1 A model of Zebrafish Avatar for co-clinical trials

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20 COMPETING INTERESTS

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23 ABSTRACT

24 Animal "Avatars" and co-clinical trials represent an emerging concept for implementing schemes of personalized medicine in oncology. In a co-clinical 25 26 trial, the cancer cells of the patient tumor are xenotransplanted in the animal 27 Avatar for drug efficacy studies and data collected in the animal trial are used 28 to plan the best drug treatment in the patient trial. Recently, zebrafish has been proposed for implementing Avatar models but the lack of a general 29 30 criterion for chemotherapy dose conversion from humans to fishes represents a limitation for conducting co-clinical trials. 31

Here, we validate a simple, reliant and cost-effective Avatar model based on the use of zebrafish larvae; by crossing data from safety and efficacy studies, we found a basic formula for the estimation of the dose to be used for running co-clinical trials and we validate it in a clinical study enrolling 24 adult patients with solid cancers (XenoZ, NCT03668418).

37 ABBREVIATIONS

38 5-FU, 5-Fluorouracil; dpf, days post fertilization; DMEM, Dulbecco's modified Eagle's medium; FBS, fetal bovine serum; ECF, 5-Fluorouracil + Cisplatin + 39 Epirubicin; FLOT, 5-Fluorouracil + Lederfolin + Oxaliplatin + Docetaxel; 40 41 FOLFIRI, 5-Fluorouracil + Lederfolin + Irinotecan; FOLFOX, 5-Fluorouracil + Lederfolin + Oxaliplatin; FOLFOXIRI, 5-Fluorouracil + Lederfolin + Oxaliplatin 42 + Irinotecan; GEM, Gemcitabine; GEMCIS, Gemcitabine + Cisplatin; 43 44 GEM/nab-P, Gemcitabine + nab-Paclitaxel; GEMOX, Gemcitabine + 45 Oxaliplatin; hpf, hours post fertilization; hpi, hours post injection

47 INTRODUCTION

48 Precision medicine refers to the approaches for tailoring a medical treatment 49 to the individual characteristics of each patient (1). In particular, the "Mouse Avatar" is an emerging approach of precision medicine in oncology that has 50 51 recently grown in importance (2); it implicates the xenotransplantation of 52 cancer cells from patient tumor sample in mouse models to use them in drug efficacy studies. Mouse Avatars can be used to run "co-clinical trials" (3). In a 53 54 co-clinical trial, the patient and murine trials are concurrently conducted and the drug efficacy response of the mouse study provides data to plan the best 55 drug treatment of the patient tumor (4). The advantage of this approach is that 56 each patient has his/her own tumor growing in an *in vivo* system, thereby 57 allowing the identification of a personalized therapeutic approach. Nowadays, 58 59 there are companies providing mouse Avatar generation and drug testing 60 services to patients at a cost of tens thousands of dollars (5). The high cost is directly associated to the time-consuming process and the requirement of 61 62 immunosuppressed strains (6). Unfortunately, this makes Avatars a cuttingedge technology available only for few people, posing a serious threat to the 63 equal right to health for everyone. Recently, it has been proposed the use of 64 zebrafish to make Avatars available for every patient and the approach 65 66 sustainable for National Healthcare Systems. Zebrafish cancer models 67 overcome the drawbacks of xenografts in mice (7). Zebrafish is highly fecund, 68 develops rapidly and requires simple and inexpensive housing. Zebrafish embryos are transparent, allowing to image the engrafted cells in vivo, and 69 70 they have high permeability to small molecules such as drugs used for chemotherapy. Last but not least they have low ethical impact when used in 71

72 the larval stage from fecundation to 120 hours post fertilization (hpf) (8). 73 Zebrafish larvae as model for human cancer cell xenografts have been firstly reported in 2005 (9). Since then, the use of zebrafish in vivo model of 74 75 xenotransplantation has increased considerably (10). Several human cancer cells lines e.g. melanoma, glioma, adenocarcinoma, breast, pancreas and 76 prostate cancer cell lines (11) as well as fragments of human cancer tissues 77 78 (12) have been tested to date in zebrafish as engraftment host. Larvae provide a rejection-free permissive environment, where the xenotransplanted 79 80 human cancer cells rapidly proliferate, migrate, form masses and induce neo-81 angiogenesis, after injection (13). Most importantly, zebrafish larvae xenografts provide similar chemosensitive response of mouse xenografts 82 83 (14).

84 However, in order to move forward in new paradigm of co-clinical trial using zebrafish Avatars, some critical aspects need to be solved. The biggest issue 85 86 is related to the lack of the "equivalent dose" for translating the chemotherapy 87 dosage used in humans to zebrafish larvae because one cannot apply the interspecies allometric approach for dose conversion from human to animal. 88 The caveat is that chemotherapy drugs have to be administered in the fish 89 90 water rather than injected as parenteral formulations. Therefore, drug safety 91 and efficacy assessments are necessary to estimate the equivalent dose to 92 administer (15). The present study aims to fill the gap regarding the dose 93 conversion between zebrafish larvae and humans. A safety/efficacy study has 94 been carried out in HCT 116 and MIA PaCa-2 cancer cell lines by testing 10 different chemotherapy regimens used in cancer treatment, i.e. FOLFOX (5-95 96 Fluorouracil + Lederfolin + Oxaliplatin), FOLFIRI (5-Fluorouracil + Lederfolin +

97 Irinotecan), FOLFOXIRI (5-Fluorouracil + Lederfolin + Oxaliplatin + Irinotecan), ECF (5-Fluorouracil + Cisplatin + Epirubicin), FLOT (5-98 Fluorouracil + Lederfolin + Oxaliplatin + Docetaxel), GEMCIS (Gemcitabine + 99 100 Cisplatin), Gem/nab-P (Gemcitabine + nab-Paclitaxel), GEMOX (Gemcitabine + Oxaliplatin), Gemcitabine, 5-Fluorouracil. We found a general criterion for 101 dose equivalence that has been validated on zebrafish Avatar receiving fresh 102 103 tissue fragments taken from surgical specimens of patients underwent 104 surgical operation for hepato-biliary-pancreatic cancer and gastro-intestinal 105 cancer.

