

# Flow Cytometric Single-Cell Analysis for Quantitative in Vivo Detection of Protein–Protein Interactions via Relative Reporter Protein Expression Measurement

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1	Flow Cytometric Single-Cell Analysis for Quantitative in
2	Vivo Detection of Protein–Protein Interactions via Relative
3	<b>Reporter Protein Expression Measurement.</b>

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16	
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19

#### 20 Abstract:

Cell-based two-hybrid assays have been key players in identifying pairwise 21 interactions, yet quantitative measurement of protein-protein interactions in vivo 22 remains challenging. Here, we show that using relative reporter protein expression 23 (RRPE), defined as the level of reporter expression normalized to that of the 24 interacting protein measured in single cell, quantitative analysis of protein interactions 25 in bacterial adenylate cyclase two-hybrid (BACTH) system can be achieved. A 26 multicolor flow cytometer was used to measure simultanously the expression levels of 27 28 one of the two putative interacting proteins and the  $\beta$ -galactosidase ( $\beta$ -gal) reporter protein upon dual immunofluorescence staining. Single cell analysis revealed that for 29 every bacterial culture co-transformed with the two-hybrid plasmids, there exist two 30 31 cell populations with or without the expression of interacting protein and reporter protein. Using Pal and TolB protein as the model of an interacting bait and pray pair, 32 the RRPE was found to be constant regardless of the inoculation colonies and the 33 cultivation time. Decreased RRPE was detected for TolB mutants with two 34 N-terminal truncations (TolB  $\Delta^{22-25}$  or TolB  $\Delta^{22-33}$ ), suggesting that the RRPE was an 35 intrinsic characteristic associated with the binding strength between the two 36 interacting proteins. This hypothesis was verified with acid base coiled coils formed 37 by two  $\alpha$ -helices of various binding affinities, for which the measured RRPE 38 progressively decreased as the affinity decreased. Several useful applications of our 39 RRPE-BATCH method can be expected for the quantitative detection, strength 40 comparison, and affinity ranking of pairs of interacting proteins. 41

42 Keywords: protein-protein interaction, yeast two-hybrid system, bacterial two-hybrid
43 system, flow cytometry, binding affinity

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### 45 Significance Statement

Assessing the intrinsic affinities for interacting proteins is of fundamental importance 46 to explore and understand protein-protein interactions. Using a bacterial two-hybrid 47 system (the BACTH system), we developed a quantitative method for the detection 48 and affinity ranking of protein-protein interactions. By measuring the expression level 49 of both the reporter protein and interacting protein at the single-cell level via 50 immunofluorescent staining and flow cytometry, we found that the relative reporter 51 protein expression (RRPE) is characteristic of the interacting protein pair and 52 correlates with their binding affinity. This method can provide an efficient tool in 53 prioritizing a large number of putative interacting proteins for following analyses. 54

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**P**rotein-protein interactions are involved in virtually every cellular process, and their 56 study is crucial in revealing protein functions, deciphering protein interaction 57 networks, and identifying novel therapeutic targets (1, 2). Among numerous 58 methodologies developed for protein interaction study, the yeast two-hybrid (Y2H) 59 system is the most commonly used binary method for measuring direct physical 60 interactions between two proteins, and has been estimated to account for over 50% of 61 protein-protein interactions described in PubMed (3-5). This powerful in vivo 62 approach interrogates two proteins, called bait and prey, one fused to a DNA-binding 63 domain and the other fused to a transcriptional activation domain of a transcription 64 factor and expressed in yeast. If the two proteins interact in the system, they 65 reconstitute a functional transcription factor that induces the transcription of a reporter 66 67 gene, whose output can be measured as growth of yeast colonies on selective medium or as blue coloration in a  $\beta$ -galactosidase ( $\beta$ -gal) assay. Although the Y2H system has 68 made significant contribution to the discovery of protein-protein interactions and the 69 interactome networks (6-8), both the false positive and false negative rates are 70 relatively high, and all the interactions are forced to occur in the yeast nucleus and are 71 thus not suitable for protein interaction involving membrane proteins and cytosolic 72 proteins (7, 9). 73

To overcome the limitations of Y2H system, a bacterial equivalent of the two-hybrid system was developed based on functional complementation of the catalytic domain of *Bordetella pertussis* adenylate cyclase (BACTH) (10, 11). This leads to cAMP synthesis, which in turn, triggers the expression of several resident genes such as the lactose or maltose operons. Particularly, this technique enabled the study of membrane proteins because cAMP is a diffusible molecule and the BACTH system does not require the hybrid proteins to be located in the nucleus as that of Y2H (12). However, the BACTH system as well as the Y2H system is not suitable for the quantitative measurement of pairwise protein interactions due to the lack of understanding of how the strength of the interactions correlate with the level of reconstituted reporters (13).

