

# EMERGING BIOMARKERS OF IMMUNE CHECKPOINT INHIBITORS

Rodrigo Dienstmann





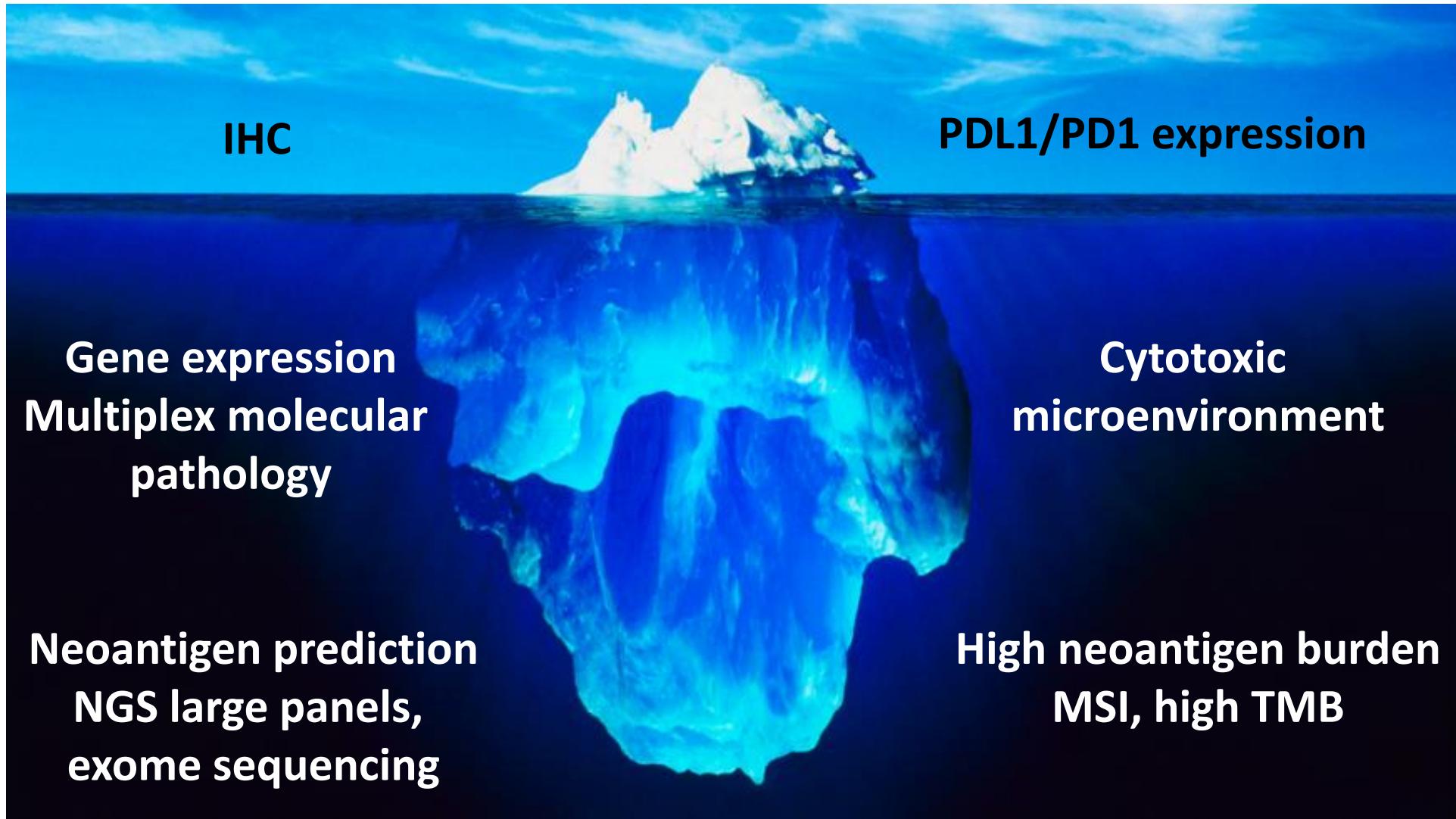
# (PERSONAL) CONFLICTS OF INTEREST

Advisory role: Roche, Foundation Medicine  
Boehringer-Ingelheim

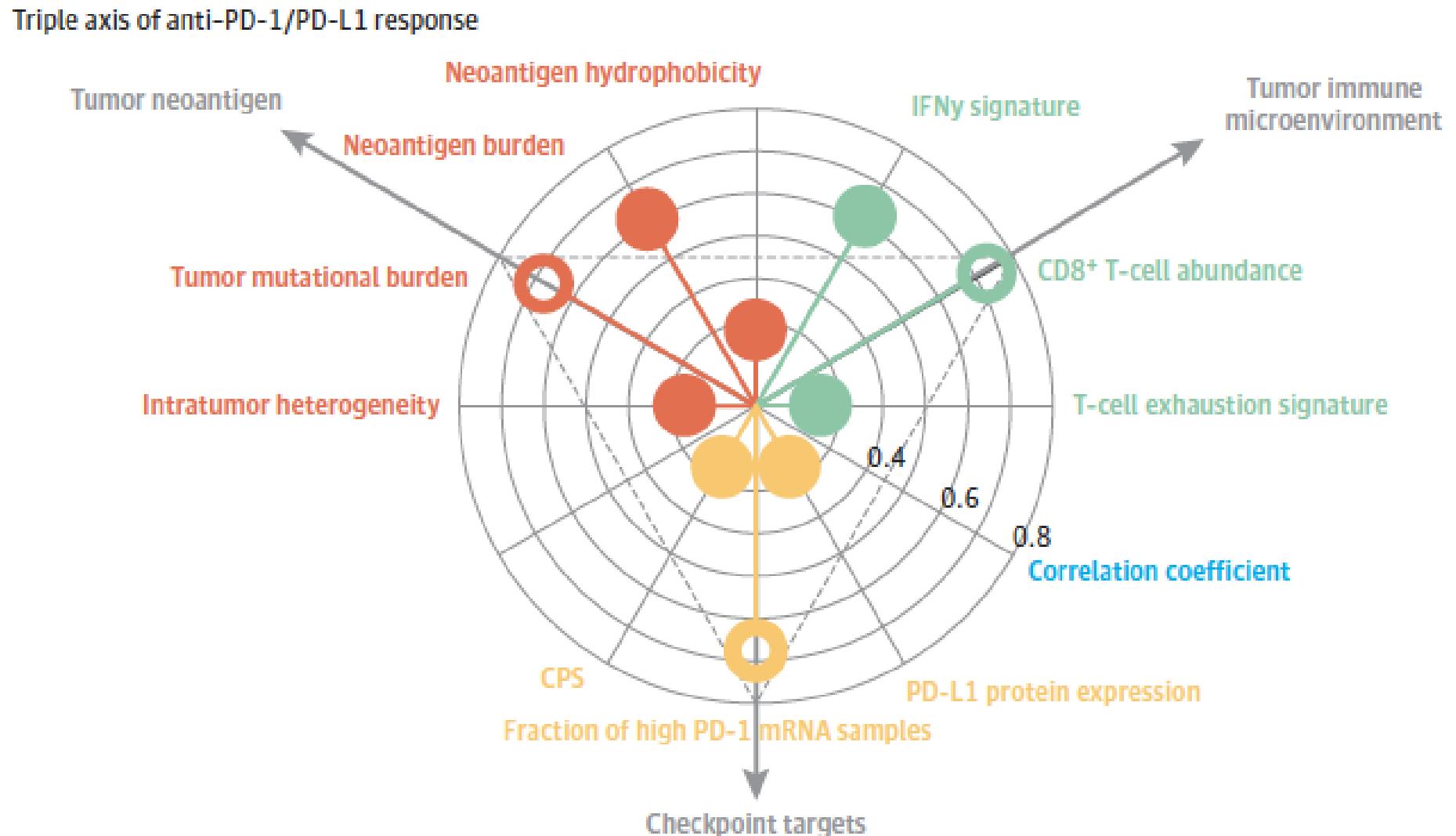
Speaker's fee: Roche  
Amgen  
Ipsen  
Servier  
Sanofi  
MSD

