

1 **Cell-to-cell variability in inducible Caspase9-mediated cell death**

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13 **ABSTRACT**

14 iCasp9 suicide gene has been widely used as a promising killing strategy in various cell  
15 therapies. However, different cells show significant heterogeneity in response to apoptosis  
16 inducer, posing challenges in clinical applications of killing strategy. The cause of the  
17 heterogeneity remains elusive so far. Here, by simultaneously monitoring the dynamics of  
18 iCasp9 dimerization, Caspase3 activation and cell fate in single cells, we found that the  
19 heterogeneity was mainly due to cell-to-cell variability in initial iCasp9 expression and  
20 XIAP/Caspase3 ratio. Moreover, multiple-round drugging cannot increase the killing efficiency.  
21 Instead, it will place selective pressure on protein levels, especially on the level of initial iCasp9,  
22 leading to drug resistance. We further show this resistance can be largely eliminated by  
23 combinatorial drugging with XIAP inhibitor at the end, but not at the beginning, of the multiple-  
24 round treatments. Our results unveil the source of cell fate heterogeneity and drug resistance  
25 in iCasp9-mediated cell death, which may enlighten better therapeutic strategies for optimized  
26 killing.

27

28 **INTRODUCTION**

29 Inducible Caspase9 (iCasp9) is a cellular suicide gene that allows conditional cell elimination<sup>1</sup>.  
30 It comprises a human Caspase9 fused with an inducer-binding domain which could be  
31 dimerized by the Chemical Inducer of Dimerization (CID), AP20187 or AP1903<sup>2,3</sup>. iCasp9 is  
32 dimerized and activated by induced proximity of the inducer-binding domain, leading to  
33 activation of the apoptosis pathway<sup>4</sup>. Due to the efficient induction of cell death, iCasp9 has

34 been used as one of the most promising killing strategies in cancer therapies<sup>5-7</sup> and adoptive  
35 cell therapies<sup>8-14</sup>. However, cells, especially cancer cells, cannot be eliminated 100% even  
36 treated with an extremely high dose of drug. The incomplete killing of cells leads to drug  
37 resistance and hampers the further use of the iCasp9 suicide gene<sup>15,16</sup>. Consequently, one  
38 potential way to improve the performance of iCasp9 is through increasing drug efficacy. An  
39 understanding of the source of heterogeneous cell responses to the drug and how such  
40 heterogeneity contributes to resistance could lead to more effective treatment strategies.

41 Previous investigations into isogenic populations of tumor cells in response to apoptosis  
42 inducing drugs revealed that the heterogeneity could emerge from non-genetic mechanisms,  
43 often through stochastic fluctuations in protein expression<sup>17-20</sup> or differences in dynamics<sup>21,22</sup>.  
44 These studies mainly focused on the upstream of the apoptosis pathway. However, in the  
45 iCasp9 system, CID triggers the very downstream apoptosis pathway, so the source of  
46 heterogeneous response can be different. As depicted in Fig. 1a, in response to CID, iCasp9  
47 is first dimerized and activated through the proximity of DmrB protein. Then, active iCasp9  
48 triggers the activation of the executor Caspase3, which cleaves thousands of substrates in  
49 cells<sup>23</sup>, resulting in irreversible cell death<sup>24,25</sup>. Opposing the pro-apoptotic iCasp9 and  
50 Caspase3, the anti-apoptotic protein XIAP inhibits and degrades pro-apoptotic caspases once  
51 they are activated<sup>26</sup>. Thus, cell death is regulated by interactions between pro-apoptotic and  
52 anti-apoptotic proteins.

53 In this work, we investigated potential causes for the heterogeneous cell response to  
54 inducer AP20187. We tagged iCasp9 with an mCherry fluorescence protein to track the

55 dynamics of iCasp9 dimerization and incorporated a fluorescent substrate for Caspase3 to  
56 report Caspase3 activation and cell fate. We found that heterogeneous cell fates were  
57 originated from cell-to-cell variability in the initial iCasp9 expression and the ratio between  
58 XIAP and Caspase3 expression levels (XIAP/C3 ratio). Moreover, we also observed significant  
59 heterogeneous behaviors within survival or dead cells, which were characterized by different  
60 dynamics of iCasp9 dimerization and Caspase3 activation within the survival cell population,  
61 and a broad distribution of death time within the dead cell population, respectively. Changing  
62 the inducer concentration not only changed the killing efficiency, but also dramatically altered  
63 the composition of survival cell types as well as the distribution of cell death timing. Additionally,  
64 multiple rounds of inducer application weakened the killing efficiency due to the accumulation  
65 of drug resistance originated from a selective pressure on low initial iCasp9 level. The killing  
66 efficiency on the resistant population could be greatly improved by the combinational use of  
67 the inducer with XIAP-targeted drug at the end of the multiple-round inducer treatment.  
68 Interestingly, the elevation of killing efficiency brought by the combinatorial drug use was much  
69 less effective if the drug combination was used from the beginning of the multiple-round  
70 treatment. Taken together, our results unveiled the source of cell heterogeneity in iCasp9-  
71 mediated cell death and demonstrated the “smart application” of combinational drugging for  
72 optimizing the killing efficiency, which may offer insights and new strategies for better clinical  
73 use of the iCasp9 system.

74

75 **RESULTS**

76 **A system to monitor iCasp9 dimerization and cell fate simultaneously in single cells**

77 To investigate what determines the heterogeneous responses of isogenic iCasp9 cells to the  
78 inducer, we first developed a system to simultaneously monitor iCasp9 dimerization and cell  
79 fate in single cells.

80 To monitor iCasp9 dimerization, we constructed an isogenic iCasp9 Hela cell line, in which  
81 iCasp9 was tagged with an mCherry fluorescence protein. As fluorescence signals can be  
82 greatly quenched upon dimerization due to the reduction of electronic energy level<sup>27-29</sup>, the  
83 dimerization of iCasp9 thus could be reflected by the decrease of mCherry fluorescence  
84 intensity (Fig. 1b). Indeed, we observed a significant fluorescence drop after adding the  
85 inducer (Supplementary Video 1), while no fluorescent intensity change was observed either  
86 in microtubule-mCherry cells with inducer addition (Supplementary Fig. 1a) or in iCasp9-  
87 mCherry cells without inducer addition (Supplementary Fig. 1b).

88 For the cell fate, since cells will all undergo apoptosis once Caspase3 is activated, we  
89 introduced a Fluorescence Resonance Energy Transfer (FRET)-based reporter, CFP-DEVDR-  
90 Venus, to monitor the Caspase3 activation (Fig. 1c)<sup>30</sup>. In this reporter, CFP and Venus are  
91 linked together by five amino acids ‘DEVDR’, which is the optimal substrate sequence for  
92 Caspase3. The ratio of CFP *versus* Venus fluorescence (FRET Ratio) will change upon  
93 cleavage of the linker ‘DEVDR’ (Fig. 1c and Supplementary Fig. 1c). The FRET Ratio of the  
94 reporter is highly correlated with the morphology change of apoptotic cell as we monitored  
95 cells under the microscope (Fig. 1d). While most unperturbed iCasp9 cells were alive with a  
96 low FRET Ratio (i.e. the FRET reporter within cells was intact without Caspase3 activation,

97 Supplementary Fig. 1d and Supplementary Video 2), most iCasp9 cells treated with 0.25 nM  
98 inducer died with high FRET Ratios (i.e. the FRET reporter was cleaved by activated  
99 Caspase3, Supplementary Fig. 1e and Supplementary Video 3). These results indicated that  
100 the FRET Ratio indeed is a good reporter for cell fate. To have the potential to scale up, we  
101 further validated that the FRET reporter can also report cell fate accurately through flow  
102 cytometry measurements (Supplementary Fig. 2a).

103 Using the iCasp9 cell system above, we characterized heterogeneous cell responses to  
104 the inducer. We focused on 0.25 nM inducer first as this dose provided comparable population  
105 sizes of survival and dead cells in our experimental system. We treated iCasp9 cells with 0.25  
106 nM inducer and tracked them using a confocal microscope for 24 h as apoptotic events had  
107 largely ceased by this time (Fig. 1d). Longer treatment time would result in a decreased death  
108 percentage due to the division of survival cells (Supplementary Fig. 2b and Supplementary  
109 Video 2). We then extracted single-cell profiles of iCasp9-mCherry (Fig. 1e) and FRET Ratio  
110 (Fig. 1f) from surviving and dead cells, respectively. A significant cell-to-cell variability was  
111 observed. Some cells were dead and characterized with a significant decrease of iCasp9-  
112 mCherry and a sharp increase of FRET Ratio (pink lines, Fig. 1e,f), while some cells survived  
113 with various iCasp9-mCherry profiles but a constantly low FRET Ratio (blue lines, Fig. 1e,f).

#### 114 **Heterogenous cell fates dictated by initial iCasp9 level and XIAP/C3 ratio**

115 To investigate the source of heterogenous cell fates, we compared the profiles of both iCasp9-  
116 mCherry and FRET Ratio in survival cells (Fig. 2a) to those in dead cells (Fig. 2b). As expected,  
117 the survival cells showed a constantly low FRET Ratio, while the dead cells exhibited a sharp

118 increase of the FRET Ratio. Unexpectedly, the dead cells showed a significant higher initial  
119 iCasp9-mCherry level than that in survival cells (Fig. 2c). We further binned the cells by the  
120 initial iCasp9 level, and found a clear dependency of the death percentage on the initial iCasp9  
121 level (Fig. 2d), suggesting the cell fate is highly correlated with its initial iCasp9 level.

122 However, the death percentage reached a plateau of ~80% when the initial iCasp9-  
123 mCherry level increased to 100 (Fig. 2d). In addition, the initial iCasp9 level in survival and  
124 dead cells had a big overlap, though the difference between them was significant ( $P<0.0001$ )  
125 (Fig. 2c). All these results suggested that the initial iCasp9 level is not the sole determinant of  
126 the cell fate, which led us to consider the potential effect of the other two players in AP20187-  
127 induced apoptosis pathway: XIAP and Caspase3. Thus, we measured their amount in both  
128 survival and dead cells treated with 0.25 nM inducer for different time (Fig. 2e). Compared with  
129 the initial values (0 h), both XIAP and Caspase3 dramatically decreased after adding inducer  
130 for 6 h, even in the survival cells (Fig. 2f,g), indicating a fighting process between XIAP and  
131 Caspase3<sup>31</sup>. As we further quantitatively compared the amount of XIAP and Caspase3  
132 between dead and survival cells, a significant difference on XIAP/C3 ratio was observed at all  
133 time points (Fig. 2f-h). The XIAP/C3 ratios in survival cells were significantly higher than that  
134 in dead cells at all time points (Fig. 2h), suggesting that cell survives due to the overwhelming  
135 XIAP to Caspase3 level.