Flow cytometry is a well-established tool for the rapid, quantitative, and 85 86 multiparameter analysis of single cells. Employing a codon-optimized yeast enhanced green fluorescent protein (yEGFP) as the reporter, Chen et al. developed a high 87 throughput approach to study protein-protein interactions inside the cell via flow 88 89 cytometric measurement (14). Through the development of a yeast surface two-hybrid (YS2H) system, Hu et al. reported quantitative flow cytometric measurement of 90 protein-protein interactions via the secretory pathway (13). On the other hand, 91 anchored periplasmic expression (APEx) bacterial two-hybrid system has been 92 developed for the study of protein pairs on the basis of affinity or expression (15, 16). 93 In both the YS2H and the APEx two-hybrid systems, the bait protein has to be 94 produced at the surface of the cell, and the tag-fused prey protein has to be secreted in 95 solution. Then, the strength of bait-pray interaction can be measured via antibody 96 binding to the epitope tag appended to the prey protein. Compared to the surface 97 bacterial two-hybrid system, the classic BACTH system is a well-established and 98 much simpler approach for protein-protein interaction studies (10, 11). Particularly, 99

the signaling cascade in the BACTH system ensures higher sensitivity for the weak and transient interactions. Therefore, a quantitative approach for the BACTH system shall greatly advance the protein-protein interaction study due to the general applicability of the BACTH system and its sensitivity for low affinity interaction.

Herein, we demonstrate that through flow cytometric detection and 104 immunofluorescent staining, the relative reporter protein expression (RRPE), defined 105 as the normalized report protein expression to that of the interacting protein in a 106 single cell, can be used to quantitatively estimate the binding strength between two 107 interacting proteins in the classical BACTH system. This feature allowed us to 108 confirm interacting pairs of proteins, investigate determinant residues in 109 protein-protein interaction, and compare interaction strength of different pairs. The 110 RRPE-BACTH method described here provides a practical and powerful method for 111 the rapid and quantitative in vivo measurement of protein-protein interactions. 112

### **Results and Discussion**

Design of the BACTH System for Flow Cytometric Analysis. Scheme 1 illustrates 114 the experimental design of the flow cytometric BACTH system. Two compatible 115 plasmids carrying the hybrids with T25 and T18 domains respectively were 116 co-transformed into the reporter strain cya E. coli BTH101. Between T25 or T18 117 domain and the hybrid proteins, His and Flag tags were inserted respectively, and 118 were used to follow the expression of the hybrid proteins. The interaction of the 119 hybrid proteins results in a functional complementation between T25 and T18 120 fragments, which reconstitutes the activity of adenylate cyclase and leads to cAMP 121 6 / 26

synthesis. The produced cAMP interacts with the catabolite activator protein (CAP) 122 and the cAMP/CAP complex binds to the promoter and regulates the transcription of 123 *lacZ* gene coding for the  $\beta$ -galactosidase ( $\beta$ -gal) reporter expression.  $\beta$ -gal was 124 specifically labeled green with rabbit-anti-β-gal antibodies and FITC-conjugated goat 125 anti rabbit IgG. Meanwhile, anti-His/Flag mouse monoclonal antibody and DyLight 126 649-conjugated goat anti mouse IgG were used to label the hybrid proteins red. Upon 127 dual immunofluorescence labeling, the bacterial sample was analyzed by flow 128 cytometer. FITC and DyLight 649 fluorophores can be excited by the 488 nm and 640 129 nm lasers respectively, and the emitted green and red fluorescence signals were 130 detected concurrently on the FL1 and FL2 fluorescence channels. Therefore, for a 131 bacterial two hybrid sample, the expression level of both the  $\beta$ -gal reporter and the 132 hybrid proteins can be detected and quantified simultaneously. 133



Scheme 1. Depiction of protein-protein interaction study at the single-cell level based 135 on the BACTH system, dual immunofluorescent staining, and flow cytometric 136 analysis. 137