Research grant: Merck  
Pierre Fabre  
BMS

# INTEGRATED BIOMARKER ANALYSIS



# MULTI-OMICS PREDICTIVE MARKERS



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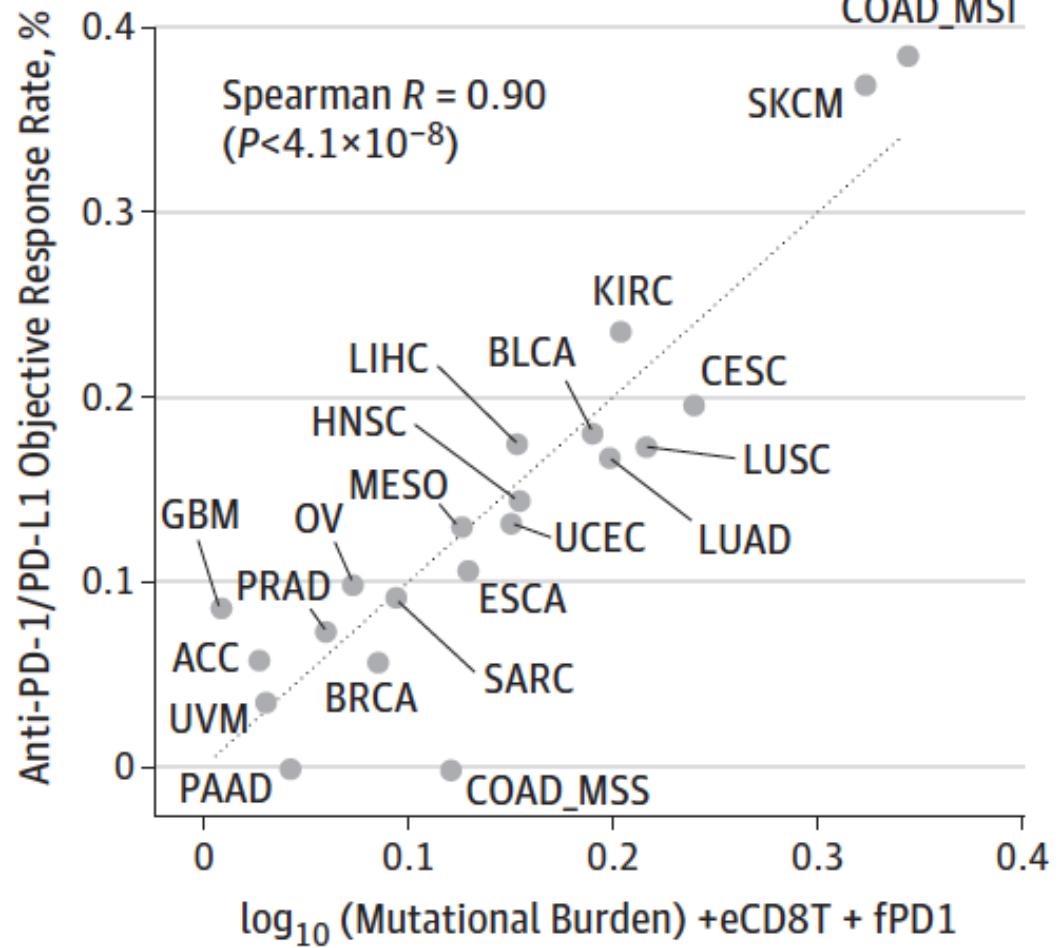


## In-silico analysis

TCGA data vs. results clinical trials

Spearman  $R = 0.9$

Model with **PDL1 + CD8 + TMB**  
explains **80%** of ORR across tumor types

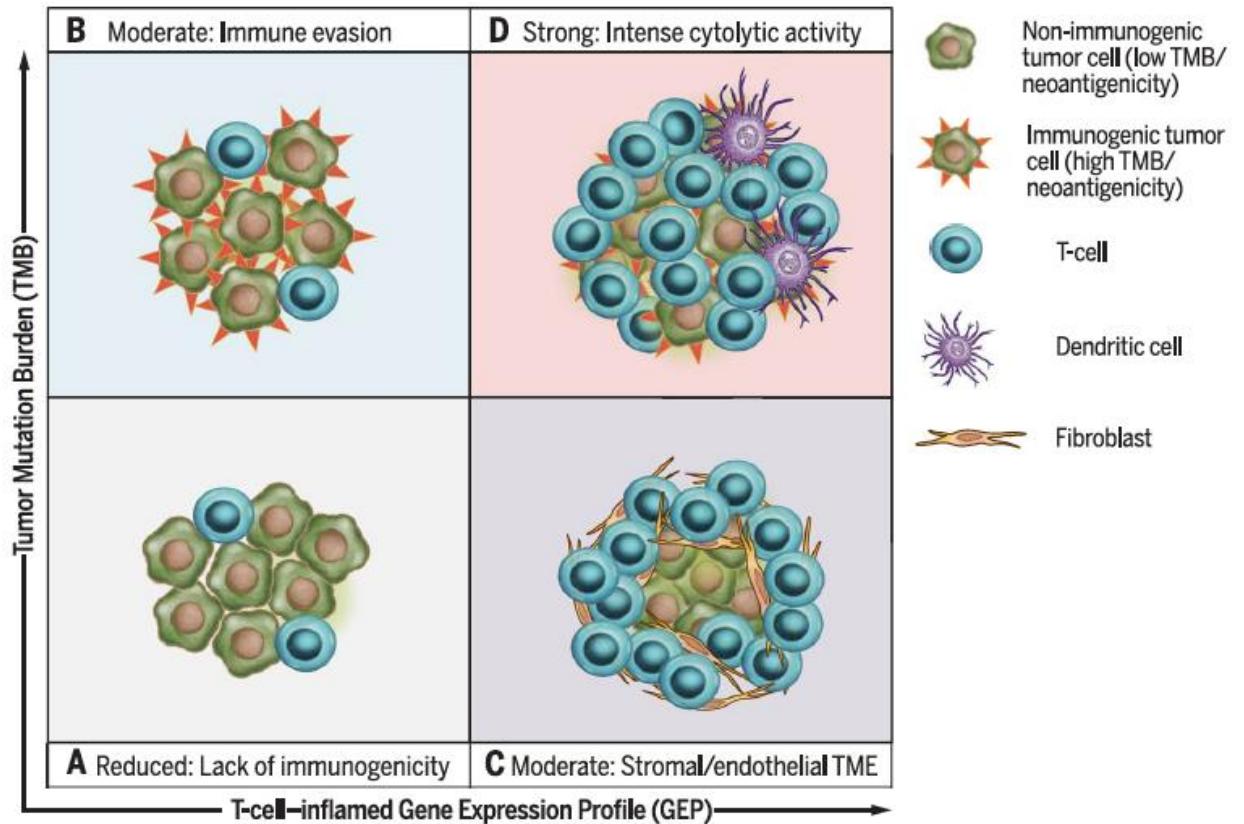


# MULTI-OMICS PREDICTIVE MARKERS



**Metanalysis KEYNOTE trials**  
300 patients, 22 tumors

TMB  
GEP cytotoxicity signature (18 genes)

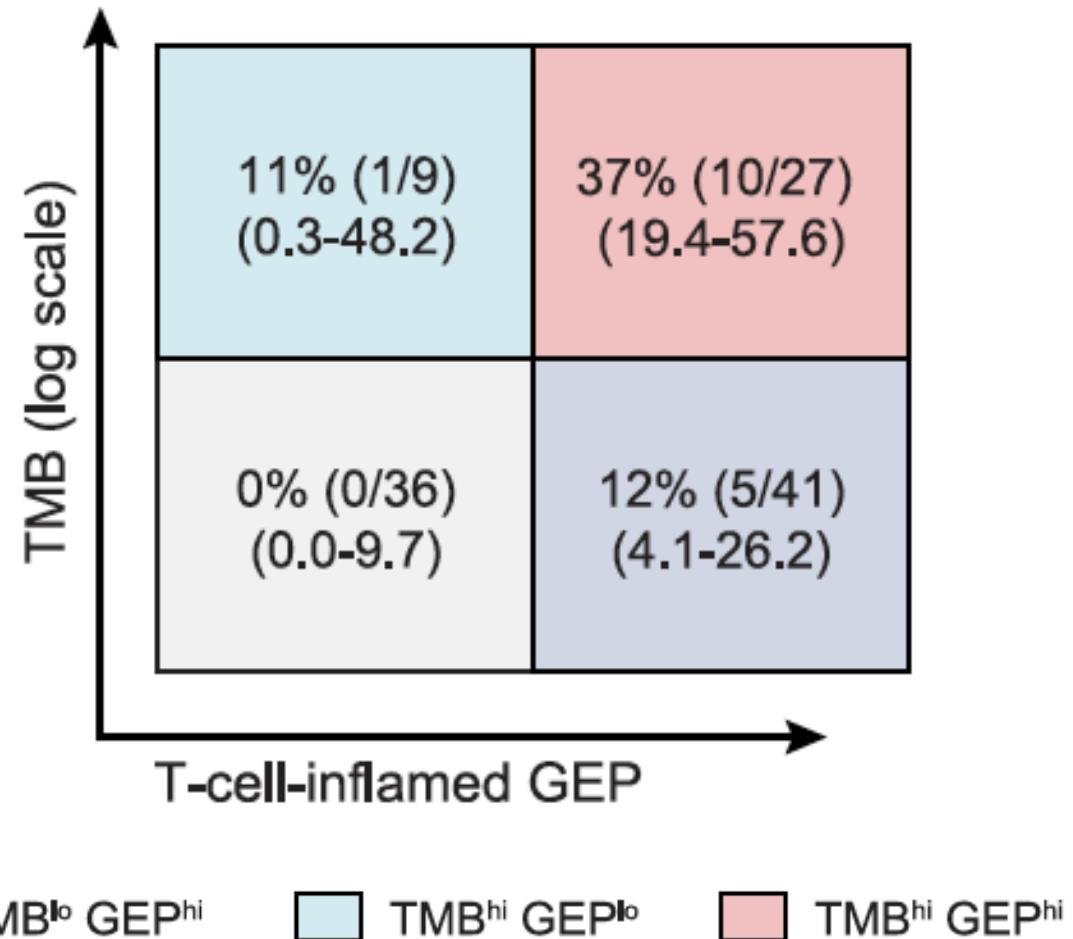


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TMB<sup>lo</sup> GEP<sup>lo</sup>