106 RESULTS

107 Zebrafish safety study

108 Dose-response analysis for the determination of the effects of chemotherapy treatment on larvae was based on the evaluation of the phenotype resulting 109 110 from the exposure (i.e. normal, aberrant and dead). In particular, we exposed larvae to 10 different chemotherapy treatments (GEM, GEMOX, GEM/nab-P, 111 GEMCIS, 5-FU, FOLFOX, FOLFIRI, FLOT, FOLFOXIRI, ECF, see 112 113 supplementary tables S1 and S2) for 72 hours, from 48 to 120 hpf (Figure 1). Chemotherapy treatments induced death and a variety of malformations in 114 larvae, including yolk sac edema, pericardial edema and spine deformation. 115 For all regimens, deviation from phenotype without defect (normal phenotype) 116 117 increased with the increase of drug concentration. Linear regression analysis showed an excellent relationship between the linear or logarithmic 118 119 concentration of the chemotherapy drug and the incidence of normal phenotype (R²>0.95; p<0.05 for any protocol tested) or the incidence of 120

mortality ($R^2>0.87$; p<0.05 for any protocol tested), (Figure 1). For any chemotherapy treatment, the dose that is lethal to 25% of the population (LD25) and the concentration at which 50% of the normal phenotype is inhibited (IC50) was determined (Figure 2A). Such data were also expressed as Conversion Factor (CF):

126
$$CF = \frac{EPC}{LC25}$$
 or $CF = \frac{EPC}{IC50}$ Eq.1

127 With EPC defined as human Equivalent Plasma Concentration, given by:

128
$$EPC = \frac{M}{V}$$
 Eq.2

. .

M being the total amount (mg) of chemotherapy administered to humans by
the clinicians involved in the present study, *V* (ml) being the mean volume of
human plasma (the EPC value for each regimen is given in table S2).

In the present study, we fixed the 75 percentiles of the box plots (Figure 2B) as CF corresponding to the maximum tolerated doses (MTDs). Interestingly, this value was similar for the 2 conditions, i.e. CF=4.1 and CF=4.6 for EPC/LD25 and EPC/IC50, respectively. Consequently, the toxicity study established a conversion factor $4.6 \le CF < \infty$ as the range for the determination of the equivalent dose required for running co-clinical trials with an acceptable safety level for the zebrafish trial.

Figure 1 Chemotherapy toxicity study. Zebrafish embryos 2 dpf were incubated with media (E3 supplemented with 10000 U/ml penicillin and 100 µg/ml streptomycin) modified with chemotherapy drugs or not modified at 35°C for 3 days. At the end of the treatment the percentage of dead embryo (red), aberrant (blue) and normal phenotype (green) was evaluated after fixation and stereomicroscope observation. In GEM, GEMOX, GEM/nab-P,

GEMCIS we reported the Gemcitabine concentration in the x-axis. In 5-FU, FOLFOX, FOLFIRI, FLOT FOLFOXIRI, ECF we reported the 5-Fluorouracil concentration in the x-axis. Control group showed an alteration from normal phenotype \leq 10%. For each chemotherapy regimen a dose-response and the relative linear regression analysis of the normal phenotype and the dead embryos are shown. The resulting R square is reported. The results presented are a pool from three independent biological replicates (n=90).

Figure 2 Estimation of the maximum tolerated dose. (A) Table and (B) box
 plot displaying EPC/IC50 EPC/LD25 ratios for all chemotherapy protocols.

154 Zebrafish efficacy study

For the estimation of the equivalent dose, we conducted an *in vivo* efficacy 155 study based on human cancer cell lines, whose chemosensitivity has been 156 157 already characterized in the literature. Specifically, 2 dpf larvae were xenotransplanted with Dil-stained human colorectal carcinoma cell line (HCT 158 159 116) or human pancreatic carcinoma cell line (MIA PaCa-2) into the yolk sac. 160 To confirm the presence of the xenograft, injected larvae were screened by fluorescence microscopy 2 hours post injection (hpi). The screened larvae 161 were randomly distributed in a multiwell plate (1 embryo/well) and equally 162 163 divided among groups (control and chemotherapy regimens). In absence of chemotherapy, the Dil-stained area shows a statistically significant increase 164 165 over the time (Figure 3, control group) and the block or the inversion of this tendency has been considered in the present study as a hallmark of 166 chemotherapy effect. Indeed, we tested 4 chemotherapy regimens (5-FU, 167 FOLFOX, FOLFOXIRI, FOLFIRI), which are the standard of care for the 168

treatment of colorectal cancers, on HCT 116 cells xenotransplanted in 2 dpf 169 larvae. According to the toxicity study, we used conversion factors CF>4.6. 170 First, a CF=8 was tested but data showed a statistically significant increase of 171 172 the Dil-stained area at 1 dpi and 2 dpi for all the regimens, suggesting the inefficacy of chemotherapy treatment at the CF used (Figure 3A). Therefore, 173 174 we tested chemotherapy protocols at a higher concentration, corresponding to 175 CF=5. Interestingly, FOLFOXIRI were found to inhibit the increase of the 176 stained area at 1 dpi and 2 dpi (p>0.05), as opposite to the control, 5-FU, 177 FOLFOX and FOLFIRI that showed a statistically significant progression (Figure 3B). The effect of FOLFOXIRI treatment was also confirmed by 178 179 quantification of apoptosis in xenotransplanted (Dil-positive) cells revealing a 180 significant increase of pyknotic nuclei with respect to the control group (no 181 chemotherapy drugs) (Figure S1A).

