

innovation | discovery | impact

# High throughput screening coupled with Imaging transcriptomics in 2D and 3D models

## **Prof Kaylene J. Simpson**

Peter MacCallum Cancer Centre

Sir Peter MacCallum Department of Oncology, and

Department of Biochemistry and Pharmacology, University of Melbourne

Australia









A core facility needs to evolve, adapt, develop new tools, know what's coming Data analysis and project management is critical



FG

Victorian Centre For

**Functional Genomics** 



Expertise, project management, complete support at all stages

Highly innovative data analytics, customised, all code available, fully interactive plots

High throughput infrastructure, high content imaging, large libraries, breadth of applications, assay development, large team, funding support

## innovation | discovery | impact

Enabling discovery and driving translational medicine with high throughput technologies

- ✓ Generate a screen plan✓ Define a grant aim
- ✓NCRIS voucher award

Screening at any scale with the

**CFG** 

Victorian Centre For Functional Genomics

- ✓ Generate a screen plan
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#### Select your model

- ✓ 2D suspension
- ✓ 2D adherent
- ✓ 3D spheroids/ organoids✓ Complex co-culture

### Select your perturbation

✓ Compound library
 ✓ BYO compounds
 ✓ RNAi, CRISPR

#### **Define your readout**

✓ Plate reader
✓ Imaging
✓ Flow cytometry
✓ Sequencing (CRISPR)

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✓ Lab induction
 ✓ Instrument training
 ✓ Protocol development

### **Optimisation**, Assay dev

✓ Dose-curves
✓ Cell density
✓ Live/fixed endpoint
✓ Reporter assays

#### Run your screen

 ✓ Weeks to months
 ✓ Researcher-driven or Fee-for-Service
 ✓ Concurrent Quality Control (QC) analyses

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### Hit selection

✓ Decisions to make✓ Plan secondary screen

#### Data analytics

- ✓ Basic options
   ✓ Advanced options
   ✓ Customisation
- ✓ Machine learning

Screen QC output

✓ Controls (pos/neg)
 ✓ Z-prime factor
 ✓ Variability (%CV)

- ✓ Generate a screen plan
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- ✓ NCRIS voucher award

#### **Detailed target follow up**

- ✓Lots of
- discussion
- ✓Your lab
- ✓ Back in VCFG
- ✓ Precinct partners

#### Integrate OMICS

- ✓ Metabolomics (MA)
- ✓ Transcriptomics (MGC)
- ✓ Proteomics
- (MGC/MSPF)

#### **Hit selection**

✓ Decisions to make✓ Plan secondary screen

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# **Discovery - high throughput screening concept**

- Unbiased interrogation
- Best model to replicate your biology
- Thousands of genes (CRISPR, RNAi)
- Thousands of compounds
- Iterative data analysis to generate 'hit' lists



High throughput assay

Adherent or suspension Multiple lines

Validation of primary screen More difficult, expensive Multiplex readouts Lower throughput





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# **Orders of complexity with experimental approaches**





Screen complexity

# **Key infrastructure**

- Personal liquid handling workstation cell dispense, media change, fix/stain
  - BioTek 406 x3, BioTek MFX
- Big robotics large capacity, flexible movement options with precision small volumes
  - Sciclone, Janus G3
- Plate reader basic and advanced functionality, kinetic, automated
  - Cytation 3, Cytation 5, Cytation C10
- Microscope live, widefield, confocal, magnification, speed, throughput, automated
  - CellInsight PRO x 3; Cytation 5 and C10; Incucyte x 2
- Automated plate sealer
  - Plate loc
- Drug dispenser (BYO compounds and controls)
  - Tecan D300e
- Liconics incubator
- Access to Flow through Research Flow Core





# **Arrayed screening workflow**

 $\infty$ 















## Library delivery

Compounds (Compounds Australia) CRISPR and RNAi whole human genome libraries

## **Data acquisition**

Biological relevance - 2D adherent, suspension, 3D matrices

## Image, plate reader, flow cytometry

CellInsight PRO's Cytation 5 & C10 Novocyte

## **Data analysis**

Fundamental QC Basic to advanced options Machine learning innovation Fully customised



# **Cell painting to quantify cell biology**

Cell Painting is a high-content, multiplexed image-based assay used for cytological profiling.