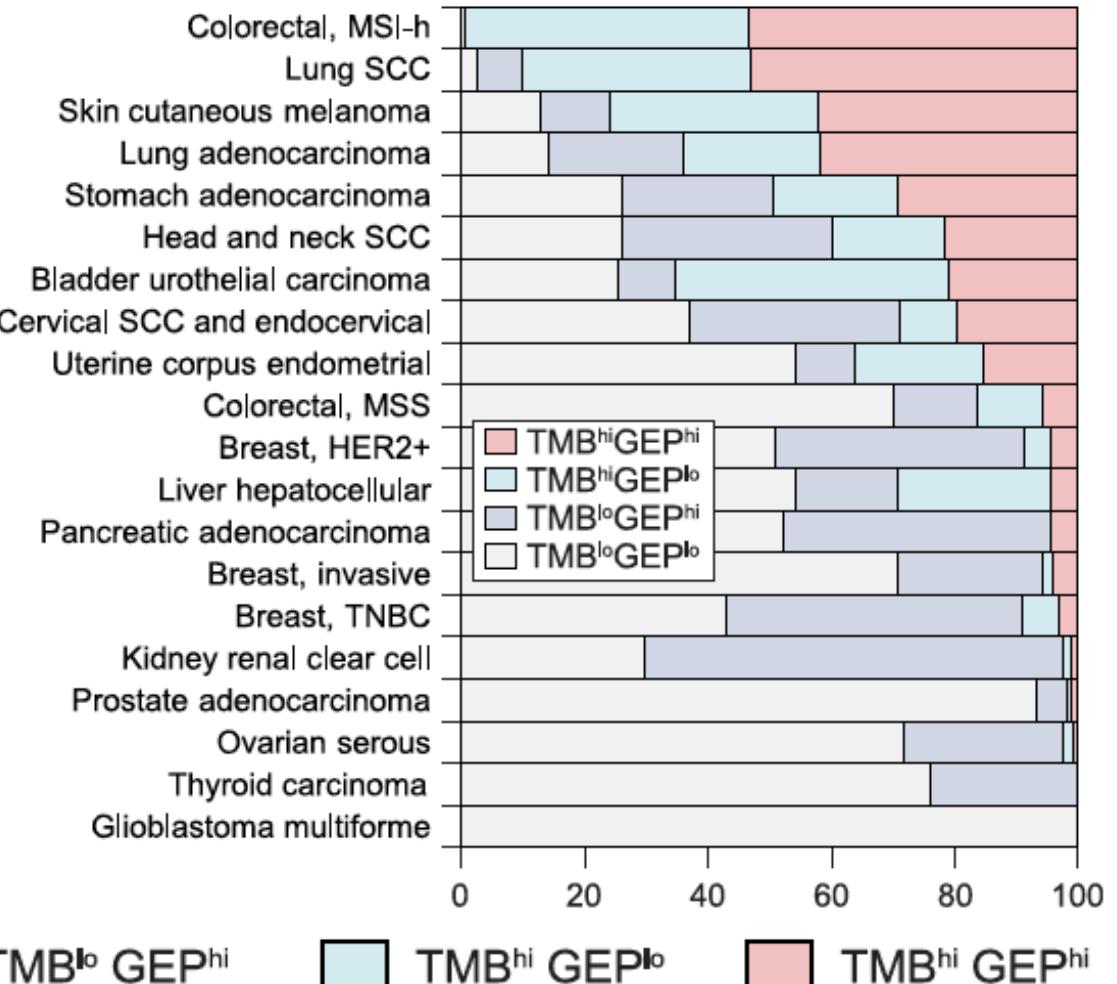
TMB<sup>lo</sup> GEP<sup>hi</sup>



TMB<sup>hi</sup> GEP<sup>lo</sup>



TMB<sup>hi</sup> GEP<sup>hi</sup>



# MULTI-OMICS PREDICTIVE MARKERS



## Systematic review and metanalysis

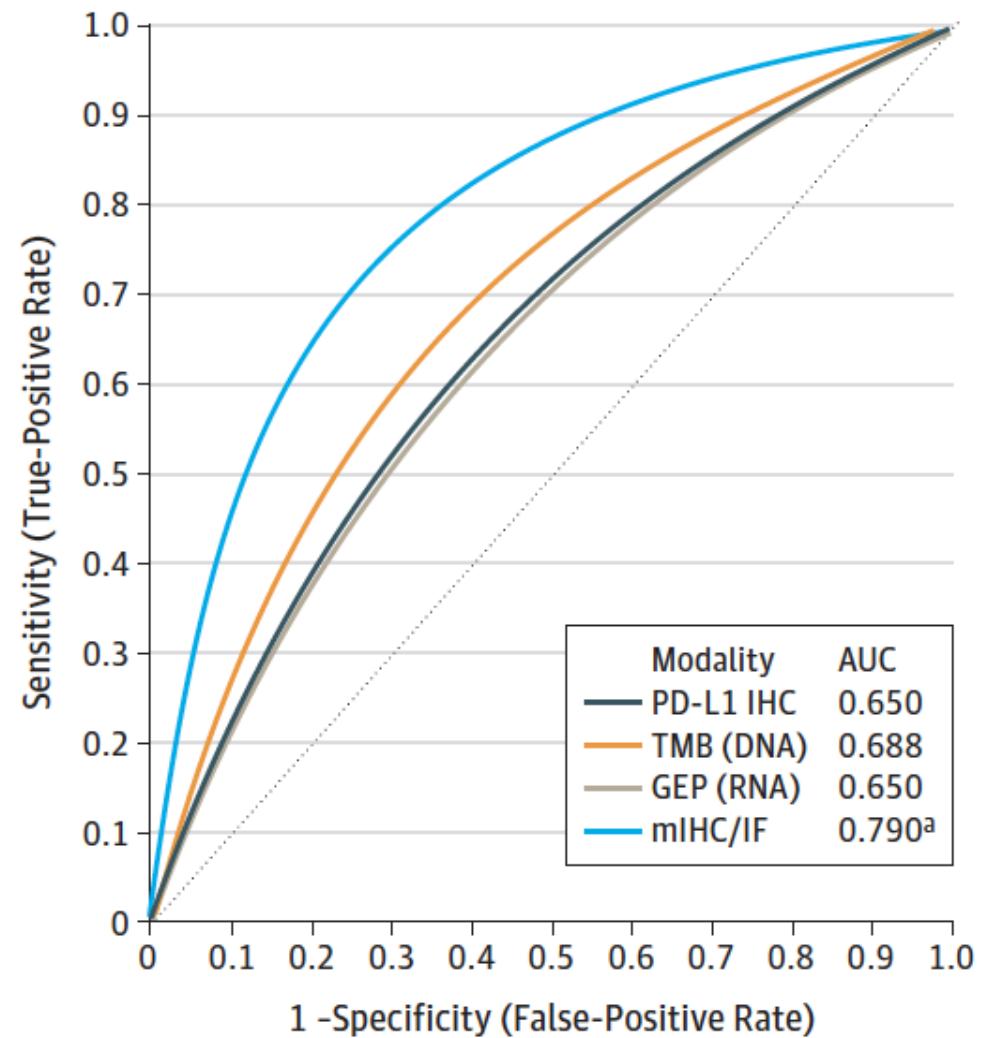
45 clinical trials

PD-L1 IHC

TMB

GEP cytotoxicity signature

Multiplex IHC/IF: quantitative CD8/PD-L1

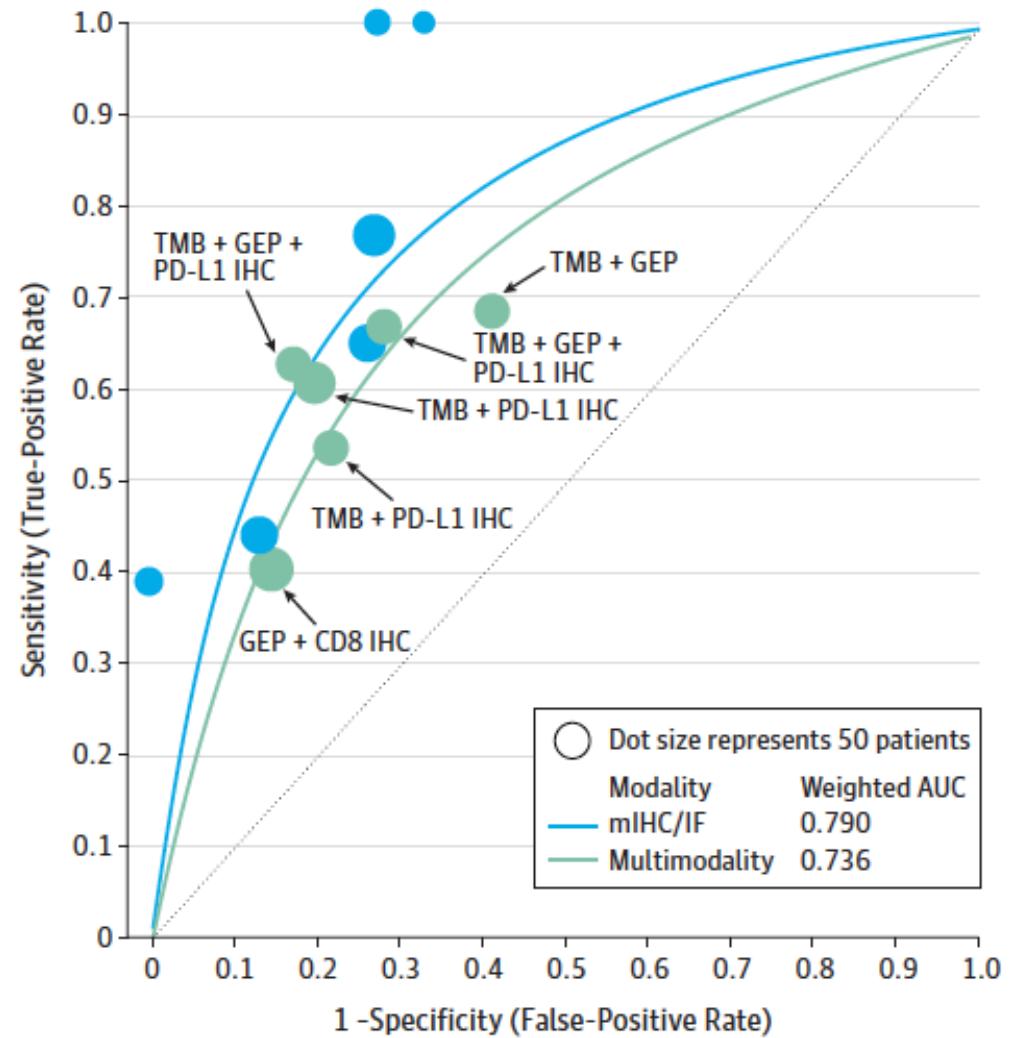


# MULTI-OMICS PREDICTIVE MARKERS



## Systematic review and metanalysis 45 clinical trials

PD-L1 IHC  
TMB  
GEP cytotoxicity signature  
Multiplex IHC/IF: quantitative CD8/PD-L1



# GENOMIC MARKERS



## Response

Clonal mutations, viral neoantigens

Hypermutation – MSI, *POLE* mut, high TMB, DDR alt

Upregulation of *PDL1* (ampl)

Epigenetic events (*PBMR1*, *SMARCA4*, *ARID1A*, *ARID2*...)