The next step was to confirm the value of CF=5 for dose equivalence by 182 183 testing its efficacy on a different model, i.e. xenotransplanted larvae receiving MIA PaCa-2 cell line. Indeed, we tested 4 chemotherapy regimens (GEM, 184 185 GEMOX, GEM-Nab, FOLFOXIRI), which are the standard of care for the treatment of pancreatic cancers, on MIA PaCa-2 cells xenotransplanted in 2 186 187 dpf larvae. GEM and GEM-Nab-P proved to be the most efficient regimens, 188 with no statistically significant increase of the Dil-stained area at 1 dpi and 2 dpi, as opposite to the control, GEMOX and FOLFOXIRI (Figure 3C). 189

Figure 3 Efficacy analysis. Evaluation of the effects of chemotherapy on cancer cell lines (HCT 116, MIA PaCa-2) xenotransplanted in 2dpf zebrafish embryos. Each embryo was imaged at 2 hpi, 1 dpi, 2 dpi and the relative area is the Dil-stained area normalized with respect to the 2 hpi time point. (A)

Chemosensitivity of HCT 116 xenografts, CF=8. A statistically significant 194 increase of relative area was observed in all groups. (B) Chemosensitivity of 195 HCT 116 xenografts, CF=5. A statistically significant increase of relative area 196 197 was observed in control, 5-FU, FOLFOX and FOLFIRI but not in FOLFOXIRI. (C) Chemosensitivity of MIA PaCa-2 xenografts, CF=5. A statistically 198 significant increase of relative area was observed in control, GEMOX and 199 200 FOLFOXIRI treatments but not in GEM and GEM/nab-P. Data are mean \pm SEM and representative of three independent assays. $n \ge 15$ (embryos), 2-way 201 ANOVA followed by Bonferroni correction (all groups compared against k 202 group). * p < 0.05; ** p < 0.01; *** p< 0.001; **** p< 0.0001. 203

204 Zebrafish Avatar

A total of 6 patients operated for adenocarcinoma of the colon (n=3), 205 206 pancreatic ductal adenocarcinoma (n=1), and gastric adenocarcinoma (n=2) 207 have been enrolled in the study (NCT03668418) to establish the zebrafish Avatar model. In order to preserve the tumor micro-environment, we decided 208 to xenotransplant fresh tissue fragments screened by the histopathology unity 209 210 of the Azienda Ospedaliera Universitaria Pisana, by modifying the protocol 211 published by Margues et al. (12). Briefly, the tissue was Dil/DiO-stained, disaggregated using Dumont forceps (No.5) into a relative size of $\frac{1}{2}-\frac{1}{4}$ the 212 213 size of the yolk and xenotransplanted in the yolk of 2 dpf larvae. After 214 transplantation, larvae were incubated for 2 h at 35°C, then screened to check for presence of the stained tissue and imaged at 2 hpi, 1 dpi and 2 dpi. Cell 215 216 engraftment was also confirmed by histological analysis performed at 2 dpi. Hoechst staining documents healthy cell nuclei (Figure S1B) and H&E 217 staining shows the presence of cancer cells that have the typical round-shape 218

morphology with large nuclei (Figure S2A). Interestingly, H&E staining 219 performed on zebrafish embryos xenotransplanted with fragments of normal 220 tissue taken from normal mucosa or pancreatic parenchyma of the surgical 221 specimen do not show any cell with typical cancer morphology but exclusively 222 cells with a typical fibroblast-like shape (Figure S2B). In order to perform the 223 analysis, we measured the size of the region of interest (ROI) corresponding 224 225 to the stained area at 2 hpi, 1 dpi and 2 dpi (Figure 4A3-C3). The mean size 226 of the tumor mass area measured in each time point was normalized with 227 respect to the 2 hpi time point. We found an increase of the stained area 228 versus time in all cases, which was statistically significant at 2 dpi with respect to the time point 2 hpi for 5 patients of 6 (83%, Figure 5). According to this 229 230 finding, the measure of the size of the relative stained area at 2 dpi has been 231 fixed as primary measure of the study. Sporadically we also detected cancer cell migration (Figure S3). 232

Figure 4 A representative larva xenotransplanted with a fresh tumor specimen of gastric cancer (patient S013). Bright-field images of the grafted larvae (A1-C1), epi-fluorescence images (A2-C2) and overlay (A3-C3), showing the region of interest (ROI; yellow line). All images are oriented so that rostral end is on the left and dorsal end is on the top.

Figure 5 Quantitative analysis of six cases of patient-derived tumor xenografts. Dil-stained area at time point 2 hpi, 1 dpi and 2 dpi was normalized with respect to the time point 2 hpi. Patient enrollment code is reported (C=Colon, P=Pancreas, S=Stomach) and the number of embryos analyzed for each case study is indicated in the image. Results are expressed

243 as mean \pm SEM. * p < 0.05; ** p < 0.01 by 1- way ANOVA followed by 244 Bonferroni correction (1 dpi and 2 dpi compared against 2 hpi).

245 Zebrafish trial

24 adult patients with pancreatic cancers (n=12), colon cancer (n=8) and 246 247 gastric cancers (n=4) undergoing a chemotherapy treatment have been 248 recruited for this part of the study. After surgery and histopathology screening, 249 patient biopsies have been xenotransplanted in 100 zebrafish embryos and 250 injected embryos were randomly allocated among 5 groups (4 therapeutic 251 options and one control group). Groups were exposed to all chemotherapy 252 options, according to the cancer type, by dissolving the chemotherapy in fish 253 water, according to the equivalent dose corresponding to CF=5. Two days post treatment the response of zebrafish xenografts to the chemotherapy 254 options was analyzed by monitoring the ROI size at 2 hpi, 1 dpi and 2 dpi 255 256 (Figure S4). The chemotherapy protocols tested were 5-FU, FOLFOX, FOLFIRI and FOLFOXIRI for colon cancer; GEM, GEMOX, GEM/nab-P and 257 258 FOLFOXIRI for pancreatic case and FOLFOX, FOLFORI, FLOT and ECF for 259 gastric cancer. We adapted the "Response evaluation criteria in solid tumors (RECIST)" to the fish trial by defining the partial response (PR, at least a 30%) 260 261 decrease in the relative stained area at 2 dpi / 2 hpi, taking as reference the relative stained area at 2 dpi / 2 hpi of the control group) and complete 262 263 response (CR, at least a 90% decrease in the relative stained area at 2 dpi / 2 264 hpi, taking as reference the relative stained area at 2 dpi / 2 hpi of the control group) (Figure 6). For patients affected by colon cancer, we observed a PR in 265 62.5% of patients to FOLFOX, FOLFIRI and FOLFOXIRI but a less frequent 266 267 response (37.5% of patients) to 5-FU; CR was observed only in a limited

number of patients (12.5%) and only to FOLFIRI chemotherapy. For patients affected by pancreatic cancer, we observed a PR to GEM/nab-P (58.33 % of patients), GEM (50%), GEMOX (50%), a limited PR to FOLFOXIRI (33.33 %) but we never observed CR for any chemotherapy treatment. For patients operated for gastric cancer, we observed high incidence of PR to FOLFIRI (100% of patients) but low incidence of PR to FOLFOX, FLOT and ECF (25% of patients); we also observed CR to FOLFIRI in one patient of four.