Up to six fluorescent dyes are used to label different components of the cell including the nucleus, endoplasmic reticulum, mitochondria, cytoskeleton, Golgi apparatus, and RNA.

Imaging and analysis extracts thousands of features to profile cells and elucidate behaviour.

Reference compounds/controls required



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Depending on scale – cell painting may be a secondary screen

Still powerful to do less and include biological targets of interest



Target X

@Broad Institute





## **HCS screens – great diversity possible**

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drug resistance/sensitivity cell death cell size (senescence) cell cycle cell morphology cell motility and metastases host-pathogen interactions 3D morphogenesis complex co-cultures multi-parametric readouts complex single cell phenotyping protein modification protein location reporter assays, transcriptional activation internalization/secretion





# Working in a more translatable model system





2D cells grown on flat plastic – not very physiological

• drug discovery in 2D can fail at clinical trials

3D cells cultured in a matrix full of growth factors and supporting scaffolds

- more closely replicates the microenvironment in the body
- allows cell growth in all planes
- allows us to co-culture different cell types that more closely model a disease
- ideal setting for cells derived directly from a patient
- or cells cultured from a patient in a mouse





MCF7 cells grown in 2D

MCF7 cells grown in 3D

## **Automated 3D pipeline**





## **Automated 3D pipeline**

- Growth kinetics
- Drug screens
- Immune cell killing/ infiltration
- Single organoid population data
- Phenotypic clustering

## Basic characterisation - organoid area

- organoid number

## **Prostate PDX – growth and death time course**







## PDX/PDO/cell lines

Pancreatic

Colorectal

Prostate

Ovarian

Oesophageal

Genito-urinary

Cancer unknown primary

+ Cell lines (breast, prostate)

# Quantify structure dynamics, organoid size in a whole population





Prostate PDX 2







10

15

0



**Prostate PDX 3** 

## **Cancer of Unknown Primary**

Day 5 (drug Day 0)

Day 10 (drug Day 5)



Plate1 Growth-D05\_Drug-D00



Plate1 Growth-D10 Drug-D05



N Choo et al., SLAS Discovery (2021)

Throws

10

15

Count/well

100 -

50 -

0

0

# Fixing and staining in Matrigel in situ - a grand challenge



## Problem 1 - fixing

- PFA deploymerises Matrigel
- Fixing changes structural integrity (shrink, swell)
- Shift in position means no relational imaging quantitation
- Total structure loss/disintegration

## Solution:

Tried numerous agents, settled on 0.3% glutaraldehyde, 10 mins, RT





unfixed

fixed



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#### MCF7 2% embedding



unfixed

fixed

## Solution:

Tried numerous agents, settled on 0.3% glutaraldehyde, 10 mins, RT

## <u>Problem 2- background</u> Fixing in matrigel leaves high autofluorescence

## Solution:

Quenching – identify agent: Sodium Borohydride

- creates hydrogen gas
- modify concentration
- length of incubation
- temperature of incubation

Time post fixation – must be less than 1 week



fixed

not quenched

quenched



# High multiplex parameter staining – discriminates drug response

## Suite of markers available

PI (dead)

Image IT Dead

Phalloidin (actin)

Ki67 – (proliferation)

Caspase 3/7

Concanavalin A (membrane)

SYTO14 – (nucleic acid stain)

WGA – (membrane, Golgi)

Histone H3 – (chromatin)

Mitotracker (mitochondria)

Cell painting

**ThermoFisher** SCIENTIFIC MCF7 cells – culture endpoint 20X magnification Single structure, single cell



DAPI (Nuclei) Phalloidin (Actin) pH3 (mitosis) Mitochondria





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# Data analytics – Cellular phenotyping and hit identification