136 To further confirm the effect of XIAP/C3 ratio on cell fate, we knocked down the level of  
137 either XIAP or Caspase3 by RNAi. With a knockdown efficiency of 68% on XIAP, the death  
138 percentage was increased from 68% to 84%, while a knockdown efficiency of 59% on

139 Caspase3 led to a decrease of death percentage from 68% to 53% (Fig. 2i). These results  
140 indicate that the variability of XIAP and Caspase3 levels in single cells also contributes to the  
141 cell fate heterogeneity. Given the numerous XIAP-targeted drugs, these results opened up a  
142 potential therapeutic strategy of combining iCasp9 inducer with XIAP inhibitors to achieve a  
143 higher killing efficiency. We tested this strategy in our system, using AT406, a small molecule  
144 drug, for XIAP inhibition. Indeed, a significant increase of killing efficiency was observed in all  
145 inducer concentrations (Fig. 2j).

146 Taken together, by employing the iCasp9 cell system we constructed, we found that the  
147 cell-to-cell variability in the initial iCasp9 level and the XIAP/C3 ratio are the main two  
148 contributors for the cell fate heterogeneity.

149 **Different types of survival cells**

150 In addition to the heterogenous survival and dead cell fates, substantial heterogeneity was  
151 also found within both the survival and dead cell populations. As for the survival cells, we  
152 observed several distinct types in light of their iCasp9-mCherry and FRET Ratio profiles,  
153 indicating that they survive because of different reasons.

154 Based on whether there was a decrease in iCasp9-mCherry signal after adding the  
155 inducer, survival cells are divided into two groups. Those with no decrease of iCasp9-mCherry  
156 (< 50%) were grouped as survival cell type 1, indicating an insufficient induction of iCasp9 (red  
157 lines, Fig. 3a). All type 1 cells showed constantly low FRET Ratio signals (purple lines, Fig.  
158 3a). The insufficient iCasp9 induction was presumably due to either low initial iCasp9 level or  
159 low inducer uptake efficiency. Thus, we further classified type 1 survival cells into two sub-

160 populations according to their initial iCasp9-mCherry levels. Since the dead probability of cells  
161 with initial iCasp9-mCherry level above 60 started to be higher than the survival probability  
162 (Supplementary Fig. 3), we grouped cells with initial iCasp9-mCherry level below 60 as survival  
163 cell type1-a (left panel, Fig. 3a) while the remaining cells as survival cell type1-b (right panel,  
164 Fig. 3a).

165 For those survival cells with significant decrease of iCasp9-mCherry, we grouped them  
166 into survival cell type 2 (Fig. 3b). In contrast to the constantly low FRET Ratio in survival cell  
167 type 1, we observed a slight increase of FRET Ratio happening concomitantly with the  
168 decrease of iCasp9-mCherry in survival cell type 2, suggesting that Caspase3 had been  
169 partially activated. The final surviving cell fate was reached in these cells presumably due to a  
170 high XIAP level overwhelming the apoptotic function of iCasp9 and Caspase3. Based on  
171 whether the initial iCasp9 level was higher than 60, we also classified type2 cells into two sub-  
172 populations, survival cell type2-a (initial iCasp9<60, left panel, Fig. 3b) and survival cell type2-  
173 b (initial iCasp9>=60, right panel, Fig. 3b), respectively.

174 To investigate the contributions of each survival mode, we further quantified the number  
175 of survival cells from different types. Among 44 survival cells we analyzed under the condition  
176 of 0.25 nM inducer, only 22.7% (10/44) of cells had no obvious iCasp9 dimerization (Fig. 3c,  
177 Type 1), and 90% (9/10) of them showed the initial iCasp9 level lower than 60 (Fig. 3d, Type1-  
178 a), indicating the importance of initial iCasp9 level for an effective iCasp9 dimerization. The  
179 remaining cells (1/10) showed reasonably high initial iCasp9 level but no sign of dimerization,  
180 suggesting a low efficiency of drug uptake (Fig. 3d, Type1-b)<sup>32</sup>. However, 77.3% (34/44) of

181 cells presented significant iCasp9 drops (Fig. 3c, Type 2), implying that most of the survival  
182 cells had an effective iCasp9 dimerization. Among this population, 44.1% (Fig. 3e, Type2-a)  
183 and 55.9% (Fig. 3e, Type2-b) of the cells had initial iCasp9 level lower and higher than 60,  
184 respectively. Though all Type 2 cells survived from the fighting between XIAP and Caspases,  
185 fewer cells in Type2-a had an increase of FRET Ratio ( $> 15\%$ ) than that in Type2-b (Fig. 3f),  
186 indicating higher initial iCasp9 level would generally leads to higher Caspase3 activation.

187 **Substantial heterogeneity exists within dead cell population**

188 Then we looked into the dead cell population. Though a significant drop of iCasp9-mCherry  
189 fluorescence and a sharp increase of FRET Ratio were observed in all dead cells (Fig. 4a),  
190 the dynamics of the iCasp9 dimerization (Fig. 4b) and Caspase3 activation (Fig. 4c) showed  
191 a large cell-to-cell variability.

192 To quantify the heterogeneity, we defined “Td-iCasp9” as the time for iCasp9-mCherry  
193 intensity decreasing from the initial level to the level at 10% higher than the minimum (Fig. 4b),  
194 and “Td-dead” as the time from adding inducer to the FRET Ratio reaching 90% of its  
195 maximum (Fig. 4c), respectively.

196 As iCasp9 dimerization was the effective input of the circuit, we asked what features of  
197 iCasp9 determines the variability of death timing. We first looked at the initial iCasp9 level,  
198 which is correlated with cell survival/death fates. However, only a weak negative correlation  
199 (Pearson’s  $r=-0.13$ ) was found between Td-dead and initial iCasp9 level (Fig. 4d). Then we  
200 analyzed the correlation between Td-dead and Td-iCasp9 (Fig. 4e). A strong positive  
201 correlation (Pearson’s  $r=0.74$ ) was seen, indicating cells with faster iCasp9 dimerization are

202 more likely to die faster than cells with slower iCasp9 dimerization. Different dynamics of  
203 iCasp9 dimerization was presumably due to the cell-to-cell variability on drug transportation  
204 efficiency<sup>32</sup>.

205 **Dose-effect of inducer on caspase dynamics and cell fates**

206 Since drug dose is the easiest thing to be adjusted in clinic, we further varied the inducer  
207 concentration and investigated the dose-effect on cellular responses. We first systematically  
208 investigated the killing efficiency of different inducer concentrations, ranging from 0.0001 nM  
209 to 100 nM (Fig. 5a). While the wild-type cells which do not incorporate iCasp9 gene did not  
210 respond to the inducer (black dots, Fig. 5a), iCasp9 cells showed a significant enhancement  
211 of cell death with increasing inducer concentration (red dots, Fig. 5a). To understand the dose-  
212 effect of inducer at single cell level, we further looked into the dynamics of iCasp9 dimerization  
213 and Caspase3 activation. Here, we took 0.025 nM, 0.25 nM and 2.5 nM as representatives of  
214 the low, medium and high concentrations, given the cell death percentages in these three  
215 concentrations were ~30%, ~60% and ~90%, respectively (blue, green and orange dash lines,  
216 Fig. 5a).

217 We firstly extracted the average trajectories of iCasp9-mCherry from all dead (Fig. 5b)  
218 and survival cells (Fig. 5c). Obvious differences were found both between dead and survival  
219 cells and among different concentrations. The survival cells showed a significantly lower initial  
220 iCasp9 level than that in dead cells under concentrations of 0.25 nM and 2.5 nM, further  
221 confirming our conclusion that cells with higher initial iCasp9 level are more easily to die (Fig.  
222 5d). No significant difference on initial iCasp9 level was found between dead and survival cells

223 in the concentration of 0.025 nM, presumably due to the extremely low killing efficiency at that  
224 concentration, which was just slightly higher than the background death percentage (Fig. 5a).  
225 In this case, the contribution to cell fate from other factors, such as the XIAP and Caspase3  
226 level, may shadow that of the initial iCasp9 level. It is worth to note that a decreasing initial  
227 iCasp9 level was found in survival cells as the inducer concentration increases, indicating that  
228 some survival cells with high initial iCasp9 level can be killed by increasing the inducer  
229 concentration (Blue dots, Fig. 5d).

230 As for the dynamics of iCasp9 dimerization, we measured the Td-iCasp9 for survival and  
231 dead cells under different inducer concentrations. For survival cells, since there was no  
232 obvious iCasp9 dimerization in type1 cells, we only extracted the averaged trajectories of  
233 iCasp9-mCherry from type 2 cells for Td-iCasp9 analysis (Supplementary Fig. 4). It turned out  
234 that, even type 2 cells had iCasp9 dimerization, their Td-iCasp9 was significantly longer than  
235 that in dead cells, suggesting that survival cells may generally have a weak capability in drug  
236 uptake. Moreover, both survival and dead cells possessed a shortened Td-iCasp9 when being  
237 treated with higher concentrations, suggesting higher inducer concentration would speed up  
238 the iCasp9 dimerization.

239 To further support our findings that faster iCasp9 dimerization can accelerate cell death,  
240 we extracted the trajectories of FRET Ratio in each dead cell under different inducer  
241 concentrations (left panel, Fig. 5f). Quantitative analysis on Td-dead (right panel, Fig. 5f)  
242 showed that cells died at an averaged time of ~800 min after being treated with 0.025 nM  
243 inducer, with the 5<sup>th</sup> and 95<sup>th</sup> percentile values of 300 min and 1400 min. However, in the

244 condition of 2.5 nM inducer, the averaged Td-dead was dramatically shortened to ~80 min and  
245 the variability was also greatly reduced. These results led us to propose that slow dimerization  
246 of iCasp9 resulted in a gradual accumulation of active iCasp9, which might be easily  
247 neutralized by XIAP and thus hampers cell death. We further quantified Td-iCasp9 and cell  
248 death percentage in different inducer concentrations. The results showed cell death  
249 percentage was negatively related to Td-iCasp9, confirming that rapid iCasp9 dimerization is  
250 more potent to causing cell death (Supplementary Fig. 5).