Figure 6 Percentage of Partial Response (PR) and Complete Response

276 (CR). FOLFOXIRI, FOLFIRI, FOLFOX and 5-FU treatments in Zebrafish Avatar xenotransplanted with colon tumor (n=8 patient case analyzed) (A): 277 GEMOX, GEM/nab-P, GEM, FOLFOXIRI treatments in Zebrafish Avatar 278 xenotransplanted with pancreas tumor (n=12 patient case analyzed) (B); ECF, 279 280 FLOT. FOLFIRI and FOLFOX treatments in Zebrafish Avatar 281 xenotransplanted with gastric tumor (n=4 patient case analyzed) (C).

Interestingly, the zebrafish Avatar can be used to perform chemosensitivity 282 283 assessment on a single patient basis. Four representative case of patient enrolled in the study are given in Figure 7. As for the two cases of colon 284 cancer, we could observe significant response (p=0.03) to FOLFOXIRI 285 treatment in patient C024, and to 5-FU (p=0.05) and FOLFIRI (p=0.02) in 286 patient C031. As for the two cases of pancreatic cancer, FOLFOXIRI proved 287 to be the efficient regimen in patient P025 (p=0.02) and in patient P030 288 289 (p=0.04).

Figure 7 Chemosensitivity assay. 48 hpf embryos were injected with fragments of patient's tumor tissue and treated for 48 hours with different

292 chemotherapy compounds at the CF=5. Representative cases of colon cancer (patient enrolled code: C024, C031) and pancreatic cancer (patient enrolled 293 code: P025, P030) with quantitative analysis of relative tumor area (2 dpi/2 hpi 294 295 for colon and 2 dpi/24 hpi for pancreas). All graphs show an increase of the stained area over the time in control group. The cases C024, P025, P030 296 show a statistically significant regression of the stained area size in 297 298 FOLFOXIRI treated group. The case C031 shows significant stained area reduction in 5-FU and FOLFIRI treated groups. Results are expressed as 299 300 mean ± SEM and analyzed by 1-way ANOVA followed by Dunnett's multiple 301 comparisons test. * p < 0.05, $n \ge 3$.

302 DISCUSSION

Many studies have demonstrated that preclinical models hold great promise 303 for the implementation of personalized medicine strategies (16-18). Mouse 304 Avatar have been proposed and implemented by different research groups, 305 but still have important practical limitations (2, 19, 20). Zebrafish offers distinct 306 advantages over the murine-based co-clinical trials because of the relatively 307 308 simple, rapid and cost-effective method to establish a human tumor xenograft model (21). Zebrafish Avatar approach could be used for evaluating individual 309 patient drug responses in a clinically relevant setting or for the high-310 311 throughput screening of new molecules. Considering the validity of the 312 Zebrafish Avatar and the affordable costs, the possibility to exploit this model 313 in clinical practice has emerged. To do that, the equivalent dose conversion from human to fish need to be identified. 314

315 In this work, we found a general dose conversion criterion based on the 316 following formula:

317
$$C fish = \frac{M}{V} / CF$$

Eq.3

Where c_{fish} (mg/ml) is the chemotherapy concentration in fish water, M is the 318 319 total amount (mg) of chemotherapy administered to humans, V (ml) is the 320 volume of human plasma and CF is the conversion factor that we estimated to 321 be CF=5. We estimated this value by matching data collected from the safety and efficacy studies performed in zebrafish. The safety study was performed 322 on WT larvae. The efficacy study was performed on larvae xenotransplanted 323 324 with human cancer cell line whose response to chemotherapy has been 325 already characterized. Specifically, we found that HCT 116 responded to FOLFOXIRI treatment with higher sensitivity, but not to 5-FU, FOLFOX and 326 327 FOLFIRI at the CF proposed. These results are concordant with the literature 328 suggesting that first-line FOLFOXIRI chemotherapy leads to improved survival 329 and efficacy of metastatic colorectal cancer patient outcomes in comparison to FOLFIRI or FOLFOX chemotherapy (22). We also tested the response of 330 MIA PaCa-2 cells by observing high sensitivity to GEM and GEM/nab-P 331 treatments. This analysis is confirmed by the efficacy data from metastatic 332 333 pancreatic cancer patients treated with GEM/nab-P (23). Such experimental 334 evidences, obtained by testing the efficacy of chemotherapy on two cancer cell lines from different types of human tumor (colorectal and pancreatic), 335 336 suggest that the selected therapeutic dose (corresponding to CF=5) is 337 effective in killing tumor cells and, in principle, predictive of the best 338 pharmacological treatment. Indeed, we suggest the use of the conversion 339 factor CF=5 in any co-clinical trial using zebrafish Avatars. This represents a starting point for any further research step that aims to validate the zebrafish 340 341 Avatars as valuable tools to support the oncologists in the clinical routine.