Extraction of cell features (~1,000 per image)

Feature reduction

Data integration

Peter Mac

## **Phenotypic clustering**



Peter Mac Peter MacCallum Cancer Centre

Victoria Austral

HDAC









MDA-MB-231

altered mitochond

function

oxaliplatin, cisplatin inhibition of mDNA replication inserintion

Starobova et al., 2017

# **Top features identifying each cluster – towards mechanism of action**









Actin Tubulin



## **3D compound screen - clusters similar phenotypes**



Peter Mac

er MacCallum Cancer Centre Victoria Australia



# **3D compound screen - clusters similar phenotypes**



Compound X1 (C4)



Compound Signatures: Cluster 4

Compound Signatures: Cluster 1



features



Compound X3 (C1)







# High-throughput transcriptomics (MAC-seq – multiplexed analysis of cells)

384 well format In situ RNA extraction with barcoded wells Bulk RNA seq



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Multi-OMICS Bulk or single cell proteomics Metabolomics Cytokine profiling Cell lineage tracing Other applications

## **Screen vignettes**

- 1 Drug screen for low grade ovarian carcinoma using high content imaging
  - Dr Kathleen Pishas, Dr Dane Cheasley
- 2 Drug screen for immunomodulatory targets using flow cytometry
  - Emily Derrick, A/Prof Paul Beavis, Eva Orlowski-Oliver
- 3 Organoids in personalised medicine colorectal patients
  - Dr Anshini Jain, Prof Rob Ramsay, A/Prof Alexander Heriot, A/Prof Nick Clemons
- 4 Immune cell 3D complex co-culture screening profiling CAR-T cells
  - Dr Milton Mui, A/Prof Nick Clemons

We are sharing unpublished work



# 1- High-throughput strategies to discover synergistic drug combinations for low-grade serous ovarian carcinomas.

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Target/Pathway

High confidence hits with no effect in the normal cell line, are enriched for compounds targeting the MEK, EGFR and mTOR pathway

# **EGFR and MEK inhibitors synergise**

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Pair-wise synergy interaction study

- 6x6 dose grid

- 6 anchors (standard of care +
experimental) in combo with 79 hits
- screening 4 cell lines

23 DMSO Dox 0. JuM DMSO Cobimetinib + Drug 1 4 Pelitinib + Drug1 Stauro 0. 1uM Media Mirdametinib + Drug 1 DMSO 4 DMSD Mito 0. 1uM 3 DMSO. Cobimetinib\_10uM Cobimetinib\_10uM 2 Media Dox 0.1uM Airdametinib\_10uM Mirdametinib\_10uM 1 OMSO 0 elitinib\_10uM 5 Media au Di Stauro 0.1uh 4 aclitasel 10uM Paclitasel 10uM DMSO Trametinib + Drug 1 3 Paclitaxel + Drug1 Carboplatin + Drug1 Media arboplatin 10uM Carboplatin 10uM Mito 0.1uM DMSO 2 Media DMSO DMSO DMSO OMSO DMSO DMSO Media Drug 1\_10uM Drug 1\_10uM Û Media Media Media Media Media Media Media lox 0.01uM Stauro 0.01uM Mito 0.01uM Media DMSD Media Media Media Media Stauro 0.01uM Mito 0.01uM DMSO Media Media

ZIP Synergy Score Mean: 11.49 (p = 3.06e-08) | Madian: 10.3 | 95% Quantile: 24.15











**ZIP Synergy Score** 

## MAC-seq reveals transcriptional programs driving drug sensitivity



Comparing transcriptional profiles driving drug sensitivity between a series of i) EGFR and ii) MEK inhibitors

VOA-4698 cells, 1µM, 24hrs



## Dr Kathleen Pishas – record holder! Largest screen in VCFG



Pishas et al., Scientific DATA 2024

13 cell lines screened with >3500 compounds 685 x 384 well plates = 263040 wells of data

> ~2.5 hours imaging per plate 1712.5 hours = 72 days! Feb 2021 start and still going