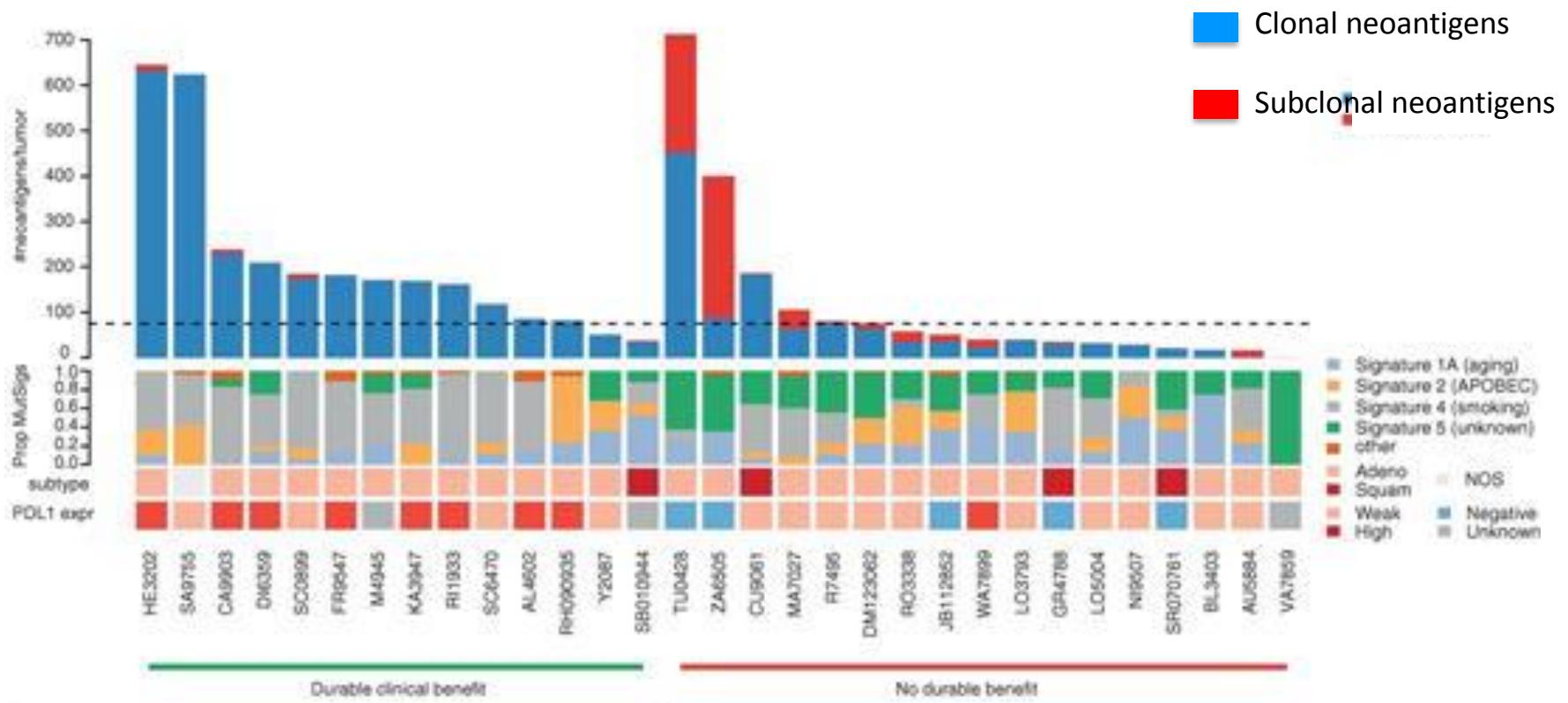
## Resistance

Single gene alterations – *STK11* mut, *PTEN* loss, *CDK4/CCND1* ampl

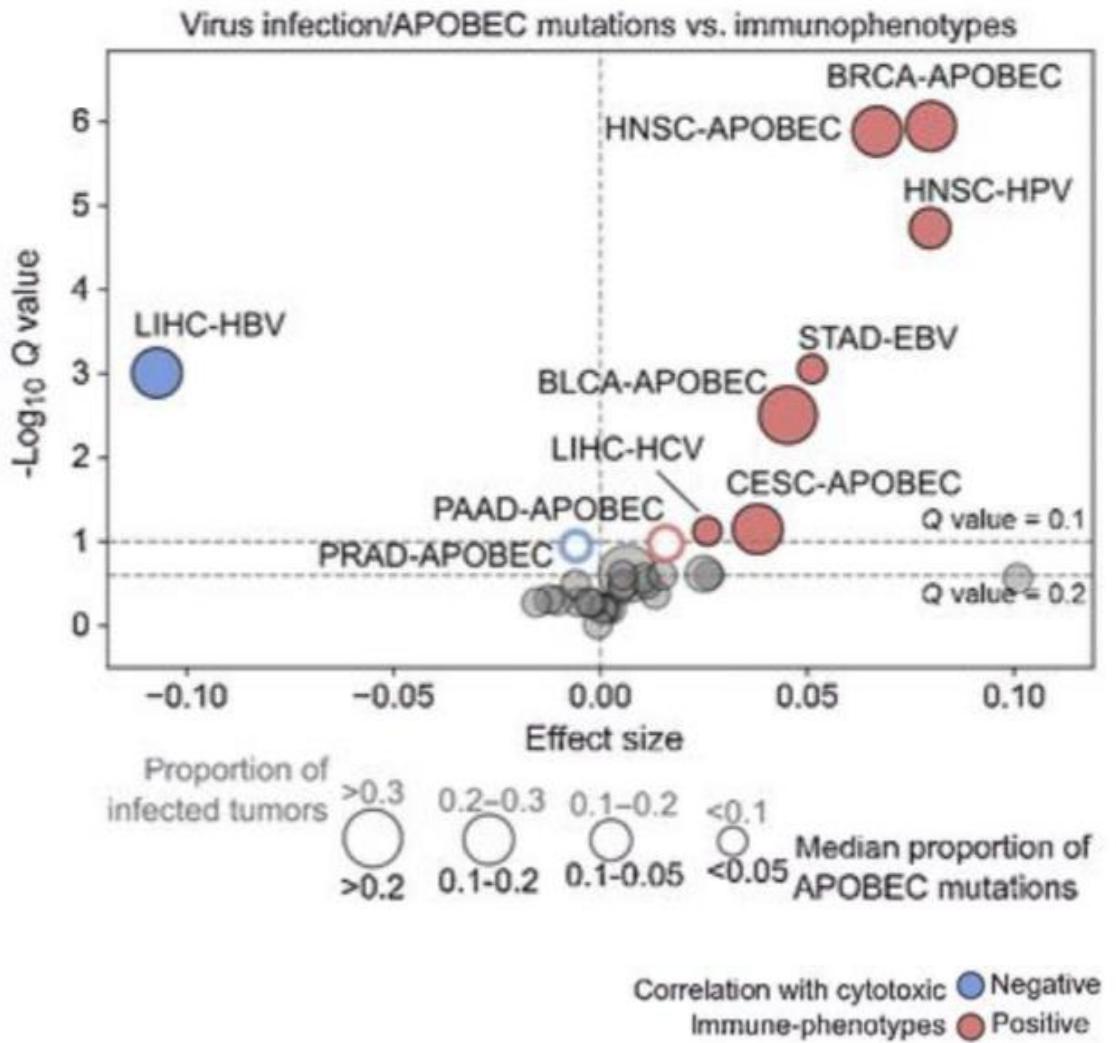
High levels of copy number loss

Alterations in Interferon and antigen presentation signaling

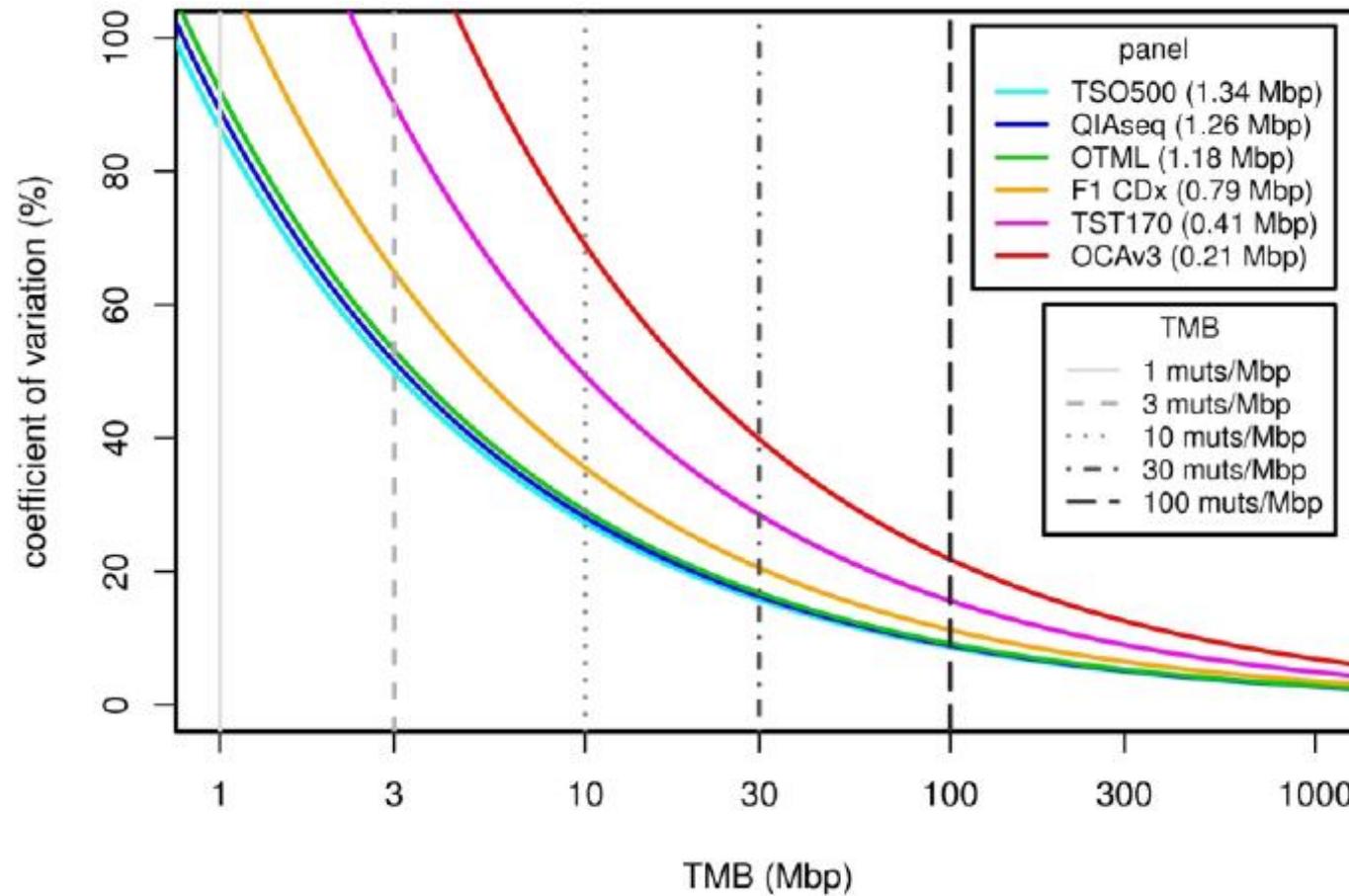
