## INTEGRATIVE ANALYSES OF SIGNALING AND DNA DAMAGE REPAIR PATHWAYS IN PATIENT-DERIVED XENOGRAFT (PDX) MODELS FROM NCI'S PATIENT-DERIVED MODELS REPOSITORY (PDMR)





Biswajit Das<sup>1</sup>, Yvonne A. Evrard<sup>1</sup>, Li Chen<sup>1</sup>, Rajesh Patidar<sup>1</sup>, Tomas Vilimas<sup>1</sup>, Justine N McCutcheon<sup>1</sup>, Shahanawaz Jiwani<sup>1</sup>, Suzanne Borgel<sup>2</sup>, John Carter<sup>2</sup>, Raymond Divelbiss<sup>2</sup>, Marianne Radzyminski<sup>2</sup>, Jesse Stottlemyer<sup>2</sup>, Vivekananda Dutta<sup>1</sup>, Erin Cantu<sup>1</sup>, Gloryvee Rivera<sup>1</sup>, Lyndsay Dutko<sup>1</sup>, Kelly Benauer<sup>1</sup>, Vishu R Kannan<sup>1</sup>, Brandie Fullmer<sup>1</sup>, Robin Harrington<sup>1</sup>, Anna L. Fong<sup>1</sup>, Thomas Forbes<sup>1</sup>, Carrie Bonomi<sup>2</sup>, Donna Coakley<sup>2</sup>, Emily Delaney<sup>2</sup>, Kelly Dougherty<sup>2</sup>, Marion Gibson<sup>2</sup>, Candace Mallow<sup>2</sup>, Chelsea McGlynn<sup>2</sup>, T. Miner<sup>2</sup>, Malorie Morris<sup>2</sup>, Michael. Mullendore<sup>2</sup>, Nicole Craig<sup>2</sup>, Howard Stotler<sup>2</sup>, Savanna Styers<sup>2</sup>, Debbie Trail<sup>2</sup>, Thomas Walsh<sup>2</sup>, Linda Blumenauer<sup>4</sup>, Tara Grinnage-Pulley<sup>4</sup>, Michelle Ahalt<sup>4</sup>, Sergio Alcoser<sup>4</sup>, Zhenlin Ju<sup>3</sup>, Rehan Akbani<sup>3</sup>, Melinda G. Hollingshead<sup>4</sup>, Chris A. Karlovich<sup>1</sup>, P. Mickey Williams<sup>1</sup>, James H. Doroshow<sup>5</sup>

<sup>1</sup>Molecular Characterization Laboratory, Frederick National Laboratory for Cancer Research, Leidos Biomedical Research Inc., Frederick, MD, <sup>2</sup>Frederick National Laboratory for Cancer Research, Leidos Biomedical Research Inc., Frederick, MD, <sup>3</sup>Department of Bioinformatics and Computational Biology, UT MD Anderson Cancer Center, Houston, TX 77030, 4Biological Testing Branch, Developmental Therapeutics Program, National Cancer Institute at Frederick, MD and 5National Cancer Institute, Division of Cancer Treatment and Diagnosis, Bethesda, MD