PMC codes Pilot PMC37 PMC78 PMC83 PMC88 PMC95 PMC96

Primary PMC101 PMC122 PMC102 PMC137 PMC103 PMC146 PMC104 PMC147 PMC107 PMC150 PMC108 PMC152 PMC109 PMC155 PMC110 PMC156 PMC113 PMC184 PMC114 PMC185 **PMC117 PMC118** 

**Validation/3D/MAC-seq** PMC220 PMS28 PMS29 PM3D94 PMC3D104 PM3D110 PM3D113 PM3D130



# 2- T cell infiltration model – mouse macrophage



CXCL9 and CXC10 are chemokines induced by  $\mathsf{IFN}\gamma$ 

Play a role to induce chemotaxis, promote differentiation and multiplication of leukocytes, and cause tissue extravasation.



What agents can drive tumours make more CXCL9/10?

Emily Derrick, A/Prof Paul Beavis, Peter Mac

# Identify novel immunomodulatory drugs to enhance CXCL9/10 expression



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## **Example compounds**

Blue =  $IFN\gamma$ -stimulated DMSO control.



# **Primary screen outcomes**

20480 compounds screened

- CXCL10 log fold change > 1.85
- CXCL9 log fold change > 0.7
- Counts > 100 (toxicity)
- Short listed 138 compounds



# **Drug candidates – validation screen**



Secondary screen containing 138 compounds

4-point dose curve (10, 3, 1, 0.1 uM,  $\pm$  IFN $\gamma$ ) in triplicate







# High confidence targets for detailed mechanistic study – clinical relevance

- Selecting best 15-20 drugs:
- ~5 CXCL9 only
- ~5 CXCL10 only
- ~5 modulate CXCL9 & CXCL10
- Some drugs modulating CXCL9/10 expression **without** IFNγ
- Validate in human primary macrophages.
- Chemokine production
- RNAseq for mechanistic insight

Novel compounds improve CXCL9/10 expression in tumors, and subsequently make them more responsive to ICB.

These may be more specific in modulating chemokine production than PTPN2 inhibitors (less adverse reactions).



# 3- Personalised approach to Colorectal Peritoneal Metastases (CRPM)



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Franko J et al. Lancet Oncology 2016. 17 (12):1709-19

# **Treatment options for Colorectal Peritoneal Metastases**

Cytoreductive Surgery (CRS)



Sugarbaker PH. 2016 Jul;48:42-9.

Heated Intraperitoneal Chemotherapy (HIPEC)



© Mayo Clinic

Well selected patients with good
cytoreductive surgery
→ can improve outcomes

But does HIPEC provide oncological benefit in addition to the surgery?



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## Support Vector Machine learning based on imaging data





# How do we benchmark a patient's response?







Dose-Response of Patient PC190 Passage 13, SN38



Clinically relevant concentration ranges determined in the clinical cohort



- - - - · Colorectal Cancer Cohort's Mean Dose-response curve

## How do we benchmark a patient's response?



Peter MacCallum Cancer Centre Victoria Australia



# 4- Modelling immunotherapy in organoids

Immunotherapy efficacy *in vitro* have been assessed using cell lines with engineered reporters such as luciferase in **2D**, or luminescent based whole well assay.

There is a lack of translational tool and a read out that encompasses the cellular heterogeneity to apply to primary cells.

Most endpoint assays don't capture kinetic information of cell therapy, a late stage end point will likely include non-specific cytokine killing.



## **Complex co-culture immuno-oncology**

MCF7 spheroids with activated NK92 cells - two different effector:target ratios



Cytation 5



## **High-throughput 3D Immune Co-culture Screening Platform**

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## **Key points**

- Minimal cell material requirement
- High-throughput with real kinetic resolution
- Tumour heterogeneity in 3D
- Scalable and expandable platform for multi-omics assay



Endpoint parallel readout such as CellTiter-Glo

Flow 🔇

MAC-seq (deconvolution of tumor and CAR-T transcriptome) A bottom-up approach to reconstruct miniaturised models for "micro-environment" for *in vitro* high-throughput screening

## **CAR-T induced cell death of colorectal spheroids**



Using different ratios of CAR-T cells

Loss of TMRE is "dose" dependent.