251 Besides the impact on death timing in dead cells, drug dose also changed the composition  
252 of survival cell types. We found the survival cells with low initial iCasp9 level became dominant  
253 in higher concentrations (type1a+type2a, Fig. 5g).

254 Taken together, higher concentration of AP20187 would speed up the iCasp9 dimerization,  
255 and lead to faster death with lower cell-to-cell variability.

## 256 **Development of drug resistance in multiples rounds of inducer treatment**

257 Substantial heterogeneity of responsiveness has been shown in clonal iCasp9 cell population,  
258 and that higher concentration could lead to faster death with lower cell-to-cell variability.  
259 However, since there were always some cells left unkillled in the drug treatment, we wonder if  
260 a complete or near complete killing could be achieved by applying multiple rounds of treatment.  
261 We exposed iCasp9 cells to multi-rounds of 0.25 nM inducer treatment (Fig. 6a). After the first  
262 round of treatment, survival cells remained attached to the dish whereas dead cells detached,  
263 allowing us to recover survival cells by trypsinization. We plated survival cells into a fresh  
264 medium without inducer and cultured them for 48 h. Then these survival cells were challenged

265 with a second dose of 0.25 nM inducer. We cultured cells survived from the second dose for  
266 another 48 h and treated them with a third dose of 0.25 nM inducer. For each round of inducer  
267 treatment, cells were treated with inducer for 24 h and the death percentage was monitored  
268 (Fig. 6b). Instead of approaching higher killing efficiency, an obvious accumulation of drug  
269 resistance was observed with repeated rounds of treatment. While 65% of cells died after the  
270 first round of treatment, the death percentage dropped to 48% for the second round and only  
271 12.3% of cells were killed in the 3<sup>rd</sup> round treatment (Fig. 6b).

272 To further investigate the origin of the accumulating drug resistance, we quantified the  
273 iCasp9, XIAP and Caspase3 protein levels in cells right before each round of inducer treatment.  
274 A significant drop of the initial iCasp9-mCherry level was observed as the round increases,  
275 indicating a strong selective pressure on the initial iCasp9-mCherry level (Fig. 6c). Meanwhile,  
276 we also found a decrease of Caspase3 level, while XIAP maintained at a similar level (Fig. 6d-  
277 f). As a result, the XIAP/C3 ratio was higher in cells survived from multiple rounds of treatment  
278 (Fig. 6g).

279 As discussed before, cells survive from the inducer treatment in different ways (Fig. 3).  
280 We compared the composition of different survival cell types after the first and the third round  
281 of treatment (Fig. 6h). While there was a total of 50% (type1a+type2a) survival cells (initial  
282 iCasp9 < 60) after the first treatment (left pie chart, Fig. 6h), the percentage increased to 77%  
283 after three rounds of treatment (right pie chart, Fig. 6h). These results further support the  
284 selective pressure on the initial iCasp9 level. Interestingly, the percentage of survival cells due  
285 to high XIAP/C3 ratio (type2-b) dropped dramatically from 47% to 15%, suggesting minor

286 contributions of XIAP/C3 ratio to the increasing drug resistance, consistent with the fact that  
287 no obvious selective pressure was observed on XIAP level (Fig. 6f). Taken together, our  
288 experiments showed that multiple rounds of treatment cannot increase the killing efficiency.  
289 Instead, it would place selective pressure on protein levels, especially on the level of initial  
290 iCasp9, leading to drug resistance.

291 Since no obvious change on XIAP level was found after multiple rounds of treatment, we  
292 wonder if higher killing efficiency could be achieved by combining inducer with XIAP inhibitor.  
293 Indeed, after two rounds of AP20187 treatment, by combining with 0.1  $\mu$ M XIAP inhibitor  
294 AT406 at the third round, a significant increase of killing efficiency was obtained, from 16.5%  
295 to 62.4% (grey bars, Fig. 6i). Surprisingly, if the drug combination was used from the beginning,  
296 i.e., if the previous two rounds of treatment were by the combination of inducer AP20187 and  
297 XIAP inhibitor AT406, the killing efficiency at the third round was much lower with or without  
298 the drug combination (yellow-green bars, Fig. 6i). This suggests that the continuous application  
299 of combinational drugging placed selective pressure on both iCasp9 and XIAP, resulting in a  
300 dramatic attenuation of the efficacy of the XIAP inhibitor. Our findings hints a “smart strategy”  
301 of drug combination usage.

302

### 303 **DISCUSSION**

304 In this paper, we constructed an iCaps9 system in which we can track the dynamics of iCasp9  
305 dimerization and Caspase3 activation, and the cell fate simultaneously in single cells using  
306 live-cell imaging. Large heterogeneity in the clonal population of iCasp9 cells was observed.

307 The heterogeneity not only manifested in the final cell fate of life and death, but also in the  
308 different surviving ways within survival cells and the varied death timing within the dead cells.

309 The major source of heterogeneous cell responses to the inducer is the cell-to-cell  
310 variability in the initial iCasp9 level and XIAP/C3 ratio. We found that there was significantly  
311 higher initial iCasp9 level and lower XIAP/Caspase3 ratio in survival cells than that in dead  
312 cells, which suggests the survival or death cell fate is mainly determined by the fighting process  
313 between the pro-apoptotic proteins and the anti-apoptotic proteins. This conclusion was further  
314 confirmed by RNAi experiments and our observations on the different survival cell types. By  
315 combining the analysis of iCasp9-mCherry and FRET Ratio profiles in single cells, we found  
316 that most of the cells (77.2%, type2 survival cells) survived through XIAP overwhelming the  
317 apoptotic effects of iCasp9 and Caspase3. Besides the variability in iCasp9, XIAP and  
318 Caspase3 levels, we also observed some influence from the inducer uptake efficiency on the  
319 heterogeneous cell response. There was a small population of cells (22.8%) that survived due  
320 to insufficient induction of iCasp9 dimerization, among which the low initial iCasp9 level was  
321 the main cause (90%) while about 10% was likely due to the low inducer uptake efficiency.

322 Our analysis indicated that the killing efficiency could be adjusted by changing the protein  
323 expression level. Indeed, the killing efficiency was increased with a knockdown on XIAP, while  
324 a knockdown on Caspase3 led to a decrease of the death percentage. These results suggest  
325 a big difference on the killing efficiency for various cell types or tissues/organs, as their protein  
326 expressions including Caspase3, Caspase9 and XIAP varies a lot (seen in database 'The

327 Human Protein Atlas'). Thus, personalized treatment with respect to specific cell types or  
328 tissues may be needed to reach the desired killing efficiency.

329 By looking into the dead cell population, we found a substantial heterogeneity in death  
330 timing, which was poorly correlated with initial iCasp9 level but highly correlated with the speed  
331 of iCasp9 dimerization. The heterogeneity here is most likely originated from the cell-to-cell  
332 variability in drug uptake efficiency. As the inducer AP20187 is a small molecule that can be  
333 readily diffused into cells, its cellular concentration presumably depends on the drug exclusion  
334 process<sup>32</sup> which could be variable from cell to cell. To enhance the uptake efficiency, we  
335 increased the inducer concentration as this is the most feasible strategy in clinical treatment.  
336 Higher dose of inducer indeed triggered faster dimerization of iCasp9, leading to more rapid  
337 activation of Caspase3 and faster cell death with less variability. In contrast, when a low dose  
338 of AP20187 is applied, it takes longer for iCasp9 to dimerize. The slow accumulation of active  
339 iCasp9 would be more easily neutralized by XIAP. In this scenario, lower dose of AP20187  
340 tends to cause bigger cell-to-cell variability as the slow time scale for iCasp9 activation would  
341 amplify the opposing effects of XIAP and Caspase3 expression.

342 Multiple rounds of inducer application did not kill more cells. Instead, the surviving cells  
343 developed heritable drug resistance. We found that the resistance came from the low iCasp9  
344 expression. This heritable protein variation probably originated from the epigenetic  
345 differences<sup>33</sup> in individual cells. Further investigation of the epigenetic source may improve  
346 iCasp9-mediated killing efficiency. Interestingly, little selective pressure on XIAP expression  
347 level was observed in the multi-round inducer treatment. Thus, we can significantly improve

348 killing efficiency on the inducer resistant cell population by combining XIAP-targeted inhibitor  
349 with the inducer. It is worth to note that the efficacy of drug combination was dramatically  
350 diminished if used continuously from the very beginning.

351 The clinic application of iCasp9 suicide gene is still in its infancy. More investigations on  
352 the system are required to unleash its full potential. Our work unveils the sources of cell-to-cell  
353 variability and drug resistance in clonal population of iCasp9 cells, paving the way for  
354 improving therapeutic strategies to achieve optimal performance.

355

## 356 **MATERIALS AND METHODS**

### 357 **Cell lines and cell culture**

358 The human embryonic kidney 293T cells and Hela cervical cancer cell lines were gifts from  
359 Prof. Jianguo Chen. Cells were cultured in Dulbecco's Modified Eagle's Medium (DMEM)  
360 (Gibco, Cat# 11965092) containing 10% fetal bovine serum (Gibco, Cat# 16000044) and 100  
361 U/mL penicillin and streptomycin (Invitrogen, Cat# 15140163) in a humidified environment with  
362 5% CO<sub>2</sub> at 37 °C.