342 Potential applications are the evaluation of the disease prognosis and chemosensitivity assays for the prediction of the most effective chemotherapy 343 344 scheme. Indeed, we validated an approach consisting in the 345 xenotransplantation of pieces of the patient tumor tissue, after surgery and histopathology screening, in order to obtain a model for testing the response 346 of the patient tumor to the different chemotherapy regimens, with an 347 348 assessment in less than one week (Figure S4). The xenotransplantation of cancer cells isolated and propagated from patient tumors in zebrafish is an 349 350 approach more popular than the xenotransplantation of tissue fragments. 351 Unfortunately, isolated cancer cells tend to lose cell heterogeneity and the stromal contribution. Moreover, during the process of isolation and adaptation, 352 353 clones with a higher proliferative rate than that of the primary tumor are 354 selected and thus they could not be representative of the cancer cell population (24). Indeed, for precision medicine and personalized medicine, 355 356 the xenotransplantation of biopsy or surgical specimen fragments screened by the pathologist would be recommended to develop patient-derived xenografts 357 in which the stromal counterpart and cancer cell heterogeneity are both 358 preserved (25). Our data suggest that fresh tumor tissue transplanted in 2dpf 359 360 larvae can engraft and survive in the host, as documented by histological 361 analysis showing typical cancer cell morphology (H&E staining, Figure S2A) 362 and absence of pyknotic nuclei (Hoechst staining, Figure S1B). The survival rate of the xenografted host was acceptable, at both 1 dpi (81%, n=101) and 363 364 at 2 dpi (68%, n=101). We also detected the capacity of cancer cell extravasion and dissemination in distal tissues (Figure S3). As the relative 365 366 area at 2 dpi/2 hpi has been fixed as primary measure of the study, we

367 performed the efficacy tests under the assumption that a statistically significant decrease of this measure with respect to control group (no 368 chemotherapy) is a hallmark of chemotherapy response. Specifically, we 369 tested chemosensitivity in 24 human tumor fragments taken from surgical 370 specimen. To this purpose, pieces of tumor tissue were microinjected in 371 zebrafish embryos to create Zebrafish Avatar and treated with chemotherapy 372 373 drugs at a concentration corresponding to CF=5. Interestingly, our 374 experimental data have shown good agreement with observations registered 375 in the common clinical practice. In fact, for patients affected by colon cancer 376 (Figure 6A), we found a superiority of the chemotherapy treatment when a combination of drugs are used (FOLFOX, FOLFIRI and FOLFOXIRI) respect 377 378 to the use of only 5-FU (26). Additionally, we found a similar response to 379 FOLFOX and FOLFIRI (27). The higher aggressiveness of pancreatic cancers associated with a lower response to chemotherapy compared to colon and 380 381 gastric cancers may be the reason why a complete response was never 382 observed in our experiments for this group of patients (Figure 6B). For the group of patients affected by gastric cancer (Figure 6C), we found an 383 excellent response to FOLFIRI that can be considered an acceptable first-line 384 385 treatment for advanced gastric cancers (28).

Interestingly, the use of zebrafish Avatars allows to appreciate a different response to different chemotherapy regimens on a single-patient basis (Figure 7). Further tests will be necessary to fully validate the zebrafish Avatar here proposed as a clinical tool predictive of the most effective treatment for each patient. Future experiments will be devoted to enroll in the study a higher number of cases in order to correlate the chemosensitivity results

392 obtained in the animal trial with the response to the chemotherapy treatment 393 observed in the human trial.

394 MATERIALS AND METHODS

395 Zebrafish husbandry

396 Zebrafish (Danio rerio) were handled in compliance with local animal welfare regulations (authorization n. 99/2012-A, 19.04.2012; authorization for 397 398 zebrafish breeding for scientific purposes released by the "Comune di Pisa" 399 DN-16/43, 19/01/2015) and standard protocols approved by Italian Ministry of 400 Public Health, in conformity with the Directive 2010/63/EU. Zebrafish fertilized eggs were obtained by natural mating of *wild-type* fishes at our facilities and 401 402 the developing embryos were staged in incubator at 28°C according to 403 Kimmel et al. (29). Before any procedure, embryos were anesthetized in 0.02% tricaine. 404

405 Cell culture, staining and microinjections

406 The HCT 116 human colorectal carcinoma cells were cultured in McCov's 5A Modified Medium supplemented with 10% fetal bovine serum (FBS), 10000 407 U/ml penicillin and 100 µg/ml streptomycin. The Mia Paca-2 human pancreatic 408 409 carcinoma cells were cultured in DMEM supplemented with 10% FBS, 10000 U/ml penicillin and 100 µg/ml streptomycin. Cells were incubated at 37°C with 410 411 5% of CO₂ in humidified atmosphere. Cells were detached at 80% confluence 412 with 0.25% (w/v) trypsin- 0.53 mM EDTA solution and stained with 10 µg/ml CM-Dil for 15 min at 37°C followed by 15 min on ice in darkness. Cells were 413 414 washed and centrifuged three times by D-PBS and resuspended in D-PBS 415 supplemented with 10% FBS to a final concentration of 100 cells/nl. All the

416 reagents were supplemented by Thermo Fisher Scientific, Waltham, MA.
417 Dechorionated embryos at 2 days post fertilization (dpf) were anesthetized
418 and injected with four nanoliters of cells suspension in the left side of the
419 perivitelline space using a heat-pulled needle and the PV830 Pneumatic
420 PicoPump microinjector. The embryos were incubated at 35°C, and one hours
421 after injection were screened with fluorescence microscope.

422 Human tissue preparation and transplantation into zebrafish embryos

423 The clinical study was approved by the "Comitato Etico Regionale per la 424 Sperimentazione Clinica della Toscana - sezione AREA VASTA NORD OVEST" (09/11/2017, prot n 70213). Human material from surgical resected 425 specimens was obtained from the Azienda Ospedaliera Pisana (Pisa, Italy) 426 427 after written informed consent of the patients and approval of local Ethical 428 Committee. Tumor tissue screened by the histopathologist (from 429 Histopathology unit, Cisanello facility) was washed three times with RPMI supplemented with 10000 U/ml penicillin, 100 µg/ml streptomycin and 100 430 431 µg/ml Amphotericin and cut into small pieces (1-3 mm) using a scalp blade. The pieces were then transferred to a 5 ml tube, and stained with either 40 432 433 µg/ml DiO in D-PBS (in case of esophageal and gastric cancers) or 40 µg/ml CM-Dil in D-PBS (in case of hepato-biliary-pancreatic cancers and intestinal 434 435 cancers). The tissue pieces were incubated for 15 min at 37°C and 15 min in 436 ice cube. Tissue pieces were then washed and centrifuged three times by D-PBS and resuspended in D-PBS supplemented with 10% FBS. For tissue 437 transplantation we used the manual method proposed by Margues et al. 2009 438 439 (12). In particular before transplantation, small pieces of stained tissue were further disaggregated using Dumont forceps (No.5) into a relative size of 1/4 440

