

The Need for a Virtual Tumour: Cancer is a Multi-Scale Phenomenon





Figure A: Electron micrograph of a single breast cancer cell. *Source: National Cancer Institute.*

10 - 30 µm across



Figure B: Avascular multicellular tumour. Source: J. Folkman, M. Hochberg, J. Exper. Medicine, 138: 745-753, 1973.

10⁷ cells 1 mm across



Figure C: Angiogram of a patient with a large vascular brain tumour. Arrows and arrowhead point to prominent blood vessels feeding this tumour. *Source: Standford Hospital.*

10¹¹-10¹² cells 5-20 cm across



Figure D: Whole-body 18-FDG (fluorodeoxyglucose) imaging of a patient with small cell carcinoma of the lung. *Source: Unité d'Imagerie Moléculaire et de Radiothérapie Expérimentale Cliniques Universitaires Saint-Luc Bruxelles.*

Cancer is a multi-scale phenomenon, hence it must be modelled on many levels



Physiomics' Virtual Tumour focusses on key tumour dynamics

- Tumour growth / spatial aspect
- Individual cell / synchronisation
- Predict drug effects on tumour
- Does not try to replicate the full complexity of biological systems
- Agent-based model, each cell (agent) contains a different instance of the model
- Tumours contain a heterogeneous cell population

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Preclinical

- Predicts the change in mean tumour volume over time
 - Over 35 preclinical studies have confirmed the predictive capability of the model
- The model describes the growth of a single tumour
- Clinical
 - Predict the change in mean tumour diameter over time for all lesions
 - From the preclinical work we have learnt that the mean behaviour is predictable

Moving from preclinical to clinical setting and vice versa

- Current pharma approach involves merely matching PK between xenograft and man. We also take into consideration the different tumour growth dynamics.
- Adjust certain key parameters we have identified as important for reflecting the different tumour growth rates between xenograft and man.



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Preclinical Virtual Tumour



proprietary cell population model

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 Literature Data across numerous tumour types

- Growth and decay rates of clinical tumours.
- Variability in durations of cell-cycle phases.

Key patient data

- Human PK for drug of interest. Usually from a phase I study.
- How quickly a lesion shrinks. From clinical trials on other drugs in the same indication.

Virtual Tumour Clinical



proprietary cell population model

Virtual Tumour Clinical Development

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 Biomedical Catalyst funding award from the UK Technology Strategy Board (July 2013- March 2014)

Technology Strategy Board Driving Innovation

- NIH collaboration within metastatic castrateresistant prostate cancer
- Oxford University clinical centre to look at three cancer types
- Advanced discussion with large pharma to provide large clinical data sets
- Early results suggest that the existing preclinical model architecture may be appropriate for making clinical predictions
- Large unmet need interest from almost every potential partner



Clinical to Preclinical (Back Translation) Metastatic Melanoma

PHYSI MICS



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Clinical data

- 20 patients where each lesion was monitored over time
- Total number of evaluable lesions: 69
- ➡ FDA report contains a PK model

Preclinical data

- COLO 205 xenograft (colorectal cell line with BRAF V600 mutation) for which we have change in tumour volume for different doses of the drug
- Literature PK model
- Mechanism of action
 - B-Raf inhibitor
 - Drug is known to exert its anti-tumour effect through causing G1 arrest



- Step 1: Analyse clinical data using population analysis approach
- Step 2: Calibrate Virtual Tumour to the mean clinical signal
 - Clinical PK model sourced from literature
- Step 3: Switch clinical growth settings for preclinical growth settings and calibrate preclinical model to control growth
- Step 4: Predict preclinical monotherapy effects
 - Preclinical PK model sourced from literature
- Step 5: Compare prediction with actual results



Evolutionary dynamics of cancer in response to targeted combination therapy. eLife. DOI: 10.7554/eLife.00747.001.

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Mouse drop-outs affect the mean behaviour at late time points

Focus on early dynamics as mice are usually sacrificed once tumour volumes reach a certain size



Clinical efficacy of a RAF inhibitor needs broad target blockade in BRAF-mutant melanoma. Nature. 2010. 467(7315): 596-599.

