

Supplementary Materials: A Quantitative Pharmacology Model of Exosome-Mediated Drug Efflux and Perturbation-Induced Synergy

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1. Quantitative Pharmacology-Pharmacokinetic Model

The QP model depicted in Figure 4 comprises two components, PK and PD. The PK component describes the changes of PTX concentrations as functions of binding to tubulin, sorting into exosomes, and efflux by exosomes; the model parameters are presented in Table S2A. The PD component describes the PTX cytotoxicity as a function of tubulin-bound PTX concentration; the model parameters are explained in Table S2B. The model assumptions are (a) unbound drug in medium enters cells by passive diffusion (D_{fd}); (b) saturable drug binding to proteins in extracellular fluid ($B_{medium,max}$, $Kd_{medium,bound}$) and to intracellular tubulin ($B_{tubulin,max}$, $k_{tubulin,on}$, $k_{tubulin,off}$); (c) drug efflux from cells uses a combination of passive diffusion (D_{fd}), Pgp-mediated saturable efflux ($Jmax_{pgp}$, Kd_{pgp}), and first-order release of drug-containing exosomes ($k_{release}$); (d) first-order sorting of intracellular unbound drug and tubulin-bound drug into exosomes, $k_{formation,free}$ and $k_{formation,tubulin}$ respectively through the endosomal transport system; and (e) internalization of drug-containing exosomes through saturable receptor-mediated endocytosis ($Jmax_{inter,exo}$, $Kd_{inter,exo}$). The effects of OME and GW are incorporated into the model as inhibitors of PTX sorting into exosomes (α) and exosome release (β); their values were between zero (no inhibition) and 1 (complete inhibition). Definitions of drug concentrations, transport and binding parameters, and exosome-related parameters are shown in Figure 4 legends.

Equations (S1) and (S2) depict $[PTX_{donor-lysate}]$ and $[PTX_{medium,total}]$. Equations (S3)–(S5) describe the time-dependent changes of $[PTX_{cell,free}]$, $[PTX_{ves}]$, and $[PTX_{tubulin}]$. Equation (S6) describes the changes of $B_{tubulin,max}$ (μM) with time (h) and $[PTX_{cell,free}]$ (nM). Equations (S7)–(S9) describe changes of $[PTX_{medium,free}]$, $[PTX_{exo}]$, and $[PTX_{medium,bound}]$ with time.

$$[PTX_{donor-lysate}] = [PTX_{cell,free}] + [PTX_{ves}] + [PTX_{tubulin}] \quad (S1)$$

$$[PTX_{medium,total}] = [PTX_{medium,free}] + [PTX_{medium,bound}] + [PTX_{exo}] \quad (S2)$$

$$\frac{d[PTX_{cell,free}]}{dt} = \frac{(D_{fd} \cdot [PTX_{medium,free}] - D_{fd} \cdot [PTX_{cell,free}] - \frac{Jmax_{pgp} \cdot [PTX_{cell,free}]}{Kd_{pgp} + [PTX_{cell,free}]} + \frac{Jmax_{inter,exo} \cdot [PTX_{e}]}{Kd_{inter,exo} + [PTX_{e}]} \quad (S3)$$

$$- \alpha \cdot k_{formation,free} \cdot [PTX_{cell,free}] + k_{tubulin,off} \cdot [PTX_{tubulin}] - k_{tubulin,on} \cdot [PTX_{cell,free}] \cdot (B_{tubulin,max} - [PTX_{tubulin}])$$

$$\frac{d[PTX_{ves}]}{dt} = (1 - \alpha) \cdot (k_{formation,free} \cdot [PTX_{cell,free}] + k_{formation,tubulin} \cdot [PTX_{tubulin}]) - k_{release} \cdot (1 - \beta) \cdot [PTX_{ves}] \quad (S4)$$

$$\frac{d[PTX_{tubulin}]}{dt} = k_{tubulin,on} \cdot [PTX_{cell,free}] \cdot (B_{tubulin,max} - [PTX_{tubulin}]) - k_{tubulin,off} \cdot [PTX_{tubulin}] - (1 - \alpha) \cdot k_{formation,tubulin} \cdot [PTX_{tubulin}] \quad (S5)$$

$$B_{tubulin,max} = 59.2 + 0.408 \cdot [PTX_{cell,free}]^{0.2941} \cdot time \quad (S6)$$

$$\frac{d[PTX_{medium,free}]}{dt} = \left(-D_{fd} \cdot [PTX_{medium,free}] + D_{fd} \cdot [PTX_{cell,free}] + \frac{J_{max,Pgp} \cdot [PTX_{cell,free}]}{Kd_{Pgp} + [PTX_{cell,free}]} \right) \cdot \frac{TCN}{V_{medium}} \quad (S7)$$

$$\frac{d[PTX_{exo}]}{dt} = ((1 - \beta) \cdot k_{release} \cdot [PTX_{ves}] \cdot V_{cell} - \frac{J_{max,inter,exo} \cdot [PTX_{exo}]}{Kd_{inter,exo} + [PTX_{exo}]}) \cdot \frac{TCN}{V_{medium}} \quad (S8)$$

$$[PTX_{medium,bound}] = \frac{[PTX_{medium,free}] \cdot B_{medium,max}}{Kd_{medium,bound} + [PTX_{medium,free}]} \quad (S9)$$