### 363 **DNA constructs**

364 Lentivirus vectors pHRL-mCherry, pCMVdR8.91, and pMD2.G were kindly provided by Prof.  
365 Ping Wei. Full-length Caspase9 was a gift from Prof. Xiaodong Wang. The FRET reporter  
366 (pECFP-DEVDR-Venus, Cat # 24537) was purchased from Addgene and the iDimerize<sup>TM</sup>  
367 Inducible Homodimer System (Cat # 635068) was purchased from Clontech Laboratories, Inc.  
368 iCasp9 construct was built by inserting full-length Caspase9 to pHom-1 vector with a linker

369 sequence 'RPPPR', which was verified by sequencing with primers Seq\_Casp9\_F and  
370 Seq\_Casp9\_R. Then the integrated DmrB-linker-caspase-9 sequence in the pHom-1 vector  
371 was cloned into the pHR-mCherry vector. We used Primer Spel-Casp9\_F and BamHI-  
372 Casp9\_R to generate full-length Caspase9 fragment with Spel and BamHI restriction enzyme  
373 cleavage site, so that we can insert it into the pHom-1 vector which has the same cleavage  
374 site. Primers for constructing and verifying DmrB-linker-caspase-9 are listed below.

Primer name	Primer sequence (5' to 3')
Spel-Casp9_F	<b>GGACTAGT</b> <sup>a</sup> AGGCCGCCGCCGAGG <sup>b</sup> ATGGACGAAGCGGA TCGGCG
BamHI-Casp9_R	<b>CGCGGATCC</b> <sup>a</sup> CGCTGATGTTAAAGAAAA
Seq_Casp9_F	ATGGCTTCTAGAGGAGTGCA
Seq_Casp9_R	CGCGGATCCCGCTGATGTTAAAGAAAA

375 <sup>a</sup> Restriction enzyme cleavage sites are shown in black bold, <sup>b</sup> The linker sequence is shown  
376 in italics.

### 377 **Stable cell line construction**

378 We transfected the FRET reporter into cells by using X-tremeGENE HP DNA Transfection  
379 Reagent (Roche, Cat# 6366236001). We mixed 1 µg of plasmid DNA (pECFP-DEVDR-Venus)  
380 and 3 µl X-tremeGENE HP DNA Transfection Reagent with 100 µl opti-MEM (Gibco, cat#  
381 31985088), and added into cells. After transfection, we cultured the cells with DMEM medium  
382 containing antibiotic G418 (Sigma, 10131027), starting with the concentration of 1000 µg/ml

383 and then decreasing to maintain the concentration at 200  $\mu$ g/ml for ~30 days. Finally, we  
384 collected survival cells and used FACS to select and allocate single cells with positive Venus  
385 fluorescence signals into 96-well plates, and cultured every single cell into a big population as  
386 the clonal population.

387 Based on the stable Hela cell line with FRET reporter, the iCasp9 gene was further  
388 introduced by lentivirus infection, which was pre-generated from 293T cells. We first co-  
389 transfected three lentivirus vectors pH-R-Caspase9-mCherry, pCMVdR8.91, and pMD2.G into  
390 293T cells. After incubation in 5% CO<sub>2</sub>, 37°C incubator overnight, we harvested the  
391 supernatant which contains the lentivirus particles, and added them to Hela cells. Two days  
392 later, we replaced the medium with a fresh one and kept culturing cells for another week in  
393 media containing 0.5 mg/ml puromycin. Clonal population of iCasp9 cells were established as  
394 described above.

395 **siRNA transfection**

396 The sequence of XIAP siRNA and Caspase3 siRNA was designed for targeting XIAP and  
397 Caspase3, respectively. NC siRNA was designed as the negative control. 100 nM siRNA was  
398 transfected into iCasp9 cells by using ROCHE X-tremeGENE™ siRNA Transfection Reagent  
399 (MilliporeSigma, Cat# 4476093001). Cells were harvested 48 hours after transfection and  
400 analyzed by western blotting.

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siRNA name	Sequence (5' to 3')
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XIAP siRNA	CC AUG UG C U A C A C A G U C A U T T
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Caspase3 siRNA AAUGACAUCUCGGUCUGGUAC

NC siRNA UUCUCCGAACGUGUCACGUTT

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401 **Western blotting**

402 For analysis of RNAi knockdown efficiency of XIAP and Caspase3, cells were harvested 48 h  
403 after transfection. For analysis of XIAP and Caspase3 at different time points, we collected  
404 survival and dead cells separately at time 6 h, 12 h, 18 h, and 24 h after the treatment of  
405 AP20187. Cells were lysed in lysis buffer (100 mM NaCl, 50 mM Tris pH 7.5, 0.5%  
406 deoxycholate, 1% Triton X-100, 0.1% SDS). Proteins were run on 12% Bis-Tris gels (cat#  
407 SL1120-500ML), then transferred to a PVDF membrane (cat# ISEQ00010) and incubated in  
408 a blocking solution (10% Skimmed Milk Powder, cat# SUP003a) 2 h at room temperature.  
409 Membranes were then incubated with the primary antibody in Can Get Signal Solution1 (cat#  
410 NKB-101) overnight at 4°C. Blots were washed three times for 5 min in washing solution (50  
411 mM Tris-Cl pH 7.5, 150 mM NaCl, 0.05% Tween-20) and then incubated in blocking solution  
412 plus fluorescent secondary antibody in Can Get Signal Solution2 for 1 h. Membranes were  
413 washed three times in a washing solution, and we detected protein levels with fluorescent  
414 signals (LI-CORODYSSEY CLx Infrared Imaging System). Molecular weights were identified  
415 using a protein standard (BioLabs, Cat# P7712S). Beta-actin was used as the loading control.  
416 Antibodies used for western blotting are listed below:

417 • Primary antibody for XIAP (Cell Signaling Technology, Cat# 2042S)  
418 • Primary antibody for Caspase3 (cat# 9662S)  
419 • Primary antibody for Caspase9 (cat# 9502S)

420    · Primary antibody for Actin (cat# 3700S)  
421    · Secondary antibody (anti-mouse cat# 926-32211 & anti-rabbit cat# 926-68070)

422    **Flow cytometry analysis**

423    Flow cytometry FACS Aria (Becton-Dickenson, USA) was used to perform sorting for iCasp9  
424    cell lines. We used a 100  $\mu$ m nozzle and set the forward scatter (FSC) and side scatter (SSC)  
425    to 300 V and 240 V, respectively, to identify the population of single live cells. We set the short-  
426    RFP fluorescence parameter to 500 V, to identify the population of iCasp9-mCherry cells. We  
427    set the BV421 and BV510 fluorescence parameters to 380 V and 320 V, respectively, to  
428    identify the fluorescence signals of CFP, FRET, and Venus.

429    We used the high-throughput mode of flow cytometry to determine cell death percentage.  
430    The ratio of CFP to FRET was used to identify live from dead ones. Cells were plated in 96-  
431    well flat-bottom plates (Corning) with a density of 40,000 per well. Cells were then treated with  
432    AP20187 (Clontech Laboratories, Cat # 635059) in different concentrations after culturing  
433    overnight. After incubation for 24 h, cells were first centrifuged at 2000 rpm for 5 min to avoid  
434    any loss of dead cells. Then we trypsinized and collected all the cells with 200  $\mu$ l medium per  
435    well of a 96-well plate as samples. FlowJo software was used to analyze death percentage  
436    based on the FRET Ratio and light scattering.

437    **Time-lapse microscopy**

438    All images were captured by a Nikon Ti inverted microscope equipped with 40 $\times$ /0.95 Plan Apo  
439    (Numerical aperture 1.4) objective lens and the Perfect Focus System (Nikon Co., Tokyo,  
440    Japan) for continuous maintenance of the focus. Cells were plated in 4-chamber glass-bottom

441 dishes (In Vitro Scientific) with a density of 10,000 per well and maintained in a 37°C, 5% CO2  
442 incubation chamber for 24 h imaging. We used filter sets that are optimized for the detection  
443 of mCherry, CFP, FRET, and Venus fluorescence. CFP fluorescence was excited at 440 nm  
444 with a 100 mW solid-state laser and collected with a 485/60 emission filter (Chroma  
445 Technology Corp). We set the exposure time at 500 ms. FRET signal was excited by 440 nm  
446 laser with an exposure time of 500 ms and collected with a 550/49 emission filter. Venus  
447 fluorescence was excited at the wavelength of 514 nm with a 100 mW solid-state laser and  
448 collected with a 550/49 emission filter. The mCherry fluorescence was excited at 561 nm with  
449 a 100 mW solid-state laser and collected with a 615/70 emission filter (Chroma Technology  
450 Corp). All images were captured at an interval of 5 min for 24 h.

451 **Image processing**

452 We used ImageJ (National Institute of Health), Cellprofiler (Broad Institute), and Matlab  
453 (Mathworks) for image processing. ImageJ was used to subtract the background of images  
454 and transform the image format to adapt the software Cellprofiler. Cell segmentation and  
455 tracing were accomplished by the Cellprofiler pipeline. Firstly, cell boundary was identified  
456 based on the Venus signal to track cells at every time point. Then, we quantified the mean  
457 intensity of CFP, FRET, and Venus signals in each cell for every time point. Finally, all these  
458 measurements were exported as EXEL files for the following analysis. Further analysis was  
459 performed by the Matlab. We extracted trajectories of FRET Ratio and iCasp9-mCherry, and  
460 characterized them with the parameter of Td-Dead and Td-iCasp9.

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462 **REFERENCES**

463 1 Fischer U, Schulze-Osthoff K. Apoptosis-based therapies and drug targets. *Cell Death and Differentiation* 2005; **12**: 942–961.

464 2 Zhou X, Di Stasi A, Brenner MK. iCaspase 9 suicide gene system. *Methods in Molecular Biology* 2015; **1317**: 87–105.

465 3 Iuliucci JD, Oliver SD, Morley S, Ward C, Ward J, Dalgarno D *et al.* Intravenous safety 466 and pharmacokinetics of a novel dimerizer drug, AP1903, in healthy volunteers. *Journal 467 of Clinical Pharmacology* 2001; **41**: 870–879.

468 4 Wang X. The expanding role of mitochondria in apoptosis. *Genes and Development*. 469 2001; **15**: 2922–2933.

470 5 Xie X, Zhao X, Liu Y, Zhang J, Matusik RJ, Slawin KM *et al.* Adenovirus-mediated 471 tissue-targeted expression of a caspase-9-based artificial death switch for the treatment 472 of prostate cancer. *Cancer Research* 2001; **61**: 6795–6804.

