.3, and 0.05 nM each, 446 447 respectively. A mutant r-protein gene encoding uS12 K43T was used instead of an r-protein gene encoding native uS12. The uS12 K43T mutation confers streptomycin 448 resistance to SSU. The translational activity of the nascent artificial SSU was detected 449 using the or1-oSD-LacZ reporter in the presence of spectinomycin and streptomycin. 450 451 NC, negative control without 21 SSU r-protein genes. The data represent the normalized 452 relative fluorescence unit (RFU) in the bulk assay and are shown as the mean \pm SD (n = 3). **, p < 0.01; Welch's *t*-test. 453

454

biogenesis.

433



Extended Data Fig. 9. *In vitro* reconstitution of the entire ribosome biogenesis process in a single reaction.

(a) Experimental scheme to reconstitute both SSU and LSU biogenesis *in vitro* in a
single reaction. (b and c) Successful detection of the nascent artificial SSU and LSU
translational activity using the bulk assay under the optimized reaction condition. The
concentrations of the native ribosomes, artificial rRNA operon with or1-oASD, C1192U
spectinomycin resistance (SpcR), and A2058U clindamycin resistance (CldR), and 54

- 462 r-protein genes were 80, 0.9, and 0.01 nM each, respectively. The data represent the
- 463 mean \pm SD (n = 3). **, p < 0.01; Welch's *t*-test.

465 Methods

466 Strains and plasmids

The chromosomal *lacZ* gene of the BL21 StarTM (DE3) (Thermo Fisher Scientific, 467 Waltham, MA, USA) was disrupted by Red-mediated recombination⁵⁰. Briefly, pKD46 468 encoding phage λ -Red recombinase was transformed into the *E. coli* cells. The 469 transformants were grown in 50 mL of SOC medium with 100 µg/ml ampicillin 470 (Viccillin[®] for injection, Meiji Seika Pharma, Tokyo, Japan) and 10 mM 471 472 L-(+)-arabinose (Nacalai Tesque, Kyoto, Japan). The fragment of the kanamycin-resistance gene (kmr) was amplified using primers (H1P1 forward primer, 473 5'-474

GAAATTGTGAGCGGATAACAATTTCACACAGGAAACAGCTGTGTAGGCTGG 475 476 AGCTGCTTC-3', and P4H2 primer, reverse 5'-TTACGCGAAATACGGGCAGACATGGCCTGCCCGGTTATTAATTCCGGGGA 477 TCCGTCGACC-3') from pKD13, and introduced into the E. coli cells by 478 electroporation. The electroporated cells were grown on an LB agar plate with 50 µg/ml 479 of kanamycin monosulfate (Nacalai Tesque) to select Km^R transformants. The resulting 480 strain is described as BL21 StarTM (DE3) *lacZ::kmr*. The FLP helper plasmid, pCP20, 481 was transformed into the BL21 StarTM (DE3) *lacZ::kmr* to eliminate the *kmr* gene. As 482 pCP20 harbors a temperature-sensitive replicon and shows thermal induction of FLP 483 synthesis, the transformants were cultured nonselectively at 37 °C and tested for the loss 484 of antibiotic resistance. The resulting strain is described as BL21 StarTM (DE3) 485 lacZ::frt. 486

487 The *rrnB* rRNA operon was inserted into pET-41a(+). Genes encoding 54 488 r-proteins were cloned from the *E. coli* DH5 α genome. In this study, we included bS1 in

r-proteins, which works more as a translational factor than a structural component, because additional bS1 could improve protein yields^{51–54}. The expression of the genes encoding 54 r-proteins was regulated by the *pT7CONS*⁵⁵ and *EpsA20*⁵⁶ sequences, improving transcription and translation efficiencies. *pT7CONS* and *EpsA20* were also used to construct an improved LacZ reporter. Mutations in genes encoding rRNAs and r-proteins were introduced by mutagenic primer-based PCR.