# CLONAL NEOANTIGENS IN LUNG CANCER



# VIRAL NEOANTIGENS AND APOBEC MUTATION SIGNATURE



# OPTIMIZING PANEL-BASED TMB MEASUREMENT

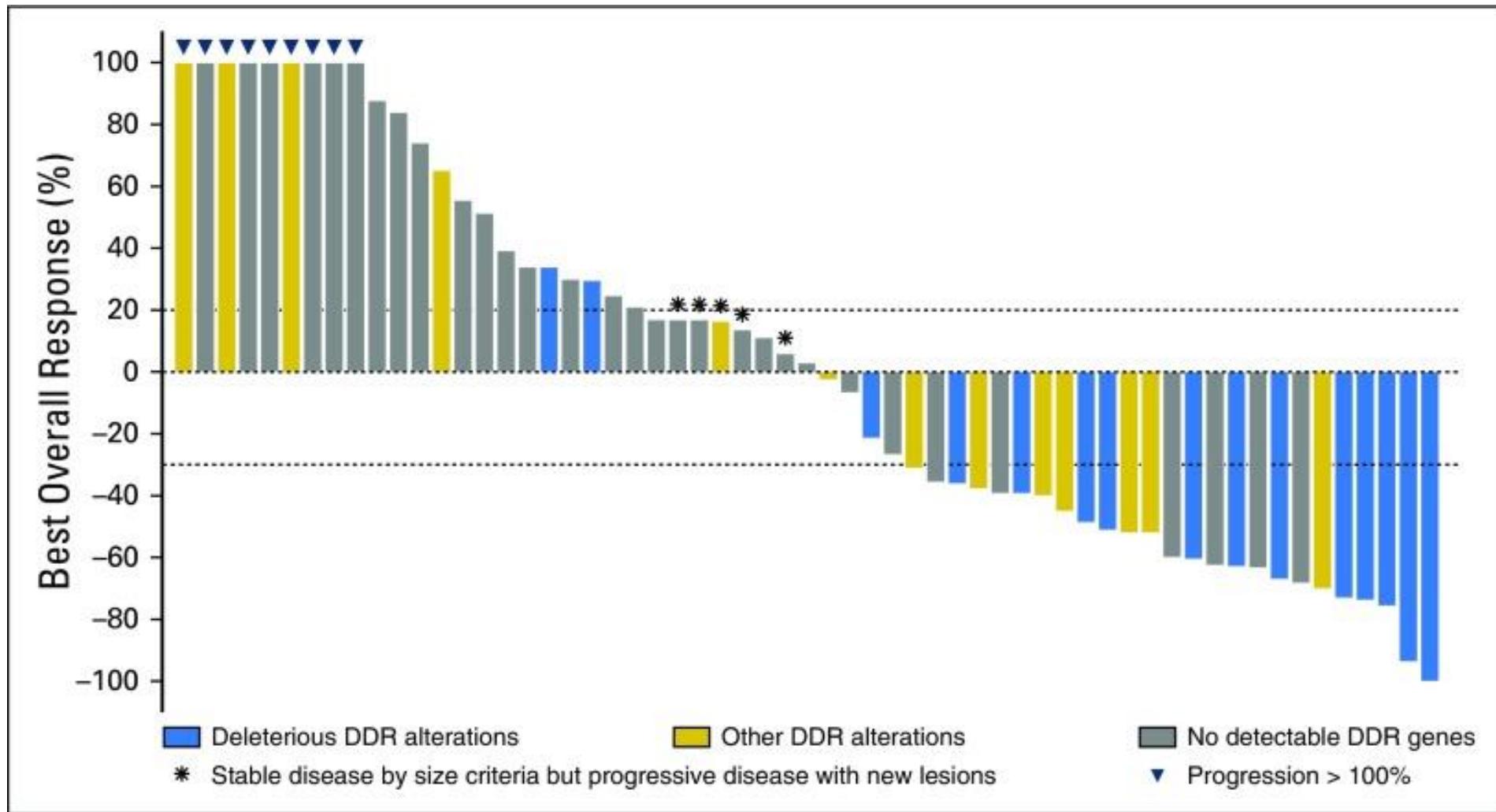


~ 33% misclassification rate  
across commercial panels

## Important aspects:

- Cut-offs (tumor type/ setting)
- Source (tissue, ctDNA)
- Harmonization
- Prognostic vs. predictive (OS gain)