### **ABSTRACT**

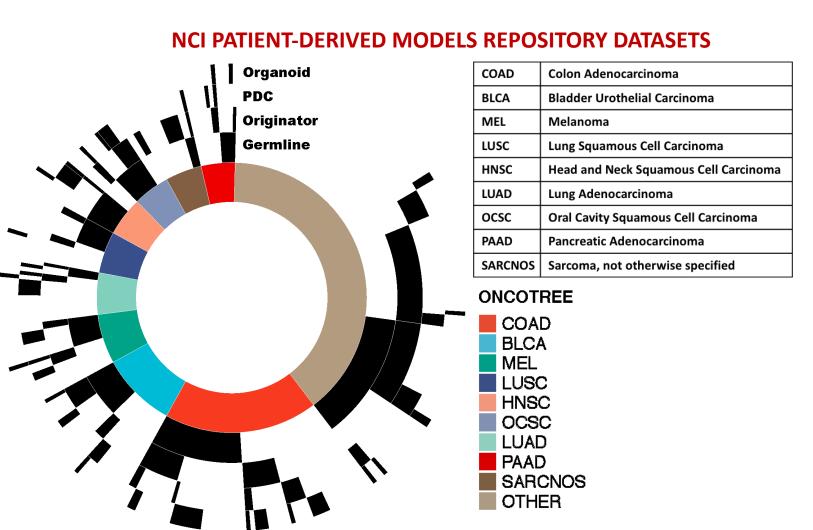
Background: Patient-derived xenografts (PDXs) are increasingly being used in translational cancer research for preclinical drug efficacy studies. The National Cancer Institute (NCI) has developed a Patient-Derived Models Repository (NCI PDMR; pdmr.cancer.gov) of PDXs with clinical annotation, proteomics, and comprehensive genomic datasets to facilitate these studies. Here, we present an integrative genomic, transcriptomic, and proteomic analysis of critical signaling and DNA damage repair pathways in these PDX models, which represent 9 common and multiple rare tumor histologies.

Methods: 346 PDX models from 333 patients were established from various solid tumor histologies from patients with primary or metastatic cancer. Whole Exome Sequencing, RNA-Seq and Reverse Phase Protein Array (RPPA) were performed on 2-9 PDXs per model across multiple passages. An integrative workflow was applied on multiple data sets to detect pathway activation.

Results: We profiled 5 signaling and 5 DNA repair pathways in the PDMR dataset. We observed that: (i) a large fraction (56%) of PDX models have at least 1 targetable mutation in the RTK/RAS and/or PIK3CA pathways; (ii) 131 models (45%) have putative driver and oncogenic mutations and copy number variants (CNVs) in the WNT, TGFeta, NOTCH pathways. In addition, 11% of PDX models have targetable mutations in DNA damage repair pathways and 20 PDMR models have a DNA mismatch repair defect (MSI-H). We confirmed activation of the signaling pathways in a subset of PDX models by pathway enrichment analysis on gene expression data from RNASeq and phosphoprotein-specific antibody binding data from RPPA. Activation of DNA repair processes was confirmed by enrichment of relevant mutational signatures and loss of heterozygosity in these PDX models.

Conclusions: Genomic analysis of NCI PDMR models revealed that a large fraction have clinically relevant somatic alterations in key signaling and DNA damage repair pathways. Further integrative analyses with matched transcriptomic and proteomic profiles confirmed pathway activation in a subset of these models, which may prioritize them for preclinical drug studies.

### **RESULTS**



**Genomic and Proteomic Datasets:** 

cancer-related genes

data using SNPweights

**❖** VCF files (from our GATK pipeline)

Ethnicity determination from WES

Both somatic and mixed

**❖** Variant calls from a selected set of 61

Gene expression data (RSEM pipeline)

245 antibodies (65 phospho-specific)

z-score of a subset of specimens

Transcript expression data (RSEM)

Raw FASTQ files

Whole transcriptome (RNASeq):

Raw FASTQ files

**Reverse Phase Protein Array (RPPA):** 

## **Clinical and Histo-Pathological**

#### datasets: Whole Exome:

- Clinical annotation of donors
- Limited clinical history including
- previous treatment regimens Donor demographics including self-
- declared ethnicity, smoking history
- STR profile
- Histo-pathological annotations and images of individual PDX specimens

### **Signaling Pathways Profile shown:**

- RTK (Receptor Tyrosine Kinases)
- PI3K (PI3KCA/AKT)
- **❖** MEK/ERK kinase
- ❖ WNT/β—catenin
- Hedgehog DNA Damage Repair