Flow Cytometric Detection of Protein-Protein Interaction by the BACTH System 138 via Immunofluorescent Staining of β-gal Reporter Protein. Pal and TolB, two 139 proteins involved in maintaining the integrity of bacterial outer membrane were 140 chosen as the protein-protein interaction model (17). In the BACTH system, both the 141 interacting proteins and reporter proteins are produced in the cytoplasm of bacteria, 142 and the antibodies need to traverse the bacterial cell wall and membrane for target 143 staining. Therefore, much efforts have been devoted to optimize 144 the immunofluorescence labeling procedures including fixation, permeabilization, and 145 staining (see Materials and Methods). After immunofluorescent staining of β-gal 146 reporter protein with FITC, the samples were analyzed on the flow cytometer. Fig. 1 147 shows the bivariate dot-plots of side scatter intensity versus FITC fluorescence 148 intensity obtained for *E. coli* BTH101 co-transformed with plasmids 149 pUT18C-linker/pKT25-linker (negative control, interaction), 150 no pUT18C-pal/pKT25-tolB (interacting proteins without additional tag), 151 and pUT18C-Flag-pal/pKT25-His-tolB (tagged interacting proteins), respectively. Two 152 distinct populations with different green fluorescence intensity were observed for 153 bacterial samples co-transformed with plasmids containing the interacting Pal/TolB 154 pair proteins regardless the presence of Flag/His tag or not (Fig. 1, B and C). A 155 discriminant line between these two populations was drawn on the FL1 channel for 156

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easy discrimination, defining two regions P1 and P2. For the negative control sample, 157 approximately 94.8% of the cells fall in the P1 region (Fig. 1A), whereas for cells 158 co-transformed with plasmids containing the interacting proteins with or without tags, 159 about 34.8% and 42.4% of the cells fall in the P2 region. The fluorescence 160 distribution histograms of these three samples are plotted in Fig. 1D. Comparable 161 median fluorescence intensities (MFI) for cells falling in the P1 region were observed 162 for all three samples, suggesting that for bacterial culture co-transformed with two 163 plasmids carrying Pal and TolB genes, there exists a large fraction of cells (about 40%) 164 165 in which the  $\beta$ -gal reporter protein cannot be detected. Meanwhile, events residing in the P2 region can be ascribed to cells that co-express Pal and TolB interacting 166 proteins inside a single cell which leads to the expression of  $\beta$ -gal reporter. Because 167 168 the interaction between Pal and TolB is robust and well characterized, the fraction of the cells that are similar to the negative control may be ascribed to the lack of 169 expression of either one or both of the interacting proteins. As plasmid loss is 170 excluded by the use of antibiotics in the culture media, this all-or-nothing 171 phenomenon can only be explained by the bistability in the lactose utilization network 172 of E. coli. In the BACTH system, the reporter gene and hybrid plasmids are both 173 regulated by the wild type Plac promoter (18). For cells falling in the P2 region, the 174 MFI are 3135 and 2539 for bacterial cultures transformed with interacting protein 175 genes without and with Flag/His tag, respectively, suggesting that tag insertion to the 176 C-terminal of the two proteins did not prevent the interaction. The observation of two 177 populations with completely different behaviors regarding reporter  $\beta$ -gal expression 178

highlights the importance and need of single-cell analysis for the BACTH system. In contrast to the ensemble-averaged measurement by spectrophotometers, flow cytometric analysis can reveal the inherent heterogeneity of bacterial populations in  $\beta$ -gal expression that will provide more insights into the BACTH system.



Fig. 1. Flow cytometric analysis of protein-protein interaction by the BACTH system 184 185 upon β-gal immunofluorescent staining. Bivariate dot-plots of side scatter intensity (SSC) versus FITC fluorescence intensity (FL) for E. coli BTH101 co-transformed with 186 plasmids of A) pUT18C-linker/pKT25-linker, B) pUT18C-pal/pKT25-tolB, and C) 187 pUT18C-Flag-pal/ pKT25-His-tolB, respectively. D) FITC green fluorescence 188 distribution histograms of  $\beta$ -gal for *E. coli* BTH101 with no interaction (red, case A), 189 190 with expression of interacting proteins (blue, case B), and with expression of tagged interacting (orange, case C). 191

Simultaneous Measurement of the Expression of Interacting Protein and Reporter Protein. In order to study the relationship between the expression of  $\beta$ -gal reporter protein and the expression of hybrid proteins, the Flag or His tag of one interacting protein and the  $\beta$ -gal reporter protein were immunofluorescently labeled with Dylight-649 and FITC, respectively. DyLight-649 was chosen to label the tag fragment because it can be efficiently excited by the 640 nm laser, which avoids