For initial conditions (before treatment), $[PTX_{exo}]$ equals zero. $[PTX_{medium,free}]$ and $[PTX_{medium,bound}]$ were calculated from $[PTX_{medium,total}]$ using Equation (S10) (obtained by substituting Equation (S9) into Equation (S2), followed by rearrangement).

$$[PTX_{medium,free}] = \frac{-(Kd_{medium,bound} + B_{medium,max} - [PTX_{medium,total}]) + \sqrt{(Kd_{medium,bound} + B_{medium,max} - [PTX_{medium,total}])^2 - 4 \cdot ([PTX_{medium,total}] \cdot Kd_{medium,bound})}}{2} \quad (S10)$$

2. Quantitative Pharmacology-Pharmacodynamic Model

For the PD component of the QP model, ICN and TCN are respectively the initial and total cell number, and V_{cell} and V_{medium} are respectively the volume of a single cell and extracellular medium; these parameters were experimentally determined or calculated. The PD model describes changes in TCN as a function of drug treatment (concentration and time). Equation (S11) depicts the net change in TCN due to (a) cell growth over time at a rate constant k_{growth} until confluence, and (b) drug-induced cell kill as a function of concentration of tubulin-bound drug. TCN_{ss} is maximal cell number at confluence. k_{kill} is maximum cell kill rate constant. EC_{50} is tubulin-bound drug concentration that generates 50% maximum cell kill, n is the Hill exponent of PTX cytotoxicity. Equation (S12) depicts the time-dependent changes in EC_{50} where $EC_{50,initial}$ is the EC_{50} value at time zero, and γ_{EC50} is the rate of EC_{50} change per unit time t . These PD parameters were fixed as the same values in our previous publication (11).

$$\frac{dTCN}{dt} = k_{growth} \cdot TCN \cdot \left(1 - \frac{TCN}{TCN_{ss}}\right) - k_{kill} \cdot \left(\frac{[PTX_{tubulin}]^n}{[PTX_{tubulin}]^n + EC_{50}^n}\right) \cdot TCN \quad (S11)$$

$$EC_{50} = EC_{50,initial} + \gamma_{EC50} \cdot t \quad (S12)$$

Table S1. PTX cellular pharmacokinetic and pharmacodynamics model parameters. Some parameter values were obtained from the literature and some were obtained from analyzing the experimental results of the current study (indicated as Analysis). Mean values of parameters obtained from Analysis are shown with % CV in parentheses.