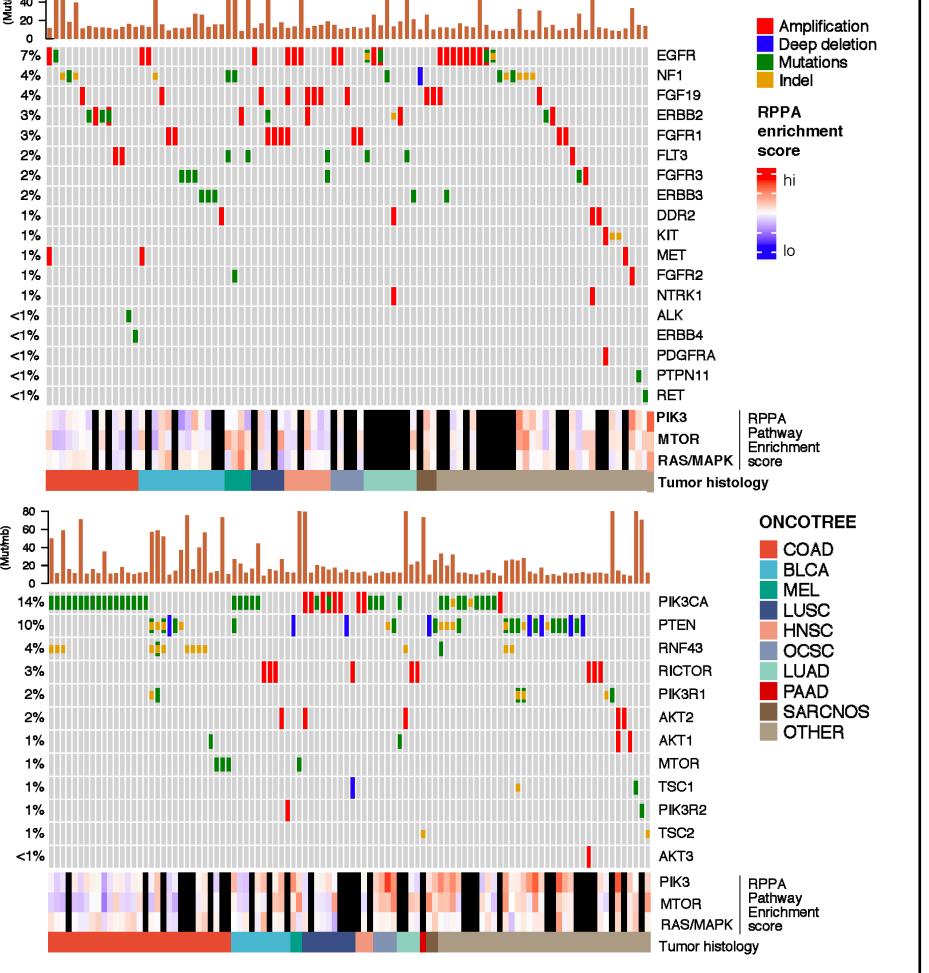
#### VISUALIZATION OF SIGNALING PATHWAY ACTIVATION

For each pathway, oncogenic variants<sup>1</sup> of constituent genes<sup>2</sup> are shown as oncoprints Additionally for each pathway, relevant downstream effects and tumor histologies are shown below the oncoprint:

- for RTK and PI3K pathways, enrichment scores of PI3K, MTOR/TSC and RAS/MAPK pathways from RPPA data<sup>3</sup> are shown as a heatmaps
- for WNT/β-Catenin and SHH pathways, EMT score from RPPA, EMT, WNT and SHH gene set enrichment scores obtained from gene expression data are shown as a heatmaps
- for DNA damage repair pathways, mutational signature, MSI and LOH status are shown as a heatmaps