spectral cross-talk with FITC. The green and red fluorescence signals were detected 198 on the FL1 and FL2 channel, respectively. Figs. 2A and 2B show the bivariate 199 dot-plots of  $\beta$ -gal reporter protein versus TolB expression (via His tag labeling) or Pal 200 expression (via Flag tag labeling), respectively. Ouadrant gates were created for all 201 the samples. For the negative control with E. coli BTH101 co-transformed with 202 pUT18C-linker/pKT25-linker (no interacting protein expression), most cells (94.0%) 203 and 93.9%) fall into the Q4 region (Figs. 2A1 and 2B1) with negligible fluorescence 204 on both the green and red fluorescence channels. For E. coli BTH101 co-transformed 205 206 with plasmids encoding interacting proteins but without tags (pUT18C-pal/pKT25-tolB), 32.6% and 32.0% of the cells fall into the Q1 region due 207 to the expression of  $\beta$ -gal reporter protein. The two population phenomenon is similar 208 209 to the one observed in Fig. 1. For E. coli BTH101 co-transformed with plasmids encoding interacting proteins with tags (pUT18C-Flag-pal/pKT25-His-tolB), 53.6% 210 and 54.4% of the cell population resides in the Q4 region (neither the expression of 211  $\beta$ -gal nor the expression of interacting protein), while 42.5% and 41.2% of the cells 212 fall in the Q2 region indicating concurrent expression of the interacting proteins and 213 the  $\beta$ -gal reporter (Figs. 2A3 and 2B3). The similar ratios of Q2 reveal that only the 214 co-expression of the interacting proteins leads to the expression of the reporter gene. 215 Because expression of all of them are driven by cAMP in a positive feedback loop, 216 this establishes bistability. Clearly, using dual immunofluorescence staining, 217 simultaneous measurement of interacting protein expression and protein-protein 218 interaction (via reporter protein expression) can be successfully achieved at the 219

single-cell level using flow cytometry. It is worthy to note that although 220 pUT18C-Flag-pal and pKT25-His-tolB are two compatible plasmids, they have 221 distinct replication origins and different copy numbers (11). The plasmid of lower 222 copy number (pKT25-His-tolB) normally results in a lower level of protein expression, 223 which determines the rate of complex formation with its interacting protein partner. 224 Note that the same PMT voltage was used for the detection of His-tag and Flag-tag 225 signals, and the relatively higher signal for His tag is due to the higher affinity of 226 anti-his antibody. 227



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Fig. 2. Simultaneous measurement of the expression of interacting proteins and 229 230 reporter protein by flow cytometry. (A) Bivariate dot-plot of green fluorescence intensity (β-gal) versus red fluorescence intensity (His-tag) for E. coli BTH101 231 co-transformed with plasmids of A1) pUT18C/pKT25, A2) pUT18C-pal/pKT25-tolB, 232 and A3) pUT18C-Flag-pal/pKT25-His-tolB, respectively. (B) Bivariate dot-plot of 233 green fluorescence intensity ( $\beta$ -gal) versus red fluorescence intensity (Flag-tag) for E. 234 BTH101 co-transformed with plasmids of B1) pUT18C/pKT25, B2) 235 coli pUT18C-pal/pKT25-tolB, and B3) pUT18C-Flag-pal/pKT25-His-tolB, respectively. 236

Correlation between the Protein Interaction Strength and the Expression of 237 Interacting Proteins in a Single Cell. As illustrated in Figure 1, in the BACTH 238 system, expression of the  $\beta$ -gal reporter protein is regulated by the production of 239 cAMP and thus by the interaction of two hybrid proteins (10). We examined the 240 relationship between the  $\beta$ -gal reporter protein expression and His-TolB (the plasmid 241 with lower copy number in the cell) expression by flow cytometry. When the cultures 242 of E. coli BTH101 reached a sufficient cell density (OD ~1.5) after 12 h cultivation, 243 these co-transformed cultures were with plasmids of 244 245 pUT18C-Flag-pal/pKT25-His-tolB every two hours. Before immunofluorescent staining,  $\beta$ -gal activity of each sample was assayed by a classical Miller's protocol on 246 a spectrophotometer. Fig. 3A shows that  $\beta$ -gal activity increased from 375 at 12 h to 247 248 702 at 16 h and started to decrease slowly after then. Meanwhile, single cell measurements by flow cytometry indicate that with the increase of cultivation time 249 from 12 h to 20 h, the fraction of cells expressing  $\beta$ -gal and His-TolB (Fig. 3B) kept 250 increasing from 7.5% to 75.5%. In contrast, the MFIs of positive cells decreased from 251 14500 to 2508 for β-gal signal (Fig. 3B1) and from 4155 to 495 for His-TolB signal 252 (Fig. 3B2), respectively. This phenomenon could be explained by the dilution of the 253 proteins inside a single cell upon cell division (19). When we plotted the MFI of  $\beta$ -gal 254 versus that of His-TolB after background signal subtraction for each protein, i.e. 255 (MFI<sub>P-gal, P2</sub>-MFI<sub>P-gal, P1</sub>) versus (MFI<sub>His-TolB, P2</sub>-MFI<sub>His-TolB, P1</sub>), a linear correlation with 256  $R^2$  of 0.9995 was obtained (Fig. 3C), which suggests that in the BACTH system, 257 expression of the  $\beta$ -gal reporter protein is linearly proportional to the expression of 258



**Fig. 3.** Enzymatic and flow cytometric analysis of the reporter protein  $\beta$ -gal for *E. coli* BTH101 co-transformed with plasmids pUT18C-Flag-*pal/*pKT25-His-*tolB* at different cultivation time. A) Column chart of  $\beta$ -gal activity measured with a classical Miller's assay. B) Histograms of the fluorescence intensity distribution for  $\beta$ -gal and His-TolB measured by flow cytometry. C) The correlation curve between the median fluorescence intensities of  $\beta$ -gal and His-TolB after background subtraction.