We can measure each individual spheroid in the well for a whole well population heterogeneity readout



Patient JF016

4X\_JF016\_CAR-T\_20000\_cells\_none\_0hr

Lews-Y CAR-T 1:1 CRC

4X\_JF016\_CAR-T\_100000\_cells\_none\_0hr

**Bright Field** 







Lews-Y CAR-T 5: 1 CRC

TMRE



# Using TMRE to quantify spheroids over time with Cell titre glo endpoint viability





Different ratios of CAR-T and untransduced T cells Staurosporine 10uM killing agent





Milton Mui, Robert Ramsay, Nick Clemons, Mark Li, CART from Dr Jessica Li CoE Cellular Immunotherapy

## Single spheroid level image analysis and object tracking





Time 0

Time 6hr



# Single spheroid level image analysis and object tracking



Peter Mac

TMRE signal change for a given single spheroid over time Summarise heterogeneity into a single number



# **Comparison between 2 samples aggregating single spheroids**



plot out the decay rate for every structure per treatment.

compare the 2 distributions using a Kolmogorov-Smirnov test.

CAR-T high dose **significantly** faster death.





# Can we use MAC-seq to quantify signaling differences in presence of **CAR-T cells**?

Using JF016 samples 24hr timepoint



CRC alone







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Xin Liu, Mark Li

# We can discriminate the RNA profiles of each treatment condition

WICTOR Victorian Centre For Functional Genomics



Each dot is the transcriptome of that treatment well.



Peter Mac

## **Co-culture identifies different expression signature**



**VCFG** 

Currently working on more immunology focussed assays, drugs and CRISPR

Develop the high throughput flow applications (Novocyte with Hudson plate crane), particularly liquid handling multiplexed staining

Developing assays with Metabolomics Australia (Bio21) to quantify metabolite signalling

Working with Mass Spectrometry and Proteomics (Bio21) to miniaturise

Data integration pipelines



# VCFG team – an innovative and collaborative partnership



- Prof Kaylene Simpson Head, project management, grant support, strategy
- Dr Susanne Ramm 2IC, R&D lead, compound screening, imaging and analysis
- Dr Mark Li 3D screen support, fee for service and analysis, tech development
- Karla Cowley 2D data analyst, high content microscopy, IT/server liaison
- Dr AnnRann Wong Data analysis, screen support, fee for service projects
- Xin Liu MAC-seq, RNA-seq, spatial transcriptomics, joint with VCFG, MGC and Bioinformatics
- Hasan Quraishi Integrating MAC-seq with high content screening, Masters of Data Analytics (Monash)
- Jennii Luu Lab manager, automation specialist, screening method development
- Robert Vary Equipment training, screen support, fee for service, CRISPR
- Dr Ada Koo Assay development, high throughput metabolomics (Bio21), iLAB management
- Kavya Pamulapati Equipment training, maintenance, screen support
- Dr Twishi Gulati PA National service Coordinator (NCRIS), CRISPR, business development

(e)

- Louise Scerri - administration





BIOPLATFORMS

AUSTRALIA



Phenomics



Infrastructure for Australia An Australian Government Initiative

COMPOUNDS

AUSTRALIA

AUSTRALTAN

CANCFR

Medical Research

**Future Fund** 

RESEARCH

# Organoid Nexus 2024: High Throughput Innovation Meeting

When: November 7, 2024 Time: 8:45am arrival for 9am start, concludes at 5:15pm Where: Bio21 Institute, 30 Flemington Rd, Parkville VIC Attendance: In-person only Cost: \$27.50 per person (incl. GST) Presentation Eol deadline: October 16, 2024 Registration deadline: October 30, 2024 Interstate travel awards available





Functional High Throughput Technologies