# DNA DAMAGE REPAIR ALTERATIONS



# PD-L1 UPREGULATION



Hodgkin's lymphoma – 9p24.1 gain

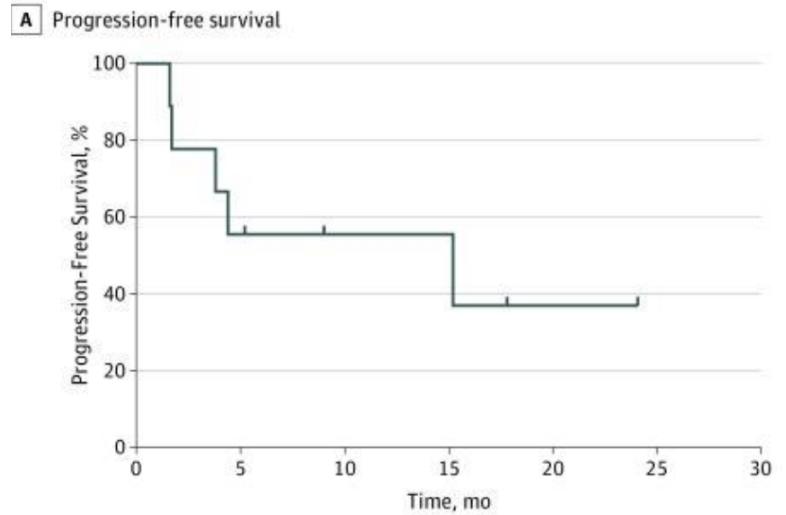
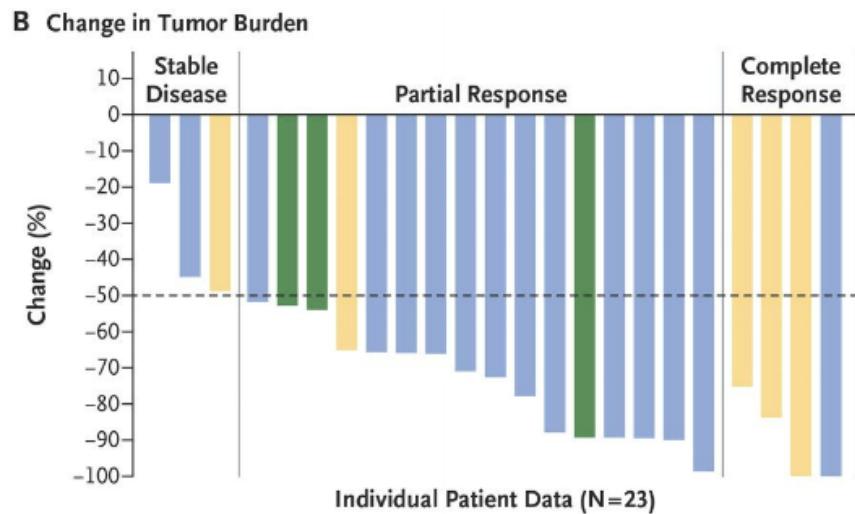
ORR 70%

Ansell et al, NEJM 2015

*PDL1 amplification in solid tumors*

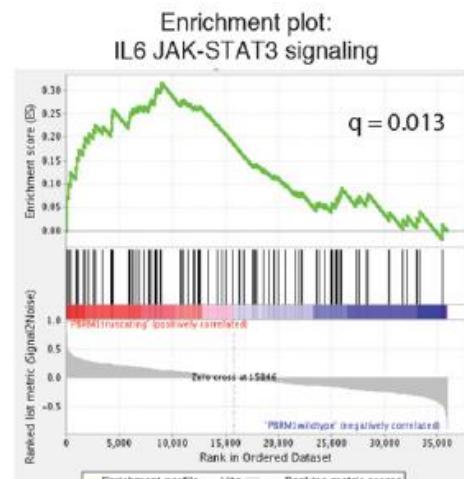
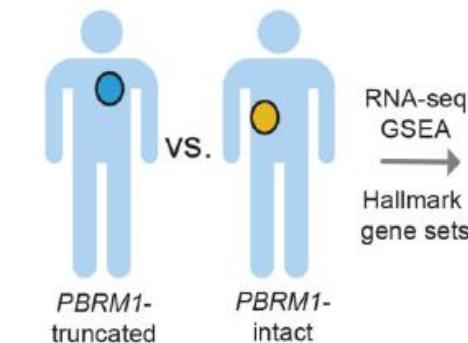
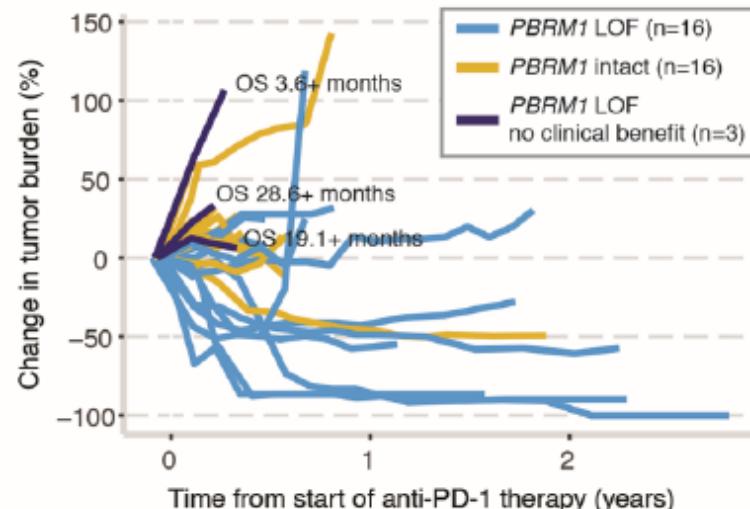
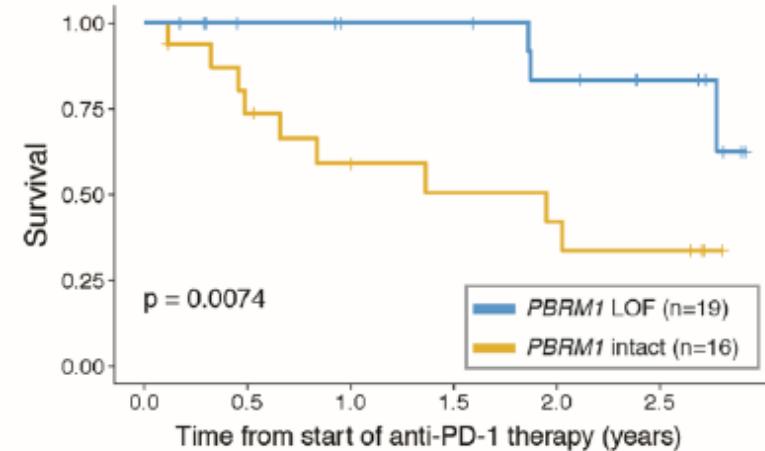
ORR 67%

Goodman et al, JAMA Oncol 2018



# EPIGENETIC ALTERATIONS IN RENAL CANCER

SWI/SNF alterations:  
*PBRM1* mut





# EPIGENETIC ALTERATIONS ACROSS TUMORS

**ARID1A deficiency promotes mutability and  
potentiates therapeutic antitumor immunity  
unleashed by immune checkpoint blockade**

*ARID1A* mut

Nature Medicine 2018

**A major chromatin regulator determines resistance of  
tumor cells to T cell-mediated killing**

*PBMR1* mut, *ARID2* mut

Science 2018

**Immune-Active Microenvironment in Small Cell Carcinoma of  
the Ovary, Hypercalcemic Type: Rationale for Immune  
Checkpoint Blockade**