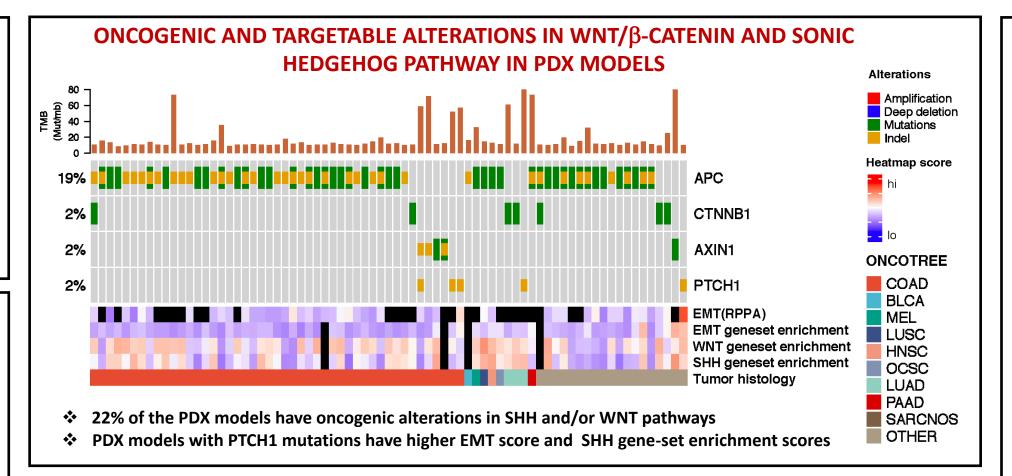
# **PDX MODELS**

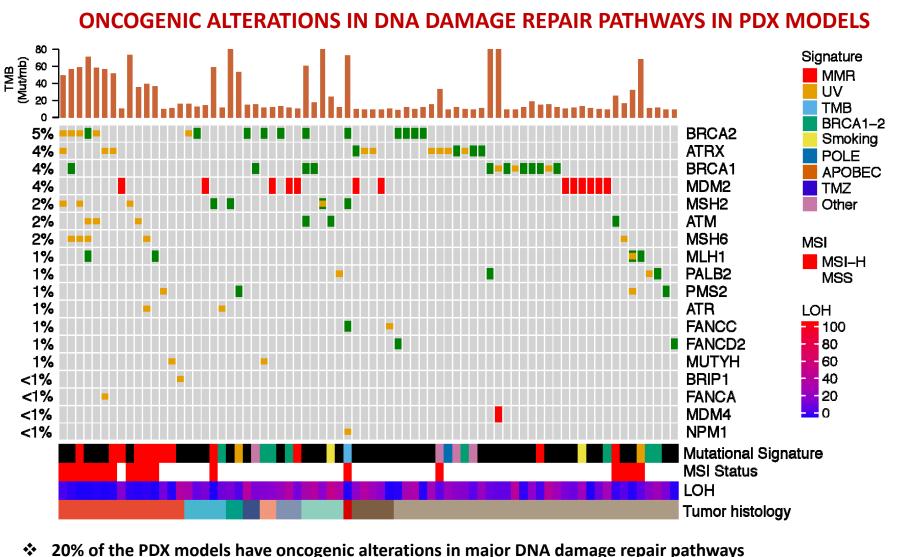
- ❖ 65% of the PDMR models have at least one oncogenic alteration in RTK and PI3K pathways
- ❖ 56% the PDMR models have at least one targetable alteration in RTK and PI3K pathways



## ❖ Activity of PIK3, MTOR/TSC and RAS/MAPK pathways were determined by pathway scores calculated from

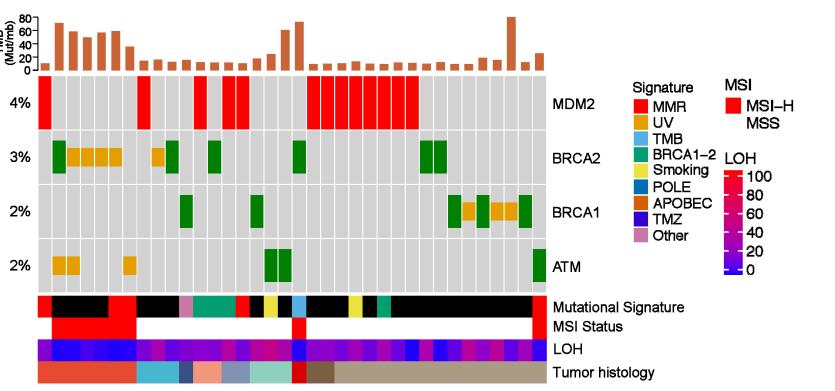
- Activation of downstream signaling pathways were observed in some PDX models with oncogenic alterations in RTK and PI3K pathways
- **❖** PIK3CA oncogenic mutations are not associated with strong activation of downstream pathway
- **❖** PTEN mutations and homozygous deletions have correlation with downstream pathway activation