The heterogeneity in the BACTH system has been well recognized because there 267 268 exist a big difference in plasmid copy number in different bacterial cells (11) and stochasticity inherent in the biochemical process of gene expression (20). In order to 269 validate the generality of this observation, we first examined the correlation between 270 the expression of  $\beta$ -gal reporter protein and interacting protein for different colonies 271 at the same cultivation time. Fifteen different colonies were randomly picked from the 272 E. culture plate of coli **BTH101** co-transformed with plasmids 273 pUT18C-Flag-pal/pKT25-His-tolB and inoculated in separate LB broth and cultivated 274 for 16 h. Fig. 4A shows the plot of  $\beta$ -gal expression versus that of interacting protein 275 His-TolB for different colonies, and a linear correlation was observed with  $R^2$  of 276 0.9789. These data along with those reported in Fig. 3 suggest that for an interacting 277 protein pair, there is an important heterogeneity in the expression of both the hybrid 278

and reporter proteins, but that the expression of  $\beta$ -gal reporter protein exhibits a linear 279 proportion to that of the hybrid proteins regardless of different cultivation time for a 280 single colony or different colonies at the same cultivation time. Clearly, these results 281 demonstrate that the expression of the  $\beta$ -gal reporter protein is not only affected by 282 the affinity of the interacting protein pair but also by the expression level of the 283 hybrid proteins. Therefore, we propose to use relative reporter protein expression 284 (RRPE), defined as the normalized  $\beta$ -gal expression to that of the interacting protein, 285 to estimate the interaction strength of protein pairs. As shown in Fig. 4B, the 286 287 measured RRPE (blue dots) for the Pal-TolB interaction pair exhibits a constant value, whereas the  $\beta$ -gal activity (red dots) is much more diverging among different 288 colonies. 289



290

291 **Fig. 4.** Flow cytometric analysis of the expression of  $\beta$ -gal reporter protein and interacting protein His-ToIB for bacterial samples inoculated with different single 292 colonies. A) The correlation curve between the median value of  $\beta$ -gal fluorescence 293 intensity and that of His-TolB. B) Plot of the relative reporter protein expression 294 (RRPE) versus β-gal activity for 15 bacterial cultures inoculated with different single 295 296 colonies randomly picked from the plate co-transformed with plasmids pUT18C-Flag-pal/pKT25-His-tolB. 297

Validation of the RRPE-BACTH Method for the Measurement of Protein 298 Interaction Strength. To investigate the potential of using RRPE-BACTH method 299 for evaluating the strength of protein-protein interactions, we compared the Pal-TolB 300 interaction by using two mutated forms of TolB along with the wild type TolB. These 301 two mutated TolB proteins bear truncations, one with four residues deleted from the 302 N-terminus (TolB  $\Delta^{22-25}$ ) and the other with the entire N-terminal sequence deleted 303 (TolB  $\Delta^{22-33}$ ), which lower the binding affinity to Pal (21). The dissociation constants 304  $K_D$  of these two truncated TolB proteins with Pal were reported to be 313 ± 15 nM 305 and 337 ± 18 nM, respectively, via ITC measurement at 30° C, which are about 306 tenfold higher than that of the wild type TolB ( $38 \pm 3$  nM). E. coli BTH101 cells were 307 co-transformed with pUT18C-Flag-pal/pKT25-His-tolB, 308 pUT18C-Flag-*pal*/pKT25-His-*tolB*  $\Delta^{22-25}$ , or pUT18C-Flag-pal/pKT25-His-*tolB*  $\Delta^{22-33}$ 309 plasmids and plated. Three individual colonies were picked and inoculated into LB 310 broth for each protein pair. These samples were immunofluorescence stained and 311 analyzed on the flow cytometer. Fig. 5A shows the representative bivariate dot-plots 312 of β-gal green fluorescence versus His-TolB red fluorescence and their fluorescence 313 distribution histograms for these three pairs. Fig. 5B indicates that the wild type TolB 314 exhibits the highest RRPE of 2.04 ± 0.21, and the mutated ToIB  $\Delta^{22-25}$  and ToIB  $\Delta^{22-33}$ 315 shared comparable RRPE values of  $0.88 \pm 0.07$  and  $0.91 \pm 0.06$ , respectively. Hence, 316 the RRPE value follows the change in binding affinity of the TolB/Pal interaction, 317 with larger RRPE corresponds to higher binding affinity in the BACTH system. 318 Therefore, RRPE may be used to assess the binding affinity of protein-protein 319