*SMARCA4* mut

JNCI 2018

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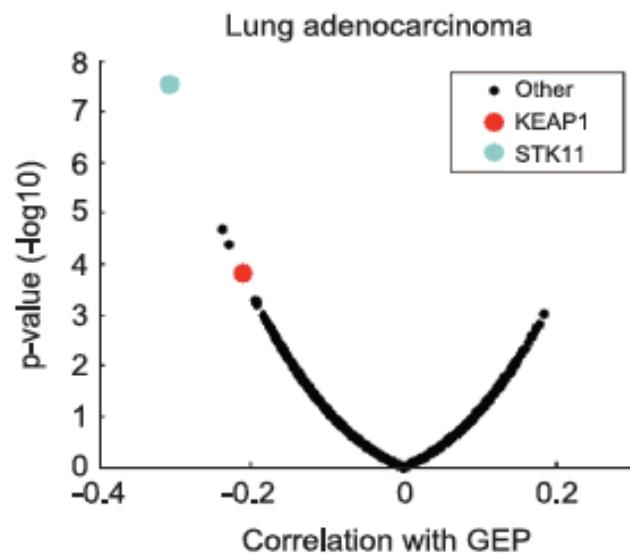
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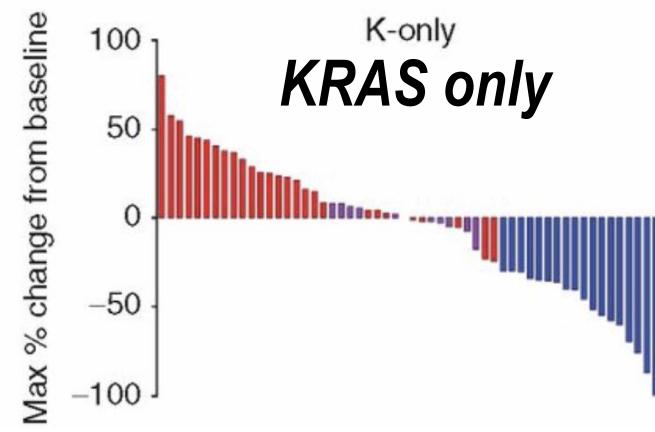
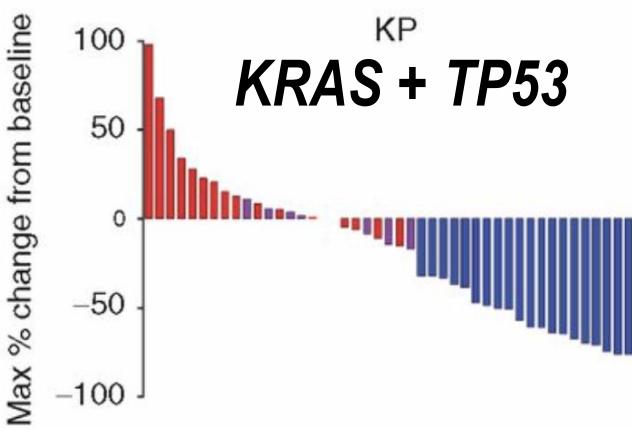
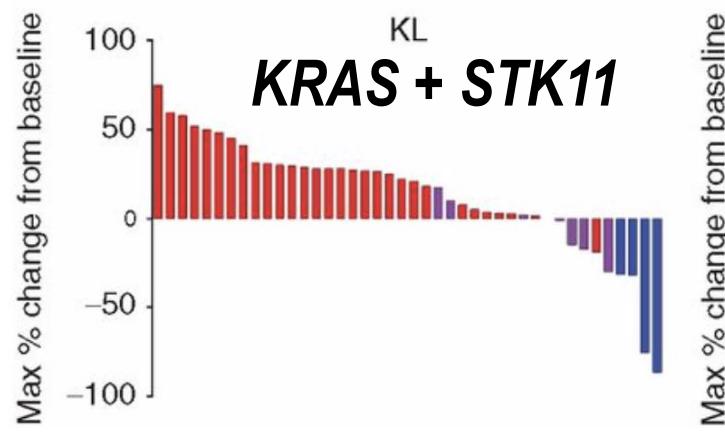
High levels of copy number loss