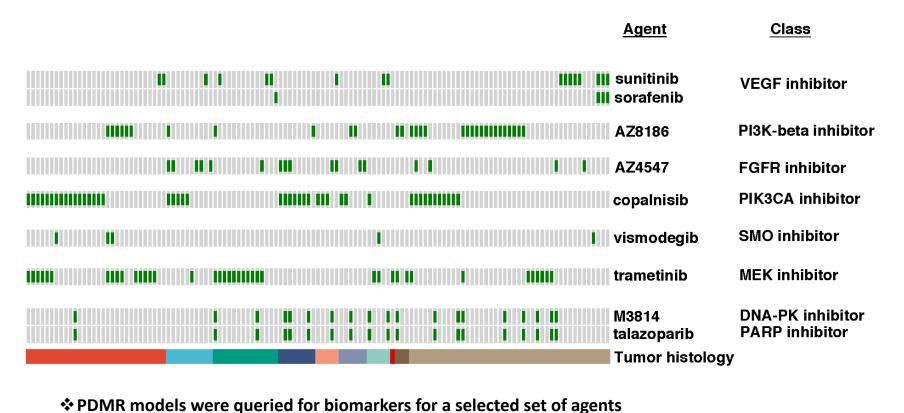
- **❖** Mutational signatures correlate well with clinical history, tumor histologies, mutational and MSI status
- **❖** In MSI-H PDX models, mutations in homologous recombination pathways don't correlate with either LOH status or relevant mutational signatures

### TARGETABLE ALTERATIONS IN DNA DAMAGE REPAIR PATHWAYS IN PDX MODELS



**❖** 11% of PDX models in PDMR may have targetable alterations in DNA damage repair pathway

### PUTATIVE ACTIONABILITY IN PDMR MODELS FOR A SELECTED SET OF AGENTS



- **❖** These 9 agents represented activities across multiple signaling pathways
- **❖** We found 28% of the models may have at least one targetable biomarker for one of these agents

## **SUMMARY**

- We have performed integrative analysis of signaling pathways in PDMR models using mutation, gene expression and proteomic datasets
- Gene expression and proteomic datasets allowed us to investigate downstream effects of signaling
- PDX models in NCI PDMR exhibited activity in multiple signaling and DNA damage repair pathways
- Additional datasets generated from the PDMR models (e.g., mutational signatures, somatic tumor mutational burden, MSI status etc.) may be used to identify underlying biological processes and can be used for prioritizing preclinical study agents
- ❖ We have described therapeutically actionable biomarkers present in the genomically characterized PDX models
- This data suggest using PDMR models will be valuable for preclinical drug combination studies

#### **REFERENCES**

- Chakravarty et al, OncoKB: A Precision Oncology Knowledge Base, JCO Precision Oncology (2017), 1, 1-16
- Taylor et al, The Path(way) Less Traveled: A Pathway-Oriented Approach to Providing Information about Precision Cancer Medicine on My Cancer Genome, Translational Oncology (2016), 9, 163-165
- Akbani et al, A pan-cancer proteomic perspective on The Cancer Genome Atlas, Nature Communications (2014), 5, 3887

## Frederick National Laboratory for Cancer Research

sponsored by the National Cancer Institute

This project has been funded in whole or in part with federal funds from the National Cancer Institute, National Institutes of Health, under contract HHSN261200800001E. The content of this publication does not necessarily reflect the views or policies of the Department of Health and Human Services, nor does mention of trade names, commercial products, or organizations imply endorsement by the U.S. Government.