441 to 1/2 the size of the yolk. Tissue pieces with the correct size were transferred to 1% agarose disks in multiwell plates in which the 2 dpf embryos were 442 laying, ready for transplantation. A glass transplantation needle was used to 443 transfer the tissue into the yolk. The tissue was picked up, put on top of the 444 yolk and then pushed inside. The yolk usually sealed itself and in the majority 445 of embryos, the tumor remained in the yolk. After transplantation, embryos 446 447 were incubated for 2 h at 35°C, then embryos were checked for presence of tissue and incubated at 35°C in E3 supplemented with 10000 U/ml penicillin 448 449 and 100 µg/ml streptomycin with the presence or absence of drugs for the 450 following days in the respect of the treatment plan.

451 Anticancer drugs toxicity and treatment plan

Groups of 30 embryos (2 dpf) arrayed in multiwell plates were exposed to E3 supplemented with 10000 U/ml penicillin and 100 μ g/ml streptomycin unmodified (control) and modified with the chemotherapy drug at 35°C for 24h added with increasing concentrations (Tables S1, S2).

The drugs were refreshed each day for the three days of treatment plan. 3 days after treatment (3 dpt) zebrafish larvae were fixed in 4% paraformaldehyde in PBS at 4°C over night. After that, they were dehydrated with increasing concentration of ethanol, and analyzed by stereo microscope to evaluate the phenotype (normal, death, aberrant).

461 *Microscopy and efficacy evaluation*

462 Two hours post injection (2 hpi) zebrafish embryos xenotransplanted with 463 cancer cell lines were anesthetized with 0.02% tricaine and positioned 464 laterally, with the site of the implantation to the top. The embryos were imaged

by fluorescence microscope and transferred to a 24-well plate (one embryo/well) containing chemotherapy compounds in E3 supplemented with 10000 U/ml penicillin and 100 μ g/ml streptomycin or E3 supplemented with 10000 U/ml penicillin and 100 μ g/ml streptomycin unmodified (control). All embryos were imaged everyday during the time course of the treatment. The size of the tumor area was measured by using ImageJ.

471 *Histopathology*

At 2 dpi (4 dpf) the xenografted larvae were fixed in 4% paraformaldehyde for
1h at room temperature, followed by paraffin embedding for hematoxylin &
eosin staining or OCT embedding for Hoechst staining. Larvae were
respectively sectioned with microtome or cryostat, along the sagittal plane at a
thickness of 8 μm.

477 Histopathological analysis was performed on paraffin sections stained by
478 hematoxylin & eosin (Merck KGaA, Germany) and digitally imaged using
479 Nikon Eclipse E600 microscope.

480 Cryostat sections were Hoechst 33342 counterstained. Digital images of the 481 stained sections were generated using a Nikon Eclipse Ti. Pyknotic cells was 482 counted at 40 X magnification within the epifluorescence DAPI image.

483 Statistical analysis

We used GraphPad Prism 7 as statistical analysis software. Data analysis
was performed by ANOVA, followed by Bonferroni correction or Dunnett's
post-hoc test or t-test. Statistical significance was set to 5%.