473 6 Kemper K, Rodermond H, Colak S, Grandela C, Medema JP. Targeting colorectal 474 cancer stem cells with inducible caspase-9. *Apoptosis* 2012; **17**: 528–537.

475 7 Nör JE, Hu Y, Song W, Spencer DM, Nuñez G. Ablation of microvessels in vivo upon 476 dimerization of iCaspase-9. *Gene Therapy* 2002; **9**: 444–451.

477 8 Tey SK, Dotti G, Rooney CM, Heslop HE, Brenner MK. Inducible Caspase 9 Suicide 478 Gene to Improve the Safety of Allogeneic T Cells after Haploidentical Stem Cell 479 Transplantation. *Biology of Blood and Marrow Transplantation* 2007; **13**: 913–924.

482 9 Zhou X, Di Stasi A, Tey SK, Krance RA, Martinez C, Leung KS *et al.* Long-term outcome  
483 after haploidentical stem cell transplant and infusion of T cells expressing the inducible  
484 caspase 9 safety transgene. *Blood* 2014; **123**: 3895–3905.

485 10 Tey S-K. Adoptive T-cell therapy: adverse events and safety switches. *Clinical &*  
486 *Translational Immunology* 2014; **3**: e17.

487 11 Zhang P, Raju J, Ullah MA, Au R, Varelias A, Gartlan KH *et al.* Phase I Trial of Inducible  
488 Caspase 9 T Cells in Adult Stem Cell Transplant Demonstrates Massive Clonotypic  
489 Proliferative Potential and Long-term Persistence of Transgenic T Cells. *Clinical Cancer*  
490 *Research* 2019; **25**: 1749–1755.

491 12 Rossignoli F, Grisendi G, Spano C, Golinelli G, Recchia A, Rovesti G *et al.* Inducible  
492 Caspase9-mediated suicide gene for MSC-based cancer gene therapy. *Cancer Gene*  
493 *Therapy* 2019; **26**: 11–16.

494 13 Ramos CA, Asgari Z, Liu E, Yvon E, Heslop HE, Rooney CM *et al.* An inducible caspase  
495 9 suicide gene to improve the safety of mesenchymal stromal cell therapies. *Stem cells*  
496 *(Dayton, Ohio)* 2010; **28**: 1107–1115.

497 14 Wu C, Hong SG, Winkler T, Spencer DM, Jares A, Ichwan B *et al.* Development of an  
498 inducible caspase-9 safety switch for pluripotent stem cell-based therapies. *Molecular*  
499 *Therapy - Methods and Clinical Development* 2014; **1**: 14053.

500 15 Navarro SA, Carrillo E, Griñán-Lisón C, Martín A, Perán M, Marchal JA *et al.* Cancer  
501 suicide gene therapy: a patent review. *Expert Opinion on Therapeutic Patents* 2016;  
502 **26**: 1095–1104.

503 16 Duarte S, Carle G, Faneca H, Lima MCP de, Pierrefite-Carle V. Suicide gene therapy

504 in cancer: Where do we stand now? *Cancer Letters*. 2012; **324**: 160–170.

505 17 Kreso A, O'Brien CA, Van Galen P, Gan OI, Notta F, Brown AMK *et al.* Variable clonal

506 repopulation dynamics influence chemotherapy response in colorectal cancer. *Science*

507 2013; **339**: 543–548.

508 18 Sharma S V., Lee DY, Li B, Quinlan MP, Takahashi F, Maheswaran S *et al.* A

509 Chromatin-Mediated Reversible Drug-Tolerant State in Cancer Cell Subpopulations.

510 *Cell* 2010; **141**: 69–80.

511 19 Cohen AA, Geva-Zatorsky N, Eden E, Frenkel-Morgenstern M, Issaeva I, Sigal A *et al.*

512 Dynamic proteomics of individual cancer cells in response to a drug. *Science* 2008; **322**:

513 1511–1516.

514 20 Spencer SL, Gaudet S, Albeck JG, Burke JM, Sorger PK. Non-genetic origins of cell-

515 to-cell variability in TRAIL-induced apoptosis. *Nature* 2009; **459**: 428–432.

516 21 Paek AL, Liu JC, Forrester WC, Lahav G, Paek AL, Liu JC *et al.* Article Cell-to-Cell

517 Variation in p53 Dynamics Leads to Fractional Killing. *Cell* 2016; : 1–12.

518 22 Roux J, Hafner M, Bandara S, Sims JJ, Hudson H, Chai D *et al.* Fractional killing arises

519 from cell-to-cell variability in overcoming a caspase activity threshold. *Molecular*

520 *systems biology* 2015; **11**: 803.

521 23 Shimbo K, Hsu GW, Nguyen H, Mahrus S, Trinidad JC, Burlingame AL *et al.*

522 Quantitative profiling of caspase-cleaved substrates reveals different drug-induced and

523 cell-type patterns in apoptosis. *Proceedings of the National Academy of Sciences* 2012;

524 109: 12432–12437.

525 24 Crawford ED, Wells JA. Caspase Substrates and Cellular Remodeling. *Annual Review*

526 *of Biochemistry* 2011; 80: 1055–1087.

527 25 Tait S, Green D. Mitochondrial regulation of cell death. *Cold Spring Harbor perspectives*

528 *in biology* 2013; 5: 1–15.

529 26 Shiozaki EN, Chai J, Rigotti DJ, Riedl SJ, Li P, Srinivasula SM *et al.* Mechanism of

530 XIAP-mediated inhibition of caspase-9. *Molecular cell* 2003; 11: 519–27.

531 27 Setiawan D, Kazaryan A, Martoprawiro MA, Filatov M. A first principles study of

532 fluorescence quenching in rhodamine B dimers: How can quenching occur in dimeric

533 species? *Physical Chemistry Chemical Physics* 2010; 12: 11238–11244.

534 28 Ogawa M, Kosaka N, Choyke PL, Kobayashi H. H-type dimer formation of fluorophores:

535 A mechanism for activatable, *in vivo* optical molecular imaging. *ACS Chemical Biology*

536 2009; 4: 535–546.

537 29 Kruitwagen T, Denoth-Lippuner A, Wilkins BJ, Neumann H, Barral Y. Axial contraction

538 and short-range compaction of chromatin synergistically promote mitotic chromosome

539 condensation. *eLife* 2015; 4: 1–19.

540 30 Rehm M, Düßmann H, Jänicke RU, Tavaré JM, Kögel D, Prehn JHM. Single-cell

541 fluorescence resonance energy transfer analysis demonstrates that caspase activation

542 during apoptosis is a rapid process: Role of caspase-3. *Journal of Biological Chemistry*

543 2002; 277: 24506–24514.

544 31 Hörnle M, Peters N, Thayaparasingham B, Vörsmann H, Kashkar H, Kulms D.

545 Caspase-3 cleaves XIAP in a positive feedback loop to sensitize melanoma cells to

546 TRAIL-induced apoptosis. *Oncogene* 2011; **30**: 575–587.

547 32 Kell DB, Oliver SG. How drugs get into cells: tested and testable predictions to help

548 discriminate between transporter-mediated uptake and lipoidal bilayer diffusion.

549 *Frontiers in Pharmacology* 2014; **5**. doi:10.3389/fphar.2014.00231.

550 33 Banta JA, Richards CL. Quantitative epigenetics and evolution. *Heredity*. 2018; **121**:

551 210–224.

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553

554 **FIGURE LEGENDS**

555 **Fig. 1: Construction of iCasp9 system to monitor iCasp9 dimerization and cell fate**

556 **simultaneously in single cells. a,** AP20187-induced apoptosis pathway in iCasp9 cells. **b,**

557 Schematic diagram for induction of iCasp9 dimerization. White half-moon shape represents

558 the DmrB domain which can be bound and dimerized by inducer (grey). White square

559 represents full-length Caspase9, which is tagged with an mCherry fluorescence protein (red).

560 Upon dimerization, the iCasp9-mCherry fluorescence signal will be greatly quenched. **c,** The

561 FRET reporter indicating Caspase3 activity and cell fate. **d,** Microscopy images of merged BF

562 and iCasp9 mCherry channel (upper panel) and merged CFP and FRET channel (lower panel)

563 for iCasp9 cells treated with 0.25 nM AP20187. The blue and the pink arrow indicates a typical

564 survival and dead cell, respectively. Images were taken under a 40 $\times$  confocal fluorescence

565 microscope. **e,** Single-cell profiles of iCasp9-mCherry fluorescence signals in dead cells

566 (shown in pink) and survival cells (shown in blue) after addition of 0.25 nM inducer. **f,** Single-

567 cell profiles of FRET Ratio signals in dead cells and survival cells after addition of 0.25 nM

568 inducer.

569 **Fig. 2: Initial iCasp9 level and XIAP/C3 ratio in survival and dead cells. a and b,** The

570 averaged iCasp9-mCherry fluorescence signal (shown in red) and FRET Ratio signal (shown

571 in purple) in survival cells (**a**) and dead cells (**b**) after treatment of 0.25 nM inducer. The data

572 for survival cells are averaged from 40 independent measurements, and the data for dead

573 cells are averaged from 68 independent measurements. Error bars represent  $\pm$  standard

574 deviation. **c,** The initial iCasp9-mCherry level in survival and dead cell populations treated with

575 0.25 nM inducer. The boxes represent the interquartile range between the first and third  
576 quartiles, whereas the whiskers represent the 95% and 5% values, and the squares represent  
577 the average. **d**, Cell death percentage is plotted against the initial iCasp9-mCherry expression  
578 level. **e**, Western Blot for XIAP (upper panel) and Caspase3 (lower panel) in survival and dead  
579 cells after treating with 0.25 nM inducer for 6 h, 12 h, 18 h, and 24 h. Actin was used as a  
580 loading control. **f-h**, Quantitative analysis of XIAP level (**f**), Caspase3 level (**g**), and XIAP/C3  
581 ratio (**h**) in survival cells (blue) and dead cells (pink) in different time points. **i**, Perturbations of  
582 XIAP or Caspase3 expression level by siRNA. Death percentage for cells treated with XIAP  
583 siRNA (blue) or Caspase3 siRNA (orange) is compared with a negative control (grey). **j**, Death  
584 percentage for cells treated with different concentrations of an XIAP inhibitor AT406 in  
585 combination with 0.025 nM inducer (light blue), 0.25 nM inducer (blue) and no inducer (grey).  
586 Error bars represent  $\pm$  standard deviation. \*  $P < 0.05$ ; \*\*\*\*  $P < 0.0001$ .