Alterations in Interferon and antigen presentation signaling

# STK11 MUTATIONS IN LUNG CANCER



Cristescu et al, Science 2018

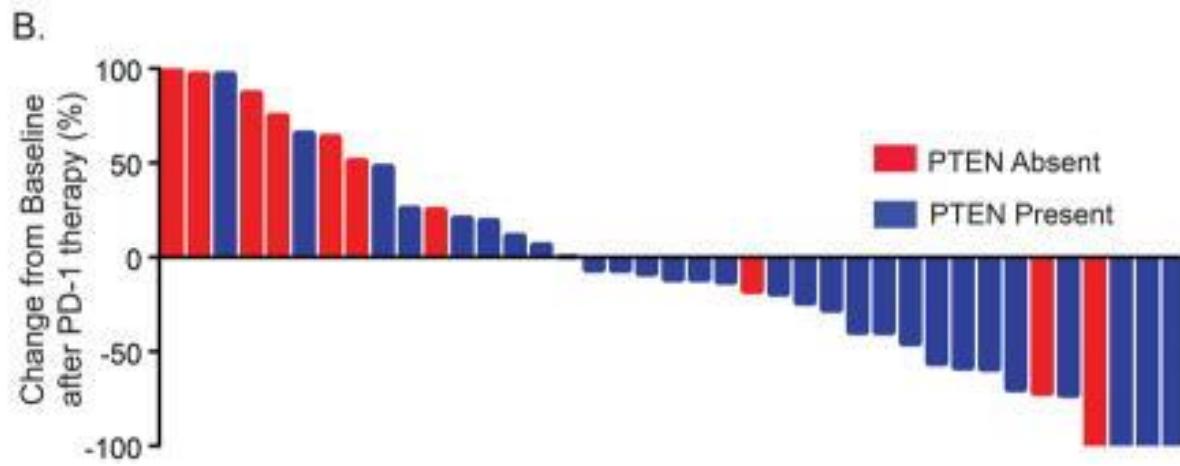


Skoulidis et al, Cancer Discov 2018

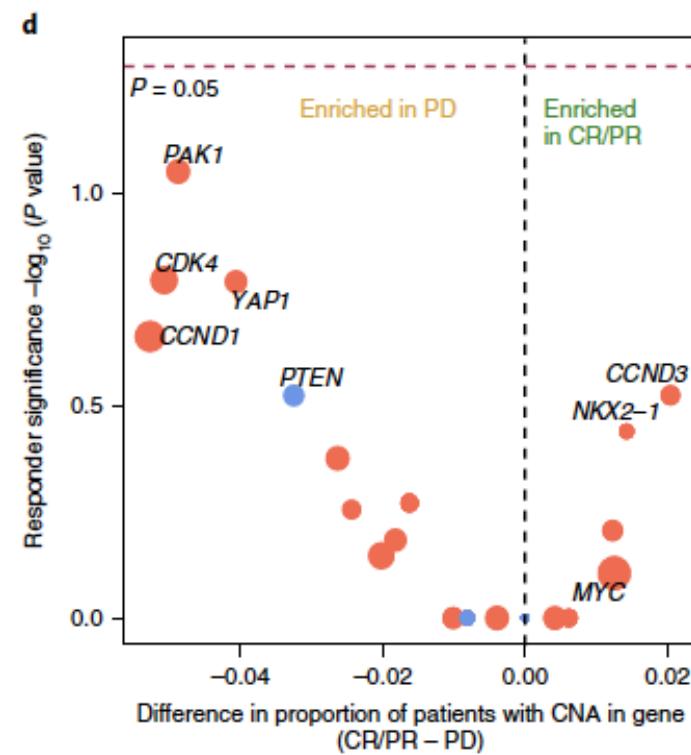
# PTEN LOSS AND CDK4/CCND1 AMPL



## Melanoma

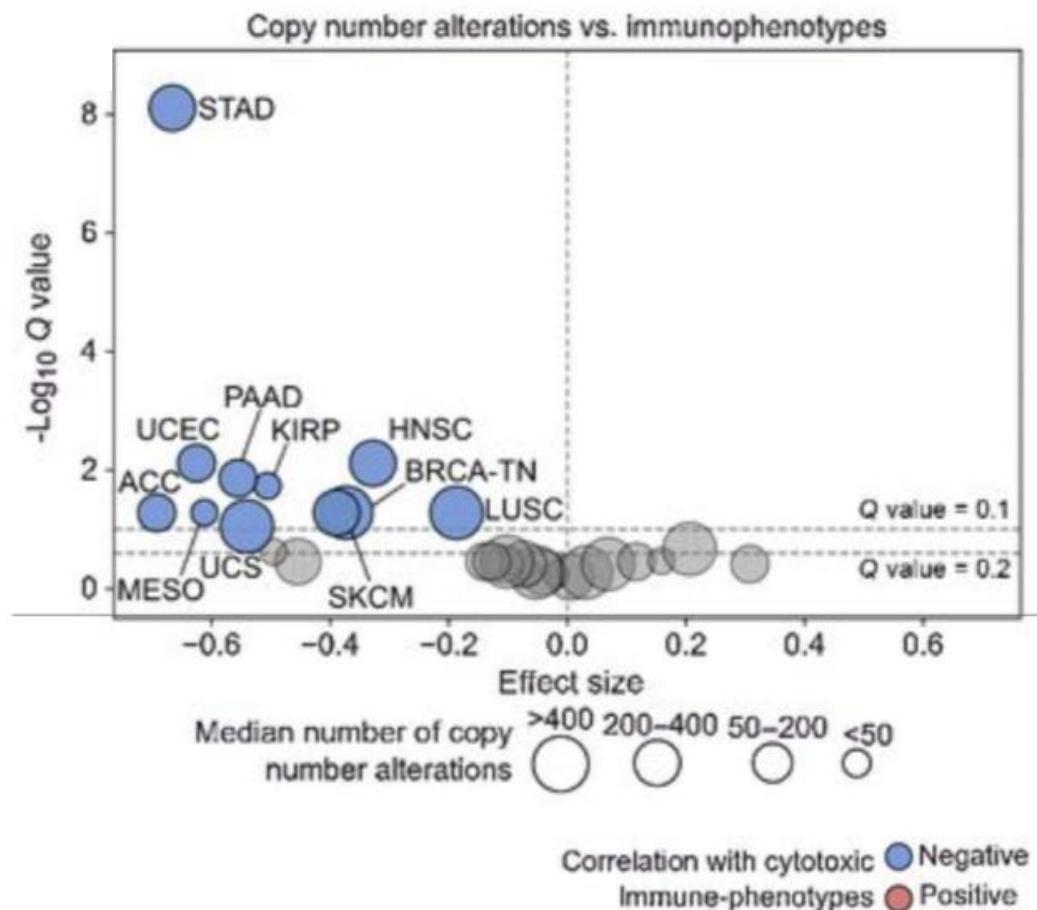


## Pan-tumor

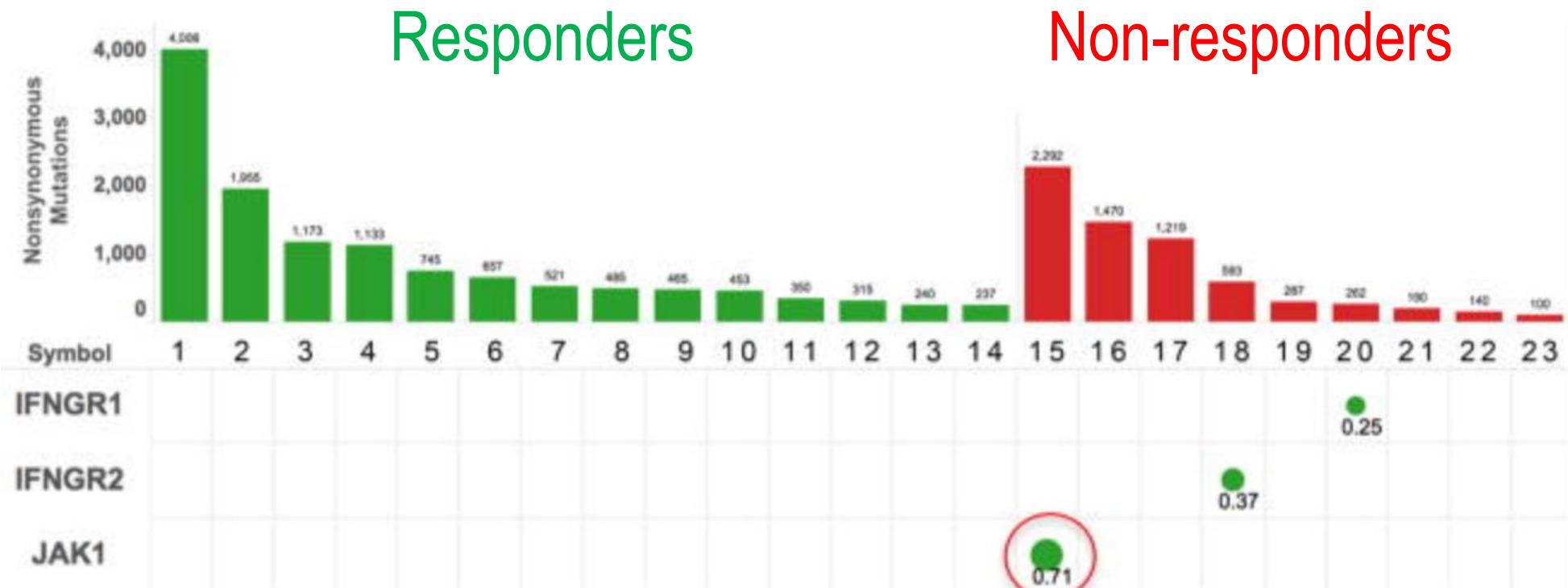




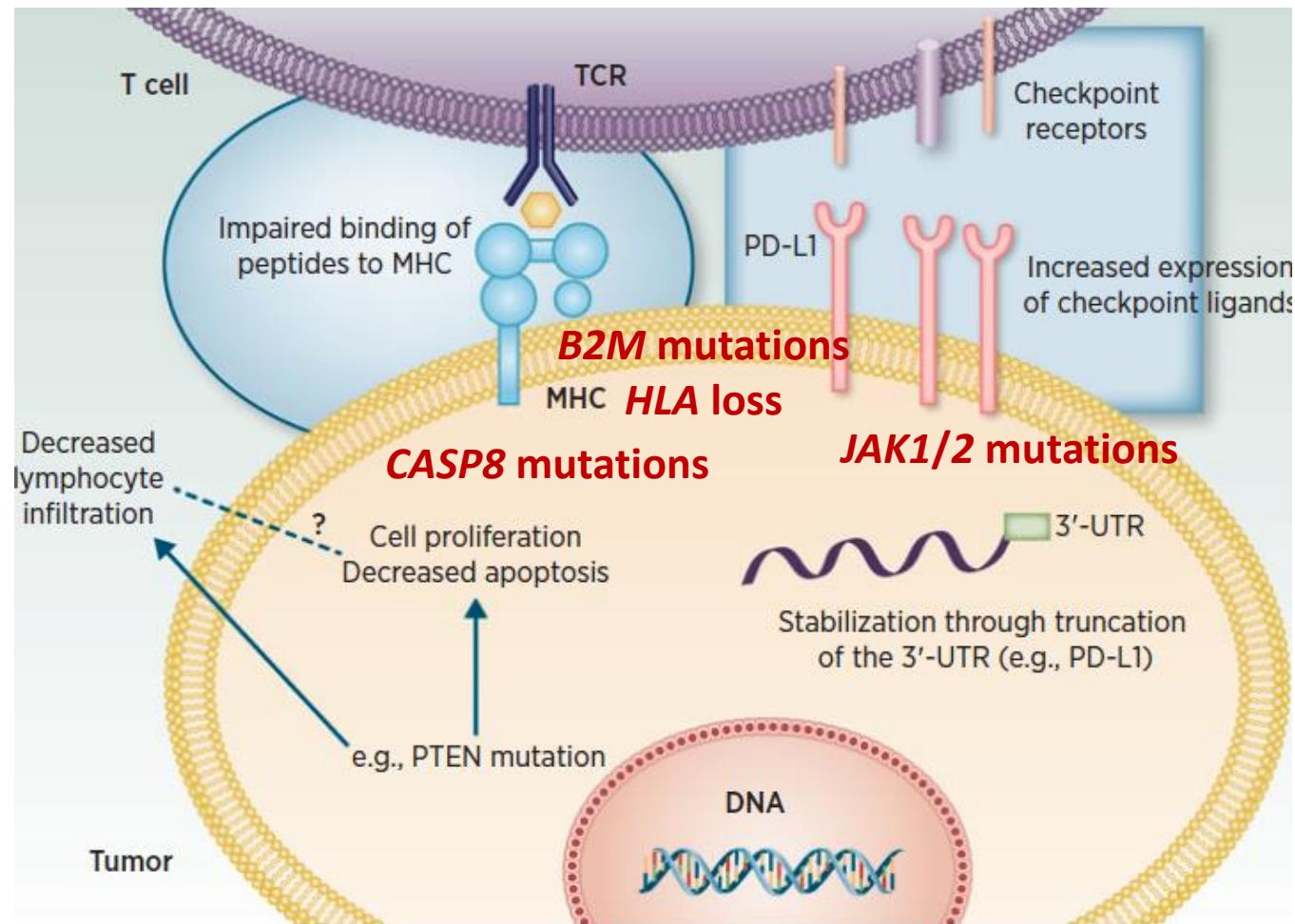
# HIGH COPY NUMBER ALTERATIONS ACROSS TUMORS



# INTERFERON PATHWAY MUTATIONS IN MELANOMA AND MSI COLON CANCER



# ACQUIRED ANTIGEN PRESENTATION PATHWAY ALTERATIONS



# TRANSCRIPTOMIC MARKERS



## Response