495 The strains and plasmids used in this study are listed in **Supplementary**

496 Information 2.

497

498 Sonicated S12 cell extract preparation

Sonicated S12 cell extracts were prepared as previously described with some 499 modifications⁵⁷. Briefly, *E. coli* cells were grown in 200 mL of $2 \times$ YPTG medium at 500 501 37 °C and pelleted by centrifugation. The cell pellets were resuspended in buffer A. The 502 suspended cells were disrupted by a Q125 Sonicator (Qsonica, Newtown, CT, USA) at a frequency input of 20 kHz and amplitude of 50 %. The sonication energy input was 503 500 J for 1 mL cell suspension. The cell extract was centrifuged at 4 °C and 12,000 g 504 for 10 min, and the supernatant was collected. The obtained cell extract was 505 flash-frozen in liquid nitrogen and preserved at -80 °C until further use. 506

507

508 French press cell extract preparation

French press S30 cell extracts were prepared based on previous reports with some modifications^{4,5,58}. Briefly, *E. coli* cells were grown in 1 L of $2 \times$ YPTG medium at 37 °C and pelleted by centrifugation. The cell pellets were resuspended in buffer A (20 mM Tris-HCl, 100 mM NH₄Cl, 10 mM MgCl₂, 0.5 mM EDTA, and 2 mM DTT,

pH = 7.2). Halt Protease Inhibitor Cocktail (Thermo Fisher Scientific) and RNase 513 514 Inhibitor (QIAGEN) were added to the suspension. The cells were disrupted using an 515 EmulsiFlex-C5 homogenizer (Avestin, Ottawa, Canada) with a single pass at a pressure of 20,000 psi. RNase Inhibitor and DTT were added to the cell extracts followed by 516 centrifugation at $4 \,^{\circ}$ C, 30,000 g for 30 min twice. The collected supernatant was 517 dialyzed four times against the iSAT buffer (50 mM HEPES-KOH, 10 mM magnesium 518 519 glutamate, 200 mM potassium glutamate, 2 mM DTT, 1 mM spermidine, and 1 mM putrescine), imitating cytoplasmic chemical conditions⁵⁸. For clarification and 520 concentration, the cell extract was centrifuged at 4,000 g for 10 min in a Centriprep[®] 3K 521 device (EMD Millipore, Burlington, MA, USA). The obtained cell extract was 522 flash-frozen in liquid nitrogen and preserved at -80 °C until further use. 523

524 French press S150 cell extracts were prepared as previously described with some modifications^{4,5}. Briefly, BL21 Star[™] (DE3) *lacZ*::*frt* harboring pT7_WT-ASD_rRNA 525 was grown in 1 L of 2 \times YPTG medium with 50 µg/mL of kanamycin at 37 °C until the 526 **OD**₆₀₀ reached 0.5. The cells incubated with 0.1 527 were mM 528 isopropyl-β-D-thiogalactopyranoside (IPTG, Nacalai Tesque). Then, the cells were disrupted using an EmulsiFlex-C5 homogenizer (Avestin) with a single pass at a 529 pressure of 20,000 psi. The cell extracts were centrifuged at 30,000 g for 30 min at 4 °C. 530 The collected supernatants were centrifuged at 90,000 g for 21 h at 4 °C. The collected 531 532 supernatants were further centrifuged at 150,000 g for 3 h at 4 °C. Then, the collected 533 supernatants were dialyzed using the iSAT buffer. The cell extracts were concentrated using Amicon Ultra-15 3 kDa cutoff (Merck Millipore, Burlington, MA, USA). The 534 obtained cell extract was flash-frozen in liquid nitrogen and preserved at -80 °C until 535 536 further use.