- Monotherapy predictions compare well with experimental observations
 - Left panel 6 mg/kg QD, right panel 20 mg/kg QD



Clinical efficacy of a RAF inhibitor needs broad target blockade in BRAF-mutant melanoma. Nature. 2010. 467(7315): 596-599.

- Monotherapy predictions compare well with experimental observations
 - Left panel 6 mg/kg QD, right panel 20 mg/kg QD
- This was a colorectal cancer xenograft (COLO 205) which had BRAF V600 mutation
 - Mutational background more important than tissue type? See later



Clinical efficacy of a RAF inhibitor needs broad target blockade in BRAF-mutant melanoma. Nature. 2010. 467(7315): 596-599





- Calibrated Virtual Tumour to monotherapy changes in individual clinical lesions
- Model prediction:
 - Captured the preclinical dynamics very well
- Successful back-translational validation
 - Predicted the effects reasonably well

We shall now look at a forward translational project in this disease area...

Preclinical to Clinical Metastatic Melanoma

PHYSIC MICS



ADVANCE:	Qualification of the translational capability of the Virtual Tumour
OBJECTIVE:	To determine whether our technology could accurately predict the mean change in tumour size over time in a phase II clinical study of docetaxel vs. docetaxel/selumetinib in BRAF WT metastatic melanoma
PARTNER:	Mark Middleton, Oxford ECMC
START POINT:	Single drug xenograft dose-response data, preclinical and clinical PK
DURATION :	6 weeks
OUTCOMES :	Correctly predicted mean change in tumour size over time in both arms of the study and provided schedule options to ameliorate toxicities



- AstraZeneca sponsored randomised phase II study: docetaxel/selumetinib v docetaxel
 - ➡ 40 patients in each arm
 - ~100 lesions in each arm
 - ➡ BRAF WT setting
- Selumetinib is a MEK inhibitor being investigated in numerous disease areas
 - Phase III combination with docetaxel currently ongoing in NSCLC
- Trametinib (GSK) MEK inhibitor was approved last year in the BRAF MUT setting
- Literature search was required for:
 - Preclinical xenograft and PK
 - ➡ Clinical PK



- Step 1: Calibrate Virtual Tumour to preclinical data for each agent
 - Literature PK and xenograft data sourced from literature
- Step 2: Switch preclinical growth settings for clinical growth settings
- Step 3: Predict the two-arm phase II trial
 - Clinical PK models sourced from literature
- Step 4: Population analysis of the clinical study
- **Step 5:** Compare prediction with actual result





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- Replace preclinical growth settings with clinical growth settings
 - Baseline longest diameters are provided as initial inputs
- Replace preclinical PK with clinical PK and simulate predictions



- Perform a population analysis of the clinical data and overlay the results
- Accurate predictions for both arms of the study
 - ➡ Final Study Result: overall response rate (ORR) 32% Doc/Mek v 14% Doc (p = 0.059)



- Biostatistics view: bin the data according to three groups and calculate the mean and 95% confidence interval
- Accurate predictions for both arms of the study
 - ➡ Final Study Result: overall response rate (ORR) 32% Doc/Mek v 14% Doc (p = 0.059)





- Successfully predicted the results of the 2-arm clinical phase 2 trial using monotherapy preclinical efficacy data
 - Performed further predictions for Oxford's ECMC to look at different regimens e.g.
 - What happens if we alter the way Selumetinib is given in a day?
 - ➡ Legend:
 - Docetaxel (75 mg/m²) mean (red) and 95% C.I. (pink region)
 - Docetaxel (75 mg/m²)/Mek (75 mg BD) mean (blue) and 95% C.I. (light blue region)
 - Model predictions open circles and C.I.
 - Total daily dose is 150 mg
 - No difference between BD and TDS for the same total daily dose.





- Successfully predicted the mean change in lesion size for each arm of the phase II trial, using monotherapy preclinical efficacy data and clinical PK data
 - Performed further predictions for Oxford ECMC, exploring different dosing regimens and changing docetaxel for paclitaxel
- Virtual Tumour Clinical can provide significant cost-savings
 - accurate translation of preclinical efficacy reduces the number of clinical studies required to find optimal doses and schedules
- Virtual Tumour Clinical could reduce attrition rates
 - Optimized regimens can enhance efficacy, increasing the chance of clinical trial success

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