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Fig. 5. RRPE measurement for Pal interacting with TolB and the two TolB mutants by the BACTH system and flow cytometry. (A) The bivariate dot-plots of  $\beta$ -gal green fluorescence *versus* His-TolB red fluorescence and the fluorescence distribution histograms for wild type TolB and its two truncated forms: TolB  $\Delta^{22-25}$  and TolB  $\Delta^{22-33}$ . (B) Column chart of the RRPE for Pal interaction with TolB and the two truncated forms. The error bar represents the standard deviation of three replicates.

To further validate the applicability of the RRPE-BACTH method in affinity 328 assessment, five pairs of acid (En) and base (Kn)  $\alpha$ -helices with various heptad 329 repeats (n) that associate into coiled coils were constructed into the BACTH system 330 (Fig. 6A). E coil and K coil interacts through hydrophobic interaction at the interface 331 and electrostatic attraction between the oppositely charged residues from the helix, 332 and higher affinity is associated with longer helix (22). Among the five coiled-coils 333 chosen in the present study, the dissociation constants (K<sub>D</sub>) measured by surface 334 plasmon resonance (SPR) using a BIAcore were  $30000 \pm 3000$ ,  $7000 \pm 800$ ,  $116 \pm 8$ , 335  $14 \pm 1$ , and  $0.063 \pm 0.005$  nM for the interactions of E3-K3, E5-K3, E4-K4, E5-K4, 336

and E5-K5, respectively (22). E. coli BTH101 cells were co-transformed with 337 pUT18C-Flag-En/pKT25-His-Kn plasmids and plated. For each protein pair, three 338 individual colonies were picked and inoculated into LB broth separately. These 339 samples were immunofluorescence stained and analyzed on the flow cytometer. Fig. 340 6B shows the representative bivariate dot-plots of  $\beta$ -gal green fluorescence versus 341 His-Kn red fluorescence along with the fluorescence distribution histograms for these 342 five interaction pairs. The measured RRPE values were  $3.8 \pm 0.1$ ,  $6.4 \pm 0.5$ ,  $9.9 \pm 0.1$ , 343  $11.8 \pm 0.3$ , and  $5.9 \pm 0.6$  for E3-K3, E5-K3, E4-K4, E5-K4, and E5-K5, respectively. 344 345 It should be noted that taking advantage of high sensitivity of the RRPE-BATCH method, we can discriminate interactions with  $K_D$  lower than  $10^4$  nM. Fig. 6C shows 346 that the measured RRPE exhibited a strong correlation with the interaction affinity 347 from E3-K3 to E5-K4 except for E5-K5. This could be explained by the fact that 348 E5-K5 fits an interacting model with a relatively fast association and a very slow 349 dissociation, which is different from the other pairs (22). In contrast, in the BACTH 350 system, the synthesis of cAMP is irreversible and depends mainly on the rate at which 351 two coils associate (on-rate) to initiate complementation of T25 and T18. Because the 352 E5 coil was fused to T18 or T25 domain in the BATCH system, the on-rate of binding 353 with K5 could be reduced which leads to a lower binding affinity as demonstrated 354 with a decreased RRPE value (22). However, it needs to be pointed out that the 355 proposed RRPE method does not allow for the absolute quantification of protein 356 interaction affinity, because the BACTH system itself is an indirect method to detect 357 protein-protein interaction. Nonetheless, the good correlation between the measured 358

RRPE and the equilibrium dissociation constant reported in literature demonstrates that the method is useful in providing a relative ranking of interaction strength for protein variants in a given interacting pair of proteins.



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Fig. 6. RRPE measurement for five pairs of coiled coil interactions using the BACTH 363 system and flow cytometry. (A) A schematic (adapted from the Fig. 1 by De 364 Crescenzo et al. (22)) of the acid (En)-base (Kn) coiled coils interaction with n 365 indicating the number of heptad repeats. (B) The bivariate dot-plots of  $\beta$ -gal green 366 fluorescence versus His tag red fluorescence intensity for E. coli BTH101 cells 367 368 co-transformed with plasmids of pUT18C-Flag-*En*/pKT25-His-*Kn*. (C) The correlation of the RRPE values measured by flow cytometry for coiled coil interactions occurring 369 in the BACTH system with the affinity measured by SPR (22). The error bar 370 represents the standard deviation of three replicates. 371