587 **Fig. 3: Substantial heterogeneity exists within survival cell population. a and b**, Different  
588 types of cells surviving from the treatment of inducer. The upper panels show representative  
589 images (BF and iCasp9-mCherry merge on top, CFP and FRET merge on bottom) of different  
590 survival cell types. The lower panels show the trajectory of iCasp9 dimerization (red) and  
591 Caspase3 activation (purple) measured from the fluorescence images above. (**a**, left) A  
592 survival cell with low initial iCasp9-mCherry level and no iCasp9-mCherry drop, and a  
593 constantly low FRET Ratio. (**a**, right) A survival cell with high initial iCasp9-mCherry level and  
594 no iCasp9-mCherry drop, and a constantly low FRET Ratio. (**b**, left) A survival cell with low  
595 initial iCasp9-mCherry level and an iCasp9-mCherry drop, and a constantly low FRET Ratio.

596 (b, right) A survival cell with high initial iCasp9-mcherry level and an iCasp9-mCherry drop,  
597 and a slight increase of FRET Ratio. c, The percentage of type 1 and type 2 survival cells in  
598 all survival cells studied. d, The percentage of type1-a and type1-b survival cells in type1  
599 survival cells. e, The percentage of type2-a and type2-b survival cells in type 2 survival cells.  
600 f, The percentage of survival cells with FRET Ratio increase by at least 15% of the initial ratio  
601 in type2-a and type2-b survival cells.

602 **Fig. 4: Cell-to-cell variability of death timing in dead cell population.** a, Fluorescence  
603 signals of iCasp9-mCherry and FRET ratio in a typical dead cell. b, Frequency count of dead  
604 cells with different iCasp9 dimerization time under the condition of 0.25 nM inducer. Inner  
605 image represents a schematic view for iCasp9 dimerization time 'Td-iCasp9', which is defined  
606 as the time duration from adding inducer to the iCasp9-mCherry fluorescence signal reaching  
607 10% higher than the minimum. c, Frequency count of dead cells with different death time under  
608 the condition of 0.25 nM inducer. Inner image represents a schematic view for cell death time  
609 'Td-dead', which is defined as the time duration from adding inducer to the FRET ratio reaching  
610 90% of the maximum. d, Td-dead is plotted against the initial iCasp9-mCherry level in dead  
611 cells. Pearson's correlation is -0.13. e, Td-dead is plotted against Td-iCasp9 in dead cells.  
612 Pearson's correlation is 0.74.

613 **Fig. 5: Inducer dosage affects caspase dynamics, cell-to-cell variability and cell death.**  
614 a, Cell death percentage is plotted against different concentrations of inducer. Data are shown  
615 as mean  $\pm$  standard deviation. b and c, Averaged trajectories of iCasp9-mCherry for dead  
616 cells (b) and survival cells (c) treated with 2.5 nM (orange), 0.25 nM (green) and 0.025 nM

617 (dark blue) inducer. Error bars represent  $\pm$  standard deviation. **d and e**, Initial iCasp9-mCherry  
618 level (**d**) and Td-iCasp9 (**e**) in survival (blue dots) and dead (pink dots) cells after the treatment  
619 of 0.025 nM, 0.25 nM and 2.5 nM inducer. **f**, The trajectories of FRET Ratio for individual dead  
620 cells in the condition of 0.025 nM, 0.25 nM and 2.5 nM inducer (**f**, left panel). Td-dead for dead  
621 cells treated with 0.025 nM, 0.25 nM and 2.5 nM inducer (**f**, right panel). **g**, Percentage of four  
622 survival cases in cell population treated with 0.025 nM, 0.25 nM and 2.5 nM inducer. The boxes  
623 of the box plot represent the interquartile range between the first and third quartiles, whereas  
624 the whiskers represent the 95% and 5% values, and the squares represent the average. \*  $P <$   
625 0.05; \*\*  $P < 0.01$ , \*\*\*  $P < 0.001$ , \*\*\*\*  $P < 0.0001$ .

626 **Fig. 6: Multiple rounds of inducer treatment place selective pressure on protein level**  
627 **and lead to drug resistance. a**, Schematic view of the multi-drugging experiment. Survival  
628 cell population with low FRET Ratio (shown in blue) is collected and re-cultured for two days  
629 before the next round of drugging. **b**, Death percentage for cells after each round of treatment  
630 with 0.25 nM inducer. **c**, Initial iCasp9-mCherry expression in cells before each round of  
631 inducer treatment. The boxes represent the interquartile range between the first and third  
632 quartiles, whereas the whiskers represent the 95% and 5% values, and the squares represent  
633 the average. **d**, Western Blot for XIAP (upper panel) and Caspase3 (lower panel) in cells  
634 before the first (column 1), the second (column 2), and the third (column 3) round of inducer  
635 treatment. Actin was used as a loading control. **e-g**, Quantitative analysis of Caspase3  
636 expression (**e**), XIAP expression (**f**), and XIAP/C3 ratio (**g**) in cells before each round of inducer  
637 treatment. **h**, Percentage of four survival cell types after the first treatment (left pie chart) and

638 after the third treatment (right pie chart) of the inducer. **i**, Death percentage of post-selection  
639 cells at the third round of treatment with either the inducer only or the combination of the  
640 inducer and the XIAP inhibitor. The cells were selected by two rounds of treatment with 0.25  
641 nM inducer only (grey bars) or with a combination of 0.25 nM inducer and 0.1  $\mu$ M XIAP  
642 inhibitor AT406 (yellow-green bars). Data are shown as mean  $\pm$  standard deviation.

643

644 **ACKNOWLEDGEMENTS**

645 We thank Profs. Xiaodong Wang, Jianguo Chen and Ping Wei for kindly providing us the cells  
646 and DNA plasmids, Lucas Carey for helpful discussions, Tanqiu Liu for image analysis, and  
647 Jing Xia for data acquisition (microtubule-mCherry).

648

649 **CONFLICT OF INTERESTS**

650 The authors declare no competing interests.

651

652 **AUTHOR CONTRIBUTIONS**

653 C.T. and Y.Y. designed the project. Y.Y. and Y.L. designed and performed the experiments.  
654 Y.Y., H.R., and S.Q. analyzed the data. C.T. and X.Y. supervised the whole project; Y.Y., X.Y.,  
655 and C.T. wrote the paper.