537

538 Cell extract preparation containing ribosomes with artificial rRNAs

- A plasmid encoding an artificial rRNA operon was introduced into the BL21 StarTM (DE3) *lacZ::frt*. The transformant was grown in a $2 \times$ YPTG medium with 50 µg/mL of kanamycin at 37 °C until the OD₆₀₀ reached 0.7. The cultured cells were incubated with 0.1 mM IPTG (Nacalai Tesque) for 3 h. The cell extracts were prepared as described
- 544

543

above.

545 Cell-free transcription and translation (CF-TXTL)

CF-TXTL was performed according to a previous report with modifications⁴. E. coli 546 ribosomes were purchased from New England BioLabs (Ipswich, MA, USA). T7 RNA 547 548 polymerase (T7 RNAP, New England BioLabs) was added to a final concentration of 0.8 U/µL. T7 RNAP was not added when we used cell extracts derived from 549 IPTG-induced BL21 StarTM (DE3) or its derivative strains. The reporter plasmid 550 concentration was 1.5 nM. The sfGFP or LacZ reporter expression was induced by 551 552 IPTG at a final concentration of 2 mM. We used 5-chloromethylfluoresecein di-B-D-galactopyranoside (CMFDG; Invitrogen, Waltham, MA, USA) as a substrate of 553 LacZ at a final concentration of 33 µM. CF-TXTL was conducted using 15 µL reaction 554 solutions at 37 °C in a 96-well plate (polystyrene, solid bottom, half area, black-walled, 555 556 Greiner Bio-One International GmbH, Kremsmünster, Austria). The reporter signals were quantified using fluorescence microplate readers, Fluoroskan Ascent FLTM 557 (Thermo Fisher Scientific) or Infinite[®] 200 PRO (TECAN, Männedorf, Switzerland), at 558 $\lambda_{ex} = 485 \text{ nm}$ and $\lambda_{em} = 535 \text{ nm}$. For native ribosome deactivation, spectinomycin 559 (FUJIFILM Wako Pure Chemical Corporation, Osaka, Japan), streptomycin (FUJIFILM 560

Wako Pure Chemical Corporation), or clindamycin (Abcam, Cambridge, UK) were 561 used at final concentrations of 5 mM, $10 \mu g/mL$, or 1.5 mM, respectively. For the 562 ribosome concentration quantification, kasugamycin (FUJIFILM Wako Pure Chemical 563 Corporation) was added to 2 mM 15 min after the beginning of CF-TXTL as previously 564 reported⁵⁹. The fluorescence intensity was kinetically measured after adding 565 kasugamycin, and the background fluorescence intensity was subtracted. Kasugamycin 566 is an antibiotic originally isolated from *Streptomyces kasugaensis* that blocks translation 567 568 initiation by preventing the ribosomal subunit association. However, it did not affect translating or stalled 70S ribosomes^{60,61}. The constituents of the CF-TXTL reaction 569 solutions used in this study are summarized in Supplementary Information 3. 570

The *in vitro* reconstitution of SSU biogenesis was performed as follows. In the 571 572 first reaction, the CF-TXTL solutions based on the S150 cell extracts were mixed with the native ribosomes, the artificial rRNA operon with or1-oASD and C1192U SpcR, 573 574 and 21 SSU r-protein genes. We used S150 cell extracts to enable native ribosome concentration control. The solutions were incubated at 37 °C for 180 min. The reaction 575 576 conditions were optimized using a simple lattice design (Supplementary Information 4). In the second reaction, the resulting CF-TXTL solutions were mixed with 577 pT7_or1-oSD_LacZ, CMFDG, 100 µM spectinomycin, and an additional 15 µL of the 578 CF-TXTL solutions based on the S150 cell extracts. The fluorescence of the reaction 579 580 solutions was measured by a bulk assay or a femtoliter droplet assay. In the bulk assay, the reporter signals were kinetically measured at 37 °C using Infinite[®] 200 PRO 581 (TECAN) at $\lambda_{ex} = 485$ nm and $\lambda_{em} = 535$ nm. The femtoliter droplet assay was carried 582 583 out as described below.