## 372 Conclusion

We have developed a sensitive in vivo method for the quantitative measurement of 373 protein-protein interaction via the BACTH system and flow cytometry. Taking 374 375 advantage of the high-throughput and multiparameter measurement of single cell by flow cytometry, the expression of reporter protein and interacting proteins can be 376 simultaneously measured and correlated at the single-cell level. It was found out that 377 for the BATCH system, for a bacterial culture inoculated even with a single colony 378 co-transformed with two plasmids encoding each of the two interacting proteins, there 379 exist two populations and a large heterogeneity for each population in protein 380 381 expression and reporter protein production, which would otherwise be masked by the ensemble-averaged measurements. By measuring the expression level of interacting 382 protein and reporter protein for the population expressing  $\beta$ -gal, it was identified that 383 384 for an interacting protein pair, the value of RRPE is constant and is an intrinsic feature. Moreover, a good correlation of the RRPE with the binding affinity of protein 385 pair was observed for Pal-TolB interaction with WT and mutant TolB proteins and for 386 several coiled-coil interactions. The RRPE method proposed here can not only be 387 used to validate existing protein interaction and finding new ones, but also to rank the 388 strength of interaction. It may further be used for highthroughput study of the binding 389 site of protein-protein complexes, selection of high-affinity antibodies, and screening 390 of peptide inhibitor libraries. 391

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#### 393 Materials and Methods

**Reagents and Chemicals.** Rabbit anti-β-galactosidase IgG was purchased from

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Molecular Probes (Eugene, OR, USA). FITC-conjugated anti-His mouse monoclonal 395 antibody and goat anti-rabbit (GAR) IgG (H+L) were obtained from TransGen 396 Biotech (Beijing, China). DyLight-649-conjugated goat anti-mouse (GAM) IgG (H+L) 397 was purchased from EarthOx (San Francisco, CA, USA). Antibodies were diluted in 1% 398 fetal bovine serum (FBS) (obtained from Hyclone, Logan, Utah, USA) freshly 399 prepared in PBS before use. Enzymes used for molecular cloning were obtained from 400 Biotech (Dalian, China). Ortho-nitrophenyl- $\beta$ -galactoside (ONPG), 401 TaKaRa lysozyme, GTE (50 mM Glucose, 25 mM Tris, 10 mM EDTA, pH 8.0), and X-gal 402 403 were purchased from Sangon Biotech (Shanghai, China). Paraformaldehyde (PFA) stock solution (16%) was obtained from Alfa Aesar (Ward Hill, MA, USA). Other 404 reagents were purchased from Sinopharm Chemical Reagent (Shanghai, China). All 405 the buffers were filtered through a 0.22µm filter and used within three weeks. 406

Bacterial Strains and Plasmids. E. coli ER2738 was used for the cloning 407 experiments. The recombinant plasmids used in the present study are summarized in 408 Table S1 and were verified by sequencing. Oligonucleotides were synthesized by 409 Sangon Biotech and are listed in Table S2. Plasmid pKT25-His-tolB was constructed 410 by inserting the histidine tag (His-tag) into pEB362 at the PstI/EcoRI sites. The pal 411 gene was digested with EcoRI and XhoI from pEB356 and inserted into the 412 *EcoRI/XhoI* sites of pEB1030 to produce pUT18C-Flag-*pal*. Genes of *tolB*  $\Delta^{22-25}$  and 413 tolB  $\Delta^{22-33}$  were amplified from plasmid pEB362 using suitable primers listed in Table 414 S2. The PCR products were cleaved by EcoRI and XhoI and cloned into the 415 *EcoRI/XhoI* sites of pKT25-His to yield plasmids pKT25-His-*tolB*  $\Delta^{22-25}$  and 416

417 pKT25-His-*tolB*  $\Delta^{22-33}$ . To introduce Kn and En sequences into each BACTH vectors, 418 oligonucleotide primers of Kn and En that are complementary to each other were 419 synthesized as listed in Table S2 and annealed by heating at 95 °C for 5 min. 420 Followed by cooling to room temperature, the products with cohesive ends were 421 inserted into plasmids pKT25-His and pUT18C-Flag at the *EcoRI/XhoI* sites to obtain 422 plasmids pKT25-His-Kn and pUT18C-Flag-En, respectively.