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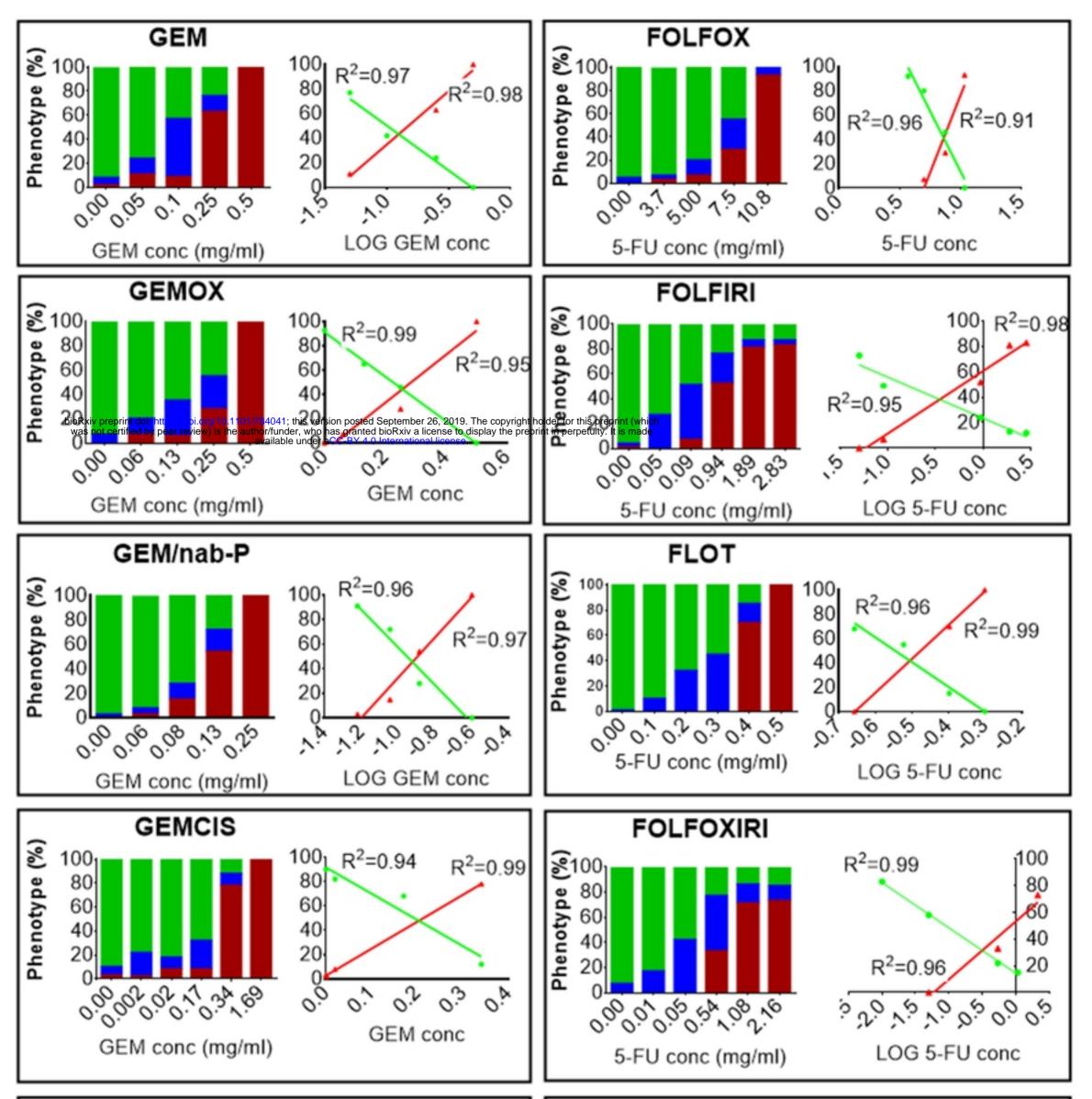
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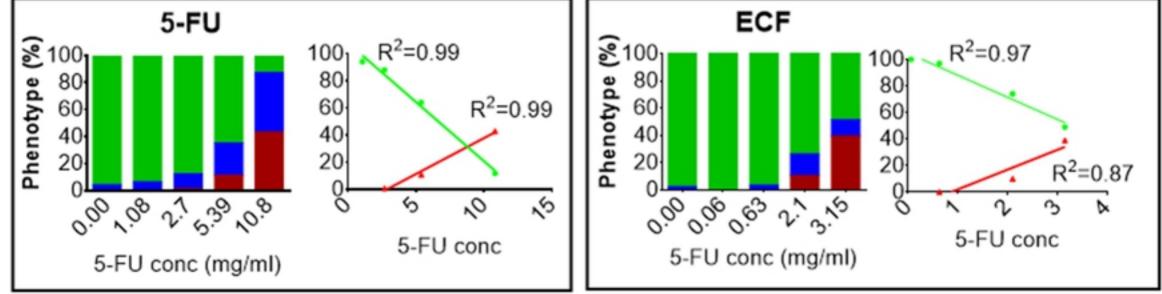
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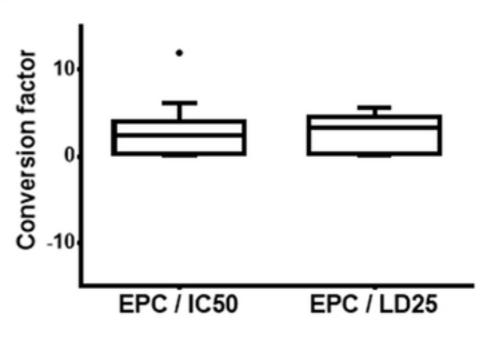
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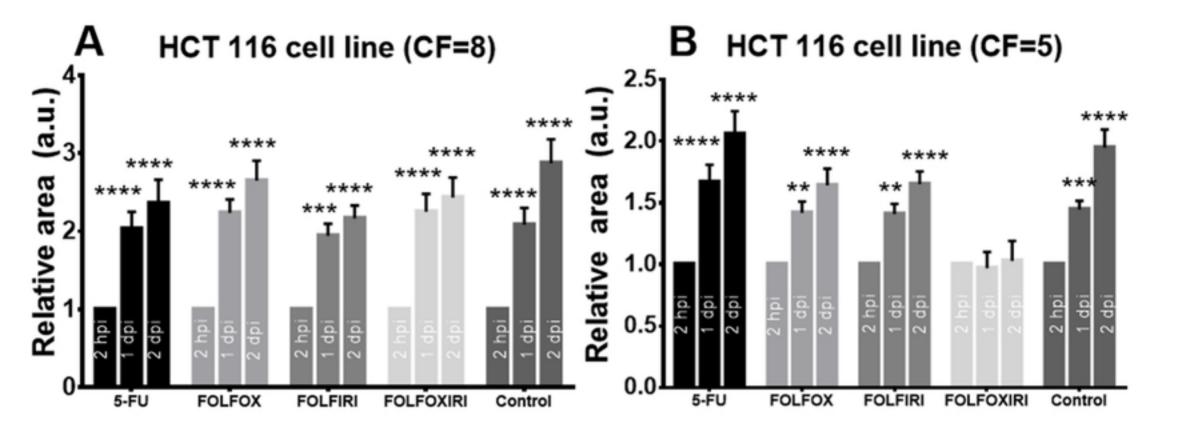