37

The in vitro reconstitution of LSU biogenesis was performed as follows. In the 584 first reaction, the CF-TXTL solutions based on the S150 cell extracts were mixed with 585 586 the native ribosomes, the artificial rRNA operon with or1-oASD, SpcR, and A2058U CldR, and 33 LSU r-protein genes. The solutions were incubated at 37 °C for 180 min. 587 The reaction conditions were optimized by varying the concentrations of the artificial 588 rRNA operon and 33 LSU r-protein genes (Supplementary Information 4). In the 589 590 second reaction, the resulting CF-TXTL solutions were mixed with pT7_WT-SD_LacZ 591 or pT7PCONS EpsA20 WT-SD lacZ, CMFDG, clindamycin, and an additional 15 µL of the CF-TXTL solutions based on the S150 cell extracts. The fluorescence of the 592 reaction solutions was kinetically measured at 37 °C using Infinite[®] 200 PRO (TECAN) 593 594 at $\lambda_{ex} = 485$ nm and $\lambda_{em} = 535$ nm.

595 The invitro reconstitution of the entire ribosome biogenesis process was conducted according to the protocol described above with minor modifications. In the 596 597 first reaction, the concentrations of the native ribosomes, the artificial rRNA operon with or1-oASD, SpcR, and CldR, and 54 r-protein genes were 80, 0.9, and 0.01 nM 598 599 each, respectively. In the second reaction, pT7 or1-oSD LacZ and spectinomycin were used for the detection of the artificial SSU, 600 nascent and pT7PCONS_EpsA20_WT-SD_lacZ and clindamycin were used for the detection of the 601 nascent artificial LSU. The reaction solution fluorescence was kinetically measured at 602 37 °C using Infinite[®] 200 PRO (TECAN) at $\lambda_{ex} = 485$ nm and $\lambda_{em} = 535$ nm. 603

The iSAT assembly was performed according to previous reports^{4,5,58} with some modifications. Briefly, in the first reaction, the CF-TXTL solutions based on the S150 cell extracts were mixed with 100 nM total protein of 70S ribosome (TP70) and 0.3 nM of the artificial rRNA operon with or1-oASD and SpcR. The solutions were incubated at

608 37 °C for 180 min. In the second reaction, the resulting CF-TXTL solutions were mixed 609 with pT7_or1-oSD_LacZ, CMFDG, spectinomycin, and an additional 15 μL of the 610 CF-TXTL solutions based on the S150 cell extracts. The reaction solution fluorescence 611 was kinetically measured at 37 °C using Infinite[®] 200 PRO (TECAN) at $\lambda_{ex} = 485$ nm 612 and $\lambda_{em} = 535$ nm.

613 The parameter values described above were tuned experiment-dependently and 614 are specified in the figure legends.

615

616 Femtoliter droplet assay

An oil mixture was composed of light mineral oil (Sigma-Aldrich Corporation, St. 617 Louis, MO, USA), 4.5 % sorbitan monooleate (Nacalai Tesque), and 0.5 % Triton[®] 618 X-100 (Nacalai Tesque), as previously described^{62,63}. The CF-TXTL reaction solutions 619 were mixed with the oil mixture and tapped twenty times in microtubes (Maruemu 620 Corporations, Osaka, Japan). The emulsions were incubated at 37 °C. The bright-field 621 and fluorescence images of droplets were obtained using a confocal fluorescence 622 623 microscope LSM700 (Carl Zeiss AG, Oberkochen, Germany). The 488 nm laser was focused using an oil immersion objective (Plan-Apochromat 40×/1.4 Oil DIC M27, Carl 624 Zeiss AG) with immersion oil (ImmersolTM 518F, Carl Zeiss AG). 625