656

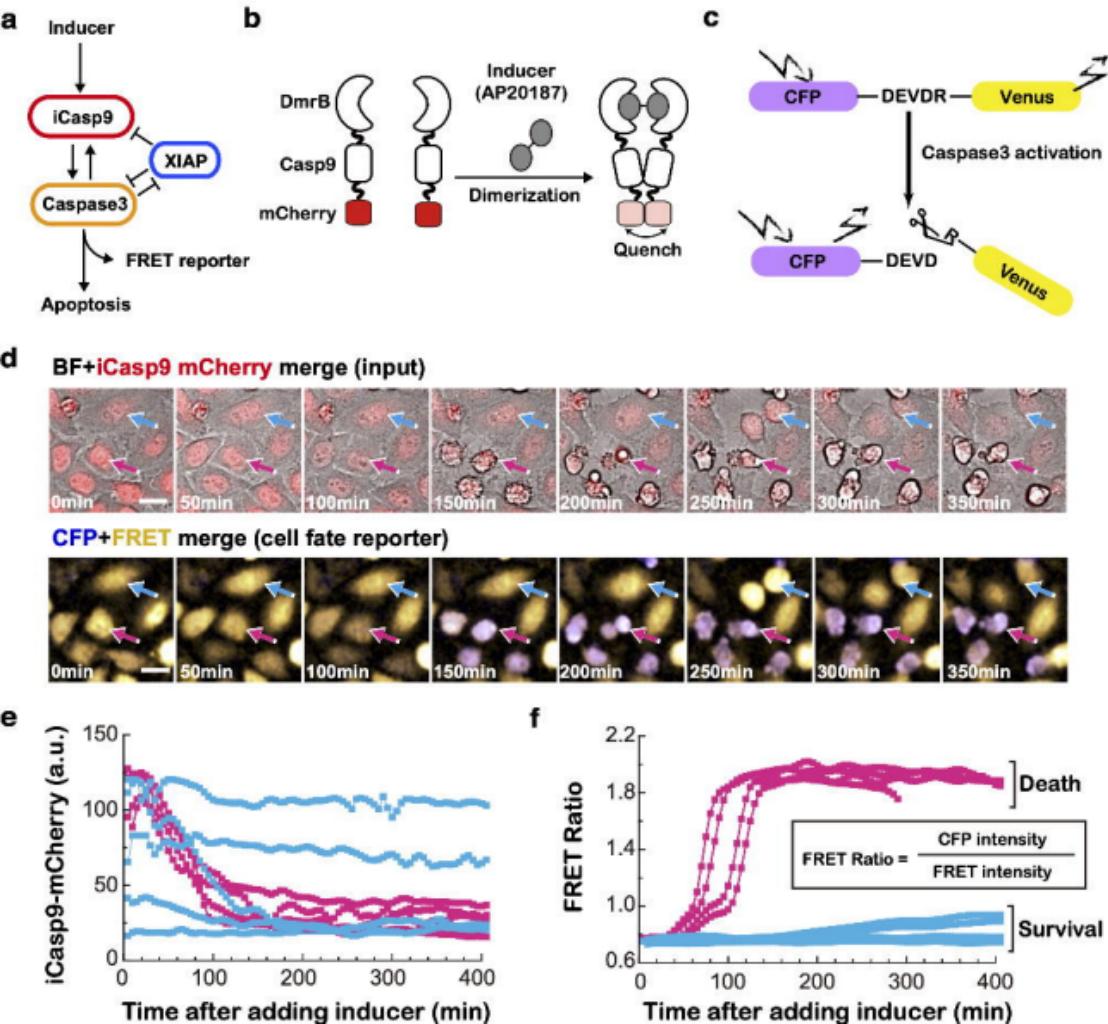
657 **FUNDING**

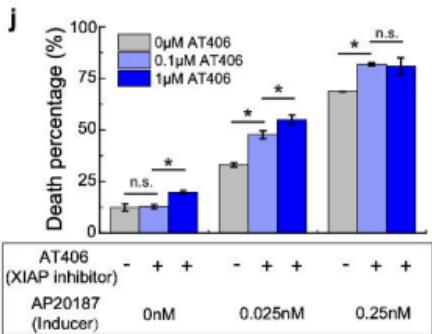
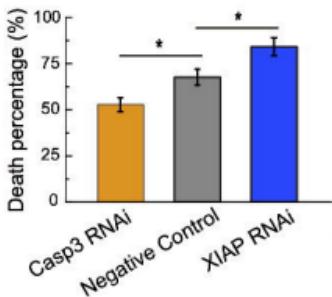
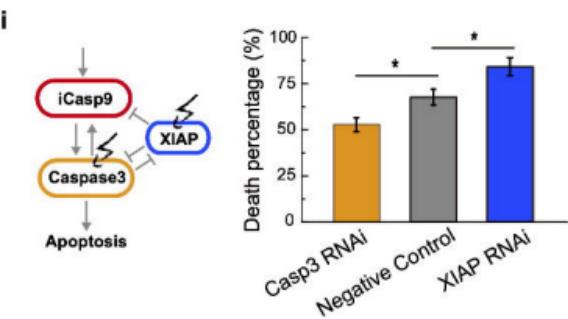
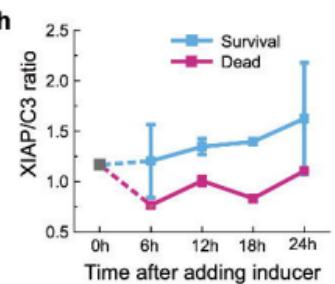
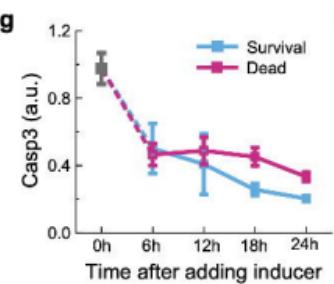
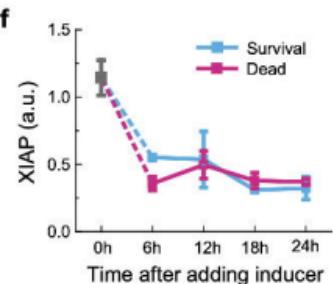
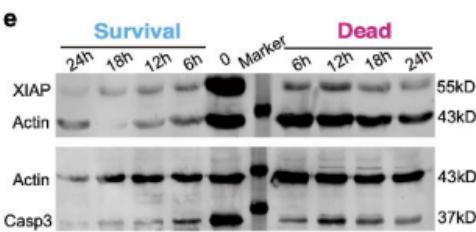
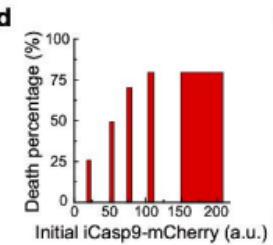
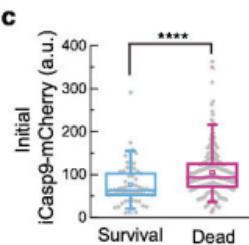
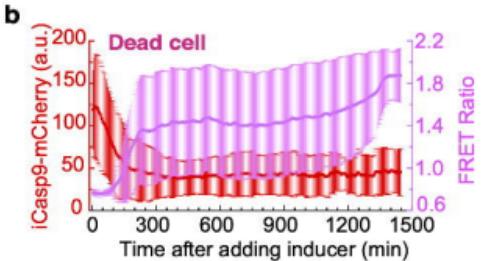
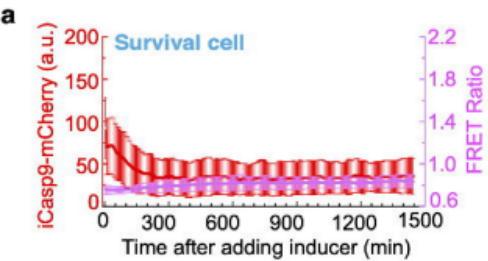
658 This work was supported by The National Key Research and Development Program of China:  
659 2018YFA0900700 and the National Natural Science Foundation of China (12090053 and  
660 32088101).

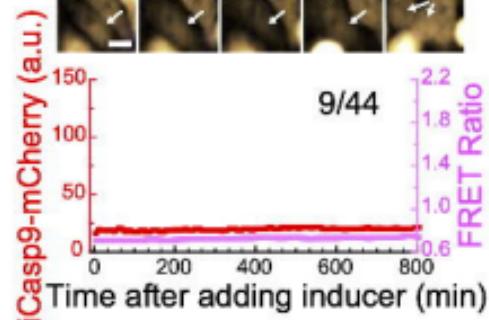
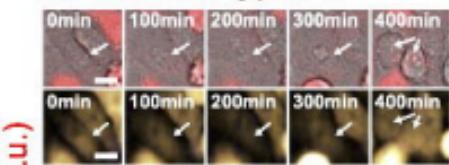
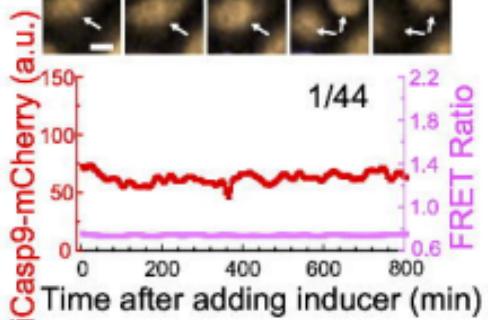
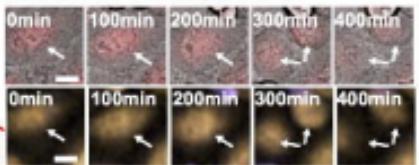
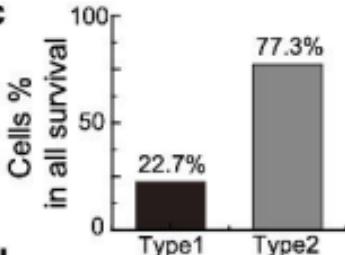
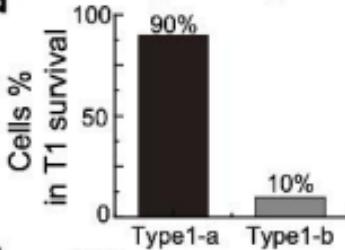
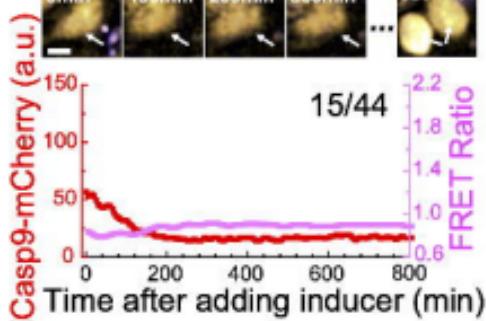
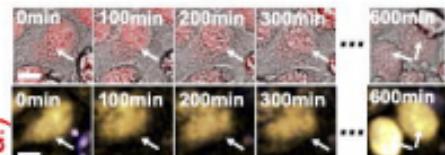
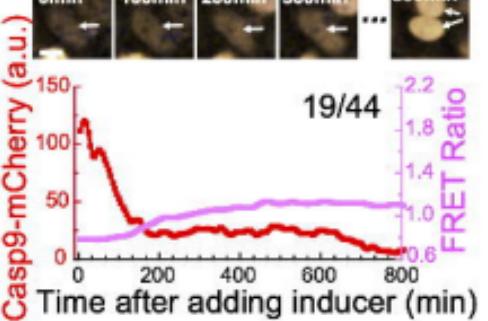
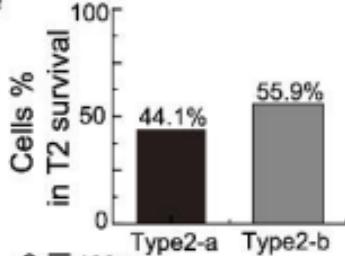
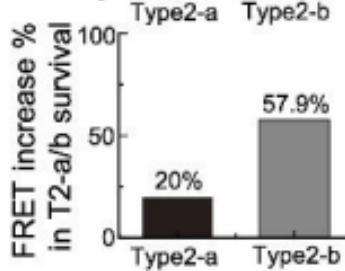
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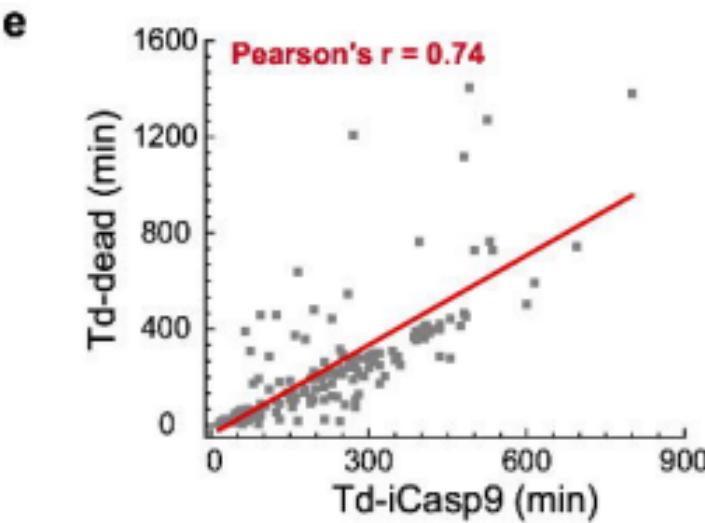
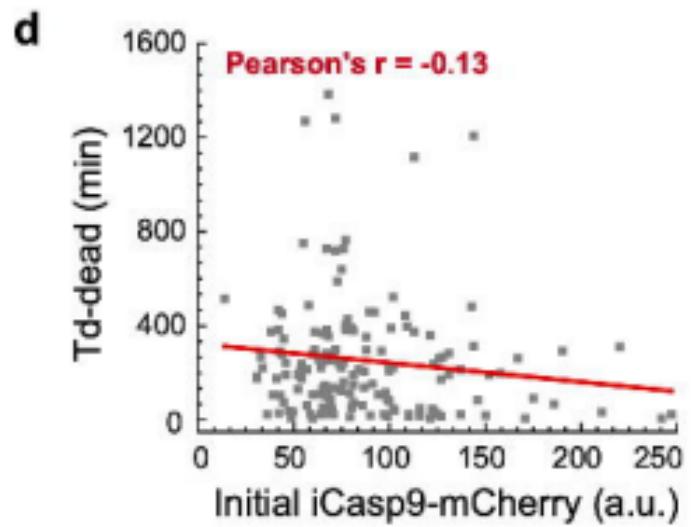
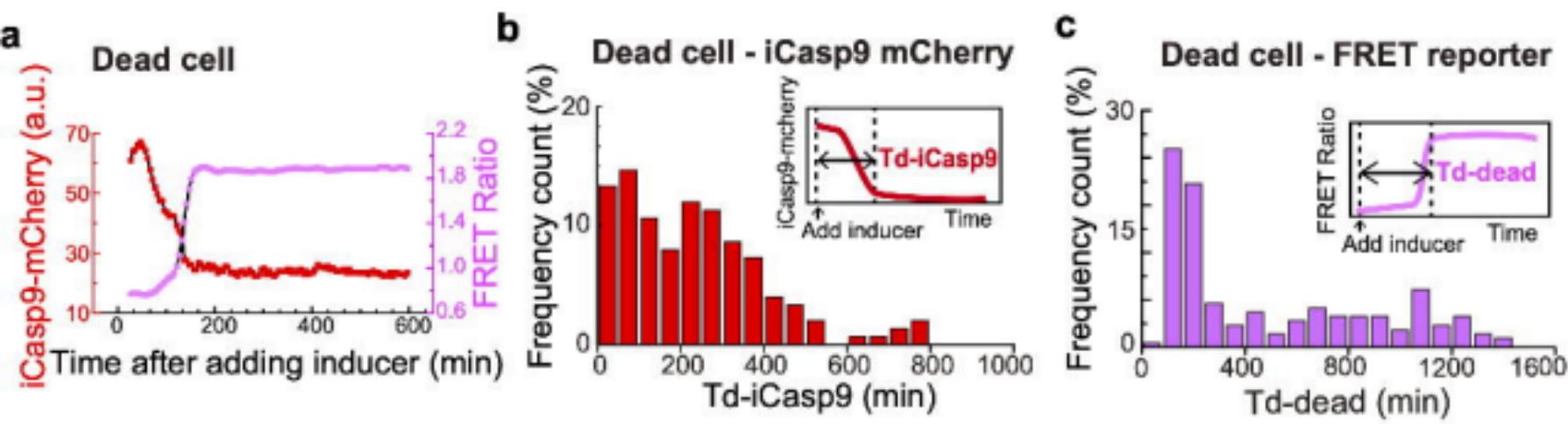
662 **Data Availability Statement**