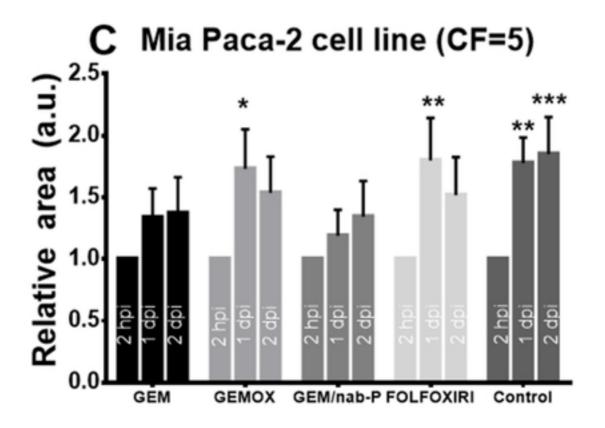


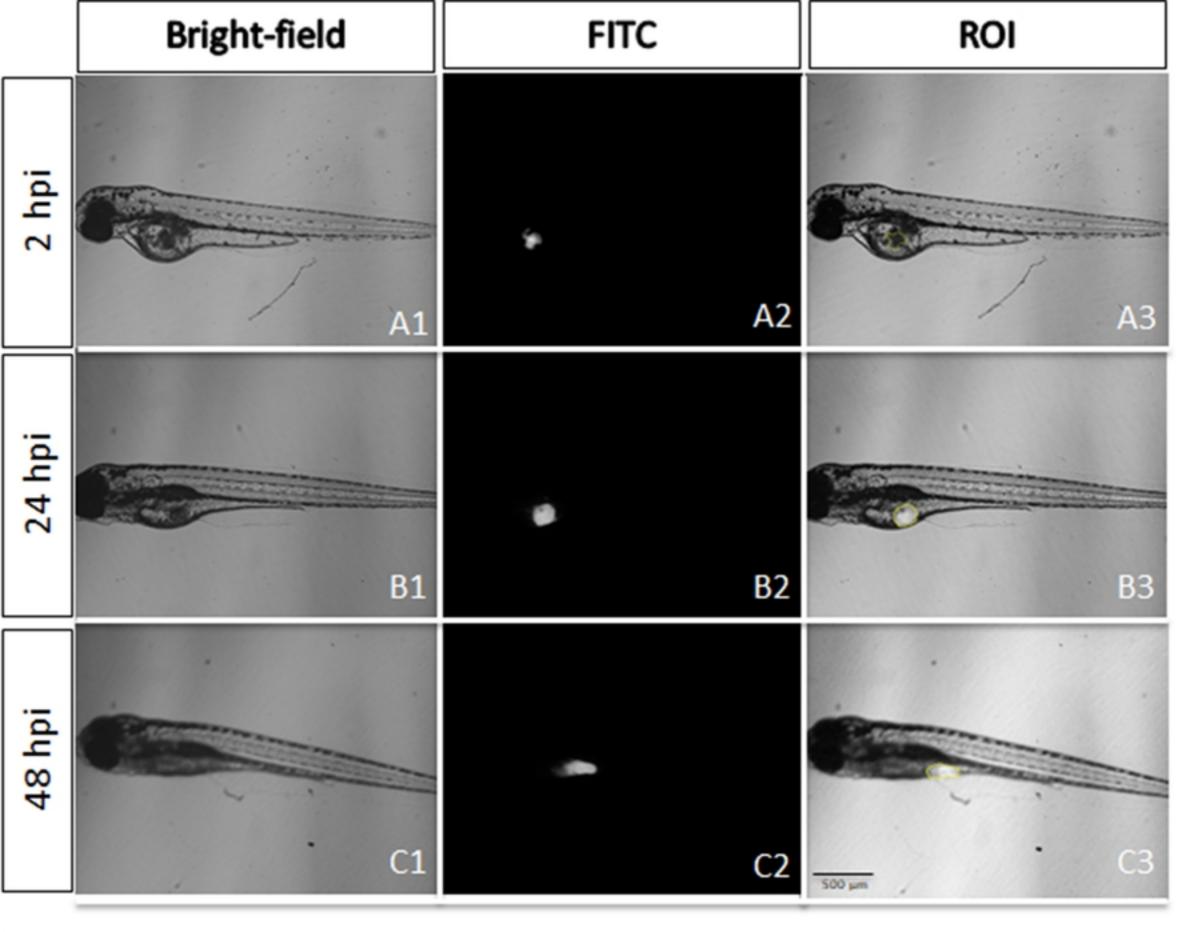
Α

Protocol	EPC / IC50	EPC / LD25
GEM	3,35	4,41
GEMOX	1,5	2,13
GEM/nab-P	3,03	3,77
GEMCIS	1,73	3,35
5-FU	0,16	0,14
FOLFOX	0,14	0,15
FOLFIRI	6,21	5,03
FLOT	3,08	3,23
FOLFOXIRI	11,99	5,55
FCE	0,29	0,37









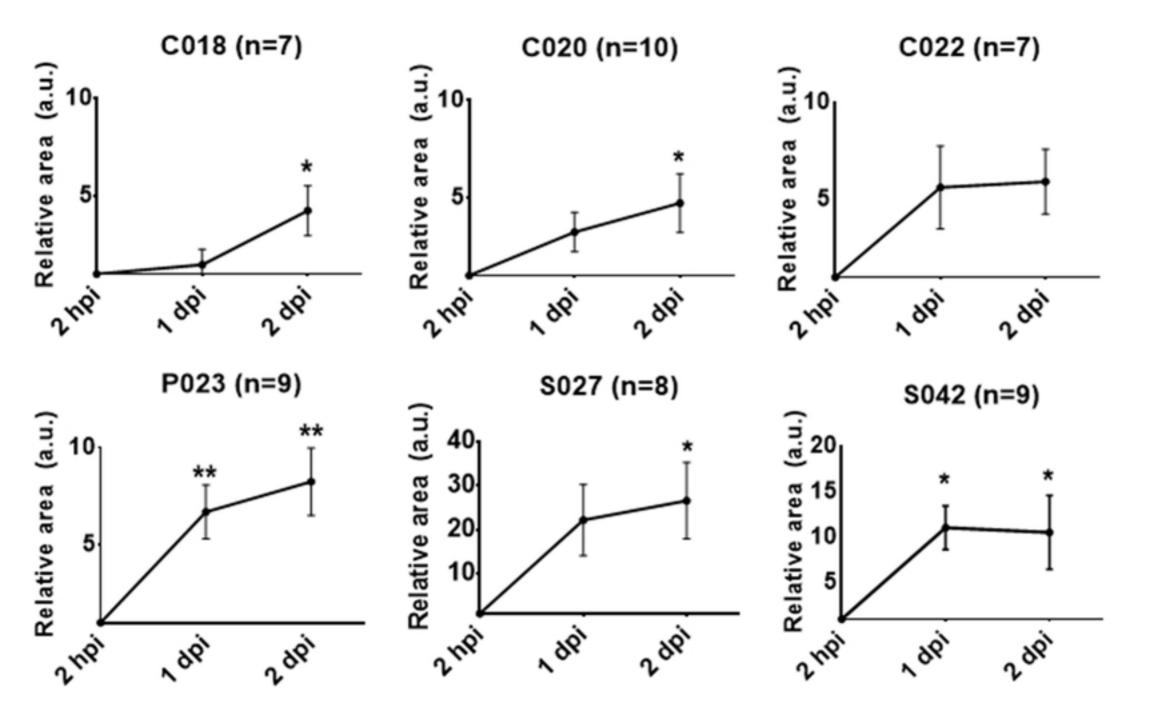


Figure 5