| Category | Parameter | Annotation | Value (% CV) | Source |
|--|--|---|---------------------------------|-----------|
| A. Cellular pharmacokinetic model | | | | |
| Pgp-mediated efflux | $J_{max,pgp}$ (pmole·h ⁻¹ ·cell ⁻¹) | Maximum Pgp efflux rate | 2.8×10^{-6} | (20) |
| | Kd_{pgp} (nM) | Dissociation constant of drug from Pgp | 13.9 | (20) |
| Diffusion | D_{fit} (μL·h ⁻¹ ·cell ⁻¹) | Diffusion rate constant of free PTX across cell membrane | 3.34×10^{-3} | (12) |
| Intracellular microtubule binding | $k_{tubulin,off}$ (s ⁻¹) | Rate constant of PTX dissociation from tubulin | 30 | (36) |
| | $k_{tubulin,on}$ (nM ⁻¹ ·s ⁻¹) | Rate constant of PTX association with tubulin | 2 | (36) |
| | NSB | Proportionality constant for nonsaturable binding in cells | 0.148 | (20) |
| Binding to extracellular fluid | $B_{medium,max}$ (μM) | Maximal extracellular drug binding sites | 3.94 | (20) |
| | $Kd_{medium,bound}$ (nM) | Dissociation constant of PTX from extracellular binding sites | 781 | (20) |
| | V_{cell} (μL) | Volume of single cell | 2.06×10^{-6} | (12) |
| | V_{medium} (μL) | Medium volume | 1000 | Assigned |
| | NSB | Nonsaturable binding | 0 | |
| Exosome formation, release and internalization | $J_{max,inter,exo}$ (pmole·h ⁻¹ ·cell ⁻¹) | Maximum rate of endocytosis of extracellular exosomes | 0.038 | (11) |
| | $Kd_{inter,exo}$ (nM) | Dissociation constant of exosomes from endocytosis receptor | 63 | (11) |
| | $k_{formation,free}$ (h ⁻¹) | Rate constant for sorting intracellular PTX _{cell,free} into exosome | 31 | (11) |
| | $k_{formation,tubulin}$ (h ⁻¹) | Rate constant for sorting intracellular PTX _{tubulin} into exosome | 0.02 (58) | Estimated |
| | $k_{release}$ (h ⁻¹) | Rate constant for exosomes release into extracellular fluid | 0.105 | (11) |
| | α | Extent of inhibition of exosome formation | GW: 0.33 (21) OME: 0.61 (18) | Estimated |
| | β | Extent of inhibition of exosome release | GW: 0.47 (26) OME: 0.38 (45) | Estimated |
| B. Pharmacodynamic model | | | | |
| Drug cytotoxicity | k_{growth} (h ⁻¹) | Cell growth rate constant | 0.0288 | (11) |
| | k_{kill} (h ⁻¹) | Maximum cell kill rate constant | 0.0183 | (11) |
| | $EC_{50,initial}$ (nM) | Tubulin-bound concentration to produce 50% $E_{obs,max}$ at time zero | 826 | (11) |
| | γ_{EC50} (nM·h ⁻¹) | Change in IC ₅₀ over treatment time | 7.2 | (11) |
| | n | Hill exponent of PTX concentration-cytotoxicity curve | 1.67 | (11) |
| | TCN_{ss} | Maximum cell number at confluence | 1.1×10^6 | Measured |
| | ICN | Initial cell number | 5×10^3 | Assigned |

3. Macro Plug-in Script that was Written to Automatically Run the Multi-step Fluorescence Signal Quantification Through ImageJ (National Institutes of Health, MD)

//This macro demonstrates how the living cell confocal images were processed and how extracellular endosome-related vesicles fluorescence signals were quantified to produce the plots in Figure 2B.

//First, read the original confocal image file (named "Crop001_t04_z4.jpg" in this example).
open("~/Crop001_t04_z4.jpg");

//Extract the text string of directory and title of this image file so the output files can be properly named after processing.

Dir=getDirectory("image");

Title=getTitle();

Prefix = substring (Title, 0, lastIndexOf(Title, "."));

```

//The original confocal image has three pseudo channels (green, red and blue), which have to be
//separated. Then the green channel, which represents Rab7-GFP staining, can be closed to
//focus the following analysis on red (Rab5 RFP) and blue (AF647 conjugated siRNA)
//channels.
run("Split Channels");
selectWindow(Prefix+".jpg (green)");
close();

// Adjust the contrast threshold of red channel (Rab5 RFP) to amplify the intracellular area signal
// without creating too much background signal in the extracellular area. This threshold was
// empirically selected and fixed for all the images that were processed in current study.
selectWindow(Prefix+".jpg (red)");
setAutoThreshold("Default");
setThreshold(12, 255);
run("Convert to Mask");

// Similarly, the contrast threshold of red channel (Rab5 RFP) to amplify the extracellular area
// signal without creating too much background signal in the intracellular area. This threshold
// was empirically selected and fixed for all the images that were processed in current study.
selectWindow(Prefix+".jpg (blue)");
setAutoThreshold("Default");
setThreshold(30, 255);
run("Convert to Mask");

// Next, ImageJ tool "Image Calculator" was utilized to identify the area where red (Rab5 RFP)
// and blue (siRNA) signal co-localized through function "multiply". Since most of the red
// (Rab5 RFP) was intracellular while all the blue signal stayed in extracellular area, the
// resulted co-localization particles represented the endosome-related vesicles that were bubbled
// out to the extracellular matrix.
imageCalculator("Multiply create", Prefix+".jpg (red)", Prefix+".jpg (blue)");
saveAs("Jpeg", Dir+Prefix+"_multiply");

// Then the intensity of red and blue signal co-localized area was quantified and recorded.
run("Analyze Particles...", "size=4-Infinity circularity=0.0-1.00 display clear add");
run("Clear Results");
run("Close All");

// Lastly, the overall intensity of blue signal was quantified as the background level in order to
// normalize the quantified red-blue colocalization intensity.
open(Dir+Title);
run("Split Channels");
selectWindow(Prefix+".jpg (green)");
close();
selectWindow(Prefix+".jpg (blue)");
roiManager("Measure");
selectWindow("Results");
saveAs("Text", Dir+Prefix+"_blue"+" .csv");

// Remember to clear up the results in cache and close all the windows so the program can be set
// up to analyze the next image.
run("Clear Results");
roiManager("Delete");
run("Close All")

```