626

627 Deep-learning-assisted automated femtoliter droplet assay

It is a difficult task to extract features from a large number of droplets; hence, we devised a deep-leaning-assisted automated analysis pipeline for a scalable and objective femtoliter droplet assay. We aimed to develop an analysis pipeline enabling area and centroid extraction of each droplet from the bright-field images and the fluorescence

632 intensity of each droplet from the corresponding fluorescence images. In the beginning, we produced positive control fluorescent droplets using purified LacZ (FUJIFILM 633 634 Wako Pure Chemical Corporation) and CMFDG and generated 15 sets of bright-field and corresponding fluorescence images containing 27580 fluorescent droplets in total. 635 We trained an ilastik⁶⁴ pixel classification model and processed the positive control 636 fluorescence images into binary segmented images (droplet or background) as ground 637 truth. We used a convolutional neural network architecture called U-Net³⁹ to build a 638 binary segmentation model. We used the FastAI library⁶⁵ under an Anaconda virtual 639 environment (Python 3.7, torch==1.4.0+cpu, torchvision==0.5.0+cpu). The model was 640 trained using 13 sets of ground-truth binary segmented images and the corresponding 641 bright-field images, and the remaining two sets of images were used as test data. We 642 643 specified an encoder network, Resnet34, and a weight-decay of 1e-2. We searched for a fitting learning rate using the learn.lr_find() method, and picked a learning rate of 1e-4. 644 The model was trained using the fit_one_cycle() method for 20 epochs at slice(1e-4) 645 and pct_start=0.3. We unfroze all layers and searched for a learning rate again. The 646 647 whole model was trained using the fit one cycle() method for 100 epochs at slice(1e-4) and pct_start=0.3. As a result, the accuracy (number of correctly classified pixels/total 648 649 number of pixels) reached >90 % using the test data (Extended Data Fig. 3). The trained U-Net deep-learning model was used to process bright-field droplet images into 650 651 binary segmented images, in which white and black regions indicate the droplets and 652 background, respectively. The binary segmented images were provided for particle analysis using ImageJ, and the particle analysis results were redirected to corresponding 653 fluorescence images. Using the deep-learning-assisted automated analysis pipeline, we 654 could automatically obtain the area, mean fluorescence intensity, minimum fluorescence 655

intensity, maximum fluorescence intensity, integrated density, and centroid of each 656 droplet in a scalable and objective manner. The codes were described in 657 **Supplementary Information 5.** 658 659 Sensitivity calculation of the deep-learning-assisted automated femtoliter droplet 660 assav 661 We roughly estimated the sensitivity of our femtoliter droplet assay using the data at 662 49 pM artificial ribosomes (dilution ratio 10⁵) (Fig. 2c and Extended Data Fig. 6). In 663 this experiment, a droplet with a diameter of 1 µm was expected to contain an average 664 of 1.54×10^{-2} ribosomes. From the Poisson distribution formula, the probability that a 665 1-um droplet would contain k ribosomes was expressed as follows: 666

667

668
$$P(k, \lambda) = \frac{\lambda^k e^{-\lambda}}{k!},$$

669

where k is the number of ribosomes and λ is 1.54×10^{-2} . According to this formula, the ratios of droplets that contain zero, one, or two or more ribosomes were 0.9847, 0.0152, or 0.0001, respectively.

In the data at 49 pM artificial ribosomes (dilution ratio 10^5), we observed 15544 droplets with a diameter of 0.5–1.5 µm, and the number of fluorescent droplets among them was 17. The observed ratio of the fluorescent droplets was 0.0011. Taken together, most of the fluorescent droplets (89%) were estimated to contain only a single artificial ribosome.