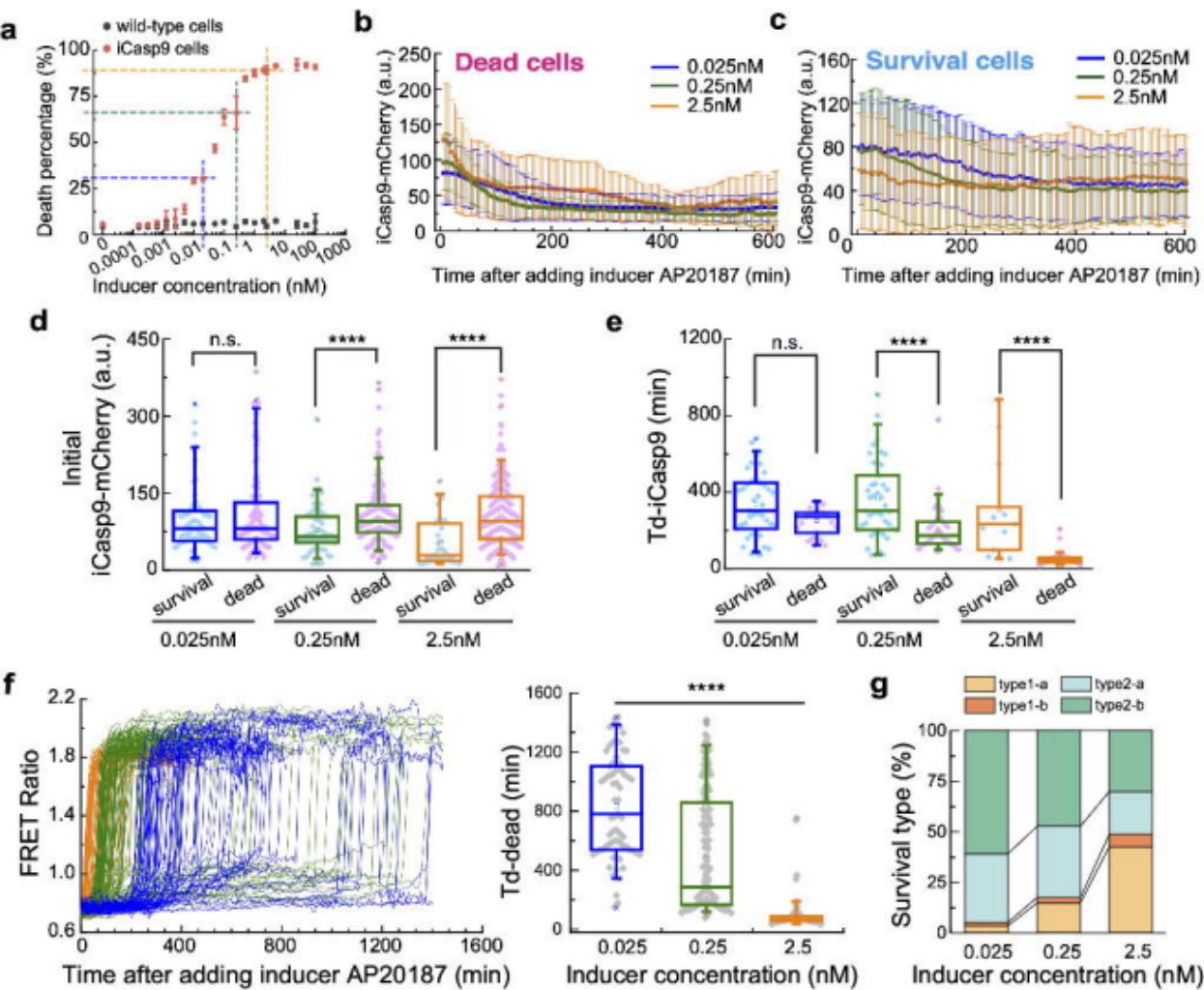
663 All data generated or analyzed during this study are included in the main text and the  
664 supplementary information files.

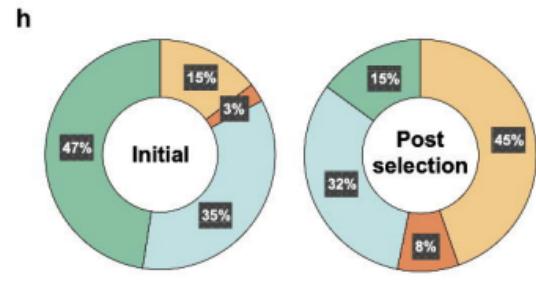
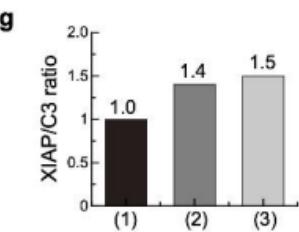
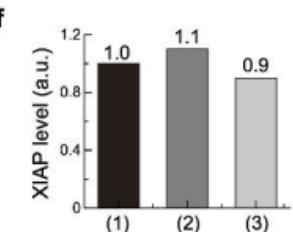
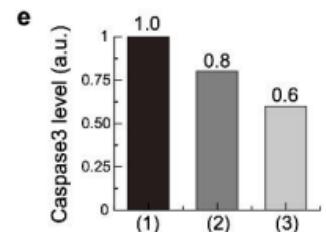
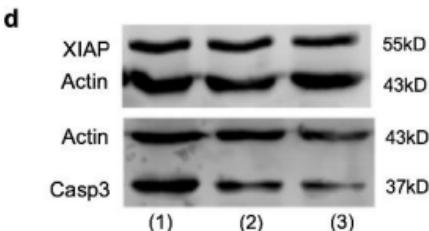
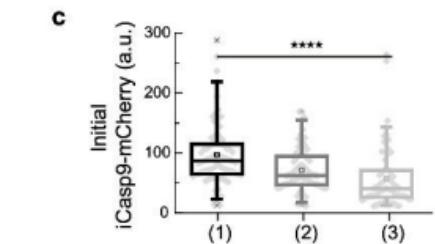
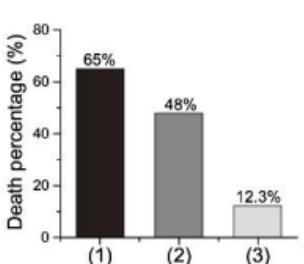
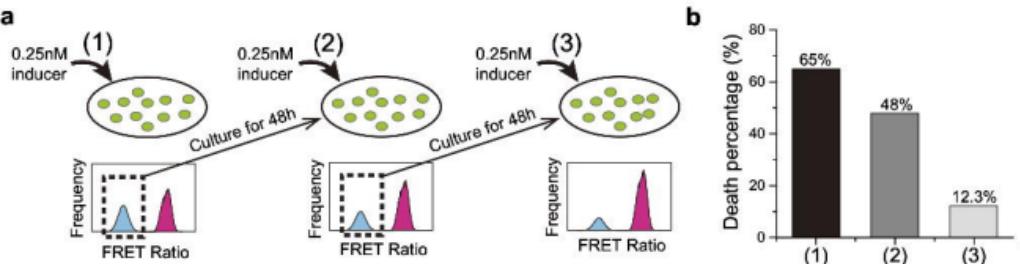




**a****Survival cell type1-a****Survival cell type1-b****c****d****b****Survival cell type2-a****Survival cell type2-b****e****f**







Survival type1-a  
Survival type1-b  
Survival cell type2-a  
Survival cell type2-b