E. coli BTH101 (F-, cya-99, araD139, galE15, galK16, rpsL1, hsdR2, mcrA1, 423 mcrB1) was used as the reporter strain of the BACTH system. Competent E. coli 424 BTH101 strains co-transformed with two-hybrid plasmids bearing two different 425 antibiotic resistances were spread on Luria-Bertani (LB) plates containing 100 µg/mL 426 ampicillin, 50 µg/mL kanamycin, and 40 µg/mL X-gal at 30 °C. After incubating the 427 plates for 2 days, single colonies with successful co-transformation of two hybrid 428 plasmids were picked and inoculated in 2 mL of LB containing 100 µg/mL ampicillin 429 and 50 µg/mL kanamycin. Cultures were grown overnight with shaking (250 rpm) at 430 30 °C, unless specified otherwise. The harvested bacterial sample was adjusted to 431  $OD_{600} \sim 1.0$ , immunofluorescently stained and analyzed on the flow cytometer. 432

Immunofluorescent Staining. To a 200  $\mu$ L of the harvested bacterial cells, 8  $\mu$ L of 1 M NaPO<sub>4</sub> (pH 7.4) and 40  $\mu$ L of the primary fixative buffer (3  $\mu$ L of 25% gluteraldehyde per mL of 16% paraformaldehyde) were added and incubated at room temperature for 15 min followed by 30 min on ice. The sample was washed twice with 200  $\mu$ L PBS and resuspended in 50  $\mu$ L PBS. Then, 500  $\mu$ L of ice cold 80% methanol was added and the sample was treated for 1 h at room temperature. The 22/26

sample was washed twice with GTE buffer. The cells were permeabilized by 439 resuspending in 100 µL of 2 mg/mL lysozyme in GTE and incubated for 10 min at 440 441 room temperature. After washing twice with PBS, the cells were blocked in 100 µL 1% FBS for 10 min. Then 20 µL of the suspension was centrifuged and resuspended in 40 442  $\mu$ L of 5  $\mu$ g/mL rabbit anti- $\beta$ -gal antibody with/without 5  $\mu$ g/mL mouse anti-His/Flag 443 antibody depending on the experimental requirement. After 1 h incubation at room 444 temperature, the sample was centrifuged and washed with PBS, then resuspended in 445 40 μL of 10  $\mu g/mL$ FITC-conjugated GAR antibody with/without 446 447 DyLight-649-conjugated GAM antibody. The suspension was incubated for 30 min at room temperature, centrifuged, and resuspended in 50 µL PBS. For flow cytometry 448 analysis, the sample should be diluted 500-fold with PBS before loading. 449

Flow Cytometric Measurement. A Becton Dickinson FACSVerse flow cytometer 450 equipped with 488 nm and 640 nm excitation lasers was used in this study. FL1 451 (527/32 nm band-pass filter) channel and FL2 (660/10 nm band-pass filter) channel 452 were used to detect the fluorescence of FITC and DyLight 649, respectively for the 453 immunofluorescently stained bacteria. A threshold value of 200 was set on FL1 to 454 eliminate non-bacterial particles. A total of 10000 events falling in the gated region 455 456 were collected for each sample. Data acquisition and analysis were carried out by using BD FACSuite software. The data were analyzed by Flowjo 7.6.1 software (Tree 457 Star, Inc., Ashland, OR). 458

459 Measurement of  $\beta$ -Gal Enzyme Activity by ONPG Colorimetric Assay. A 460 protocol described in the literature was followed (12). Briefly, 200 µL of the 23/26

harvested bacterial cells (OD<sub>600</sub>~1.0) were treated by 3  $\mu$ L toluene and 3  $\mu$ L 0.01% 461 SDS (shaking at 37 °C for 30 min). Then 1.8 mL PM2 buffer (70 mM Na<sub>2</sub>HPO<sub>4</sub>·12 462 H<sub>2</sub>O, 30 mM NaH<sub>2</sub>PO<sub>4</sub>·H<sub>2</sub>O, 1 mM MgSO<sub>4</sub>, 0.2 mM MnSO<sub>4</sub>, pH7.0) with 100 mM 463  $\beta$ -mercaptoethanol was added and mixed thoroughly. After that, 250  $\mu$ L of the ONPG 464 substrate solution (4 mg/mL ONPG in PM2 buffer without  $\beta$ -mercaptoethanol) was 465 added to 1 mL of the mixture. The enzymatic reaction was carried out immediately on 466 a DU-800 spectrophotometer (Beckman Coulter) with measurement of OD<sub>420 nm</sub>. The 467  $\beta$ -galactosidase activity corresponds to 200 × (OD<sub>420 nm, t2</sub> - OD<sub>420 nm, t1</sub>) / (t2-t1) (min) 468  $\times$  10. The factor 200 is the inverse of the absorption coefficient of o-nitrophenol, 469 while the factor 10 is the dilution factor. 470

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477 Author contributions

L.W., X.W., and X.Y. conceived and designed the research; L.W., X.W., T.L.,
and J.Z. performed research; L.W., X.W., and X.Y. analyzed data and wrote the
paper.

## 481 **Conflict of interest statement**

482 The authors declare no conflict of interest.

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