678

679 Mass spectrometric analysis

The proteomic analysis was carried out as previously described with modifications⁶⁶. 680 Briefly, the CF-TXTL reaction solutions were reduced by 50 mM dithiothreitol and 681 modified with 50 mM iodoacetamide. For stable isotope labeling⁶⁷, we used CF-TXTL 682 reaction solutions with 20 amino acid mixtures containing stable isotope-labeled 683 (heavy) L-arginine (${}^{13}C_6$, ${}^{15}N_4$) and L-lysine (${}^{13}C_6$, ${}^{15}N_2$) (Thermo Fisher Scientific) 684 instead of unlabeled (light) L-arginine and L-lysine. The proteins were digested with 685 sequencing-grade modified trypsin (Promega Corporation, Madison, WI, USA). The 686 peptides were analyzed using a nano LC-MS system (UltiMateTM 3000 RSLCnano and 687 ExplorisTM 240) Orbitrap equipped with UHPLC an Aurora column 688 (AUR2-25075C18A; IonOpticks, Fitzroy, Australia). A gradient was produced by 689 changing the mixing ratio of the two eluents: A, 0.1 % (v/v) formic acid and B, 690 691 acetonitrile. The gradient started with 5 % B with a 10-min hold, was then increased to 45 % B for 60 min, and finally increased to 95 % B for a 10-min hold, following which 692 the mobile phase was immediately adjusted to its initial composition and held for 693 10 min to re-equilibrate the column. The autosampler and column oven were maintained 694 695 at 4 °C and 40 °C, respectively. The separated peptides were detected on the MS with a full-scan range of 300–2000 m/z (resolution of 240,000) in the positive mode followed 696 by data-dependent MS/MS scans (resolution of 15,000). The method was set to 697 automatically analyze the top 20 most intense ions observed in the MS scan. The ESI 698 699 voltage, dynamic exclusion, ion-transfer tube temperature, and normalized collision energy were 2 kV, 30 s, 275 °C, and 30 %, respectively. The mass spectrometry data 700 were analyzed using Proteome Discoverer 2.5 (Thermo Fisher Scientific). The protein 701 identification was performed using Sequest HT against the protein database of E. coli 702 DH5 α (accession number PRJNA429943) with a precursor mass tolerance of 10 ppm, a 703

fragment ion mass tolerance of 0.02 Da, and strict specificity allowing for up to 2 missed cleavage. Cysteine carbamidomethylation was set as a fixed modification. L-arginine (${}^{13}C_6$, ${}^{15}N_4$), L-lysine (${}^{13}C_6$, ${}^{15}N_2$), methionine oxidation, N-terminus acetylation, and N-terminal methionine loss were set as dynamic modifications. The data were then filtered at a q-value ≤ 0.01 corresponding to a 1 % false discovery rate on a spectral level.

710

711 Data and code availability

MS data generated in this study are available in the jPOST repository⁶⁸ (jPOST ID JPST001809). The source data are shown in **Supplementary Information 4**. The codes used in the study are shown in **Supplementary Information 5**. The other datasets generated during the current study are available from the corresponding author.

716

717 Acknowledgments

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727 Author contributions

W.A. conceived the project. Y.K., Y.M., and W.A. designed the research; Y.K., Y.M.,
and W.A. acquired and analyzed the data; S.A. contributed to mass spectrometric
analysis; Y.K., Y.M., and M.M. contributed to the preparation of cell extracts; M.F.
contributed to developing the droplet assay; M.U. advised the research. The manuscript
was prepared by Y.K., Y.M., and W.A. and edited by all coauthors.

733

734 Competing interest declaration

Kyoto University have filed a patent application on *in vitro* ribosome biogenesis (by
Y.K. and W.A.). The competing interest do not alter our adherence to the journal
policies on sharing data and materials. The other authors declare no competing interests.

739 Additional information

740 Supplementary information

- 741 Supplementary Information 1. oSD·oASD pairs used in this study
- 742 Supplementary Information 2. Strains and plasmids used in this study
- 743 Supplementary Information 3. Reaction solution constituents for CF-TXTL
- 744 Supplementary Information 4. Source data
- 745 Supplementary Information 5. Codes for U-Net deep-learning and ImageJ analysis

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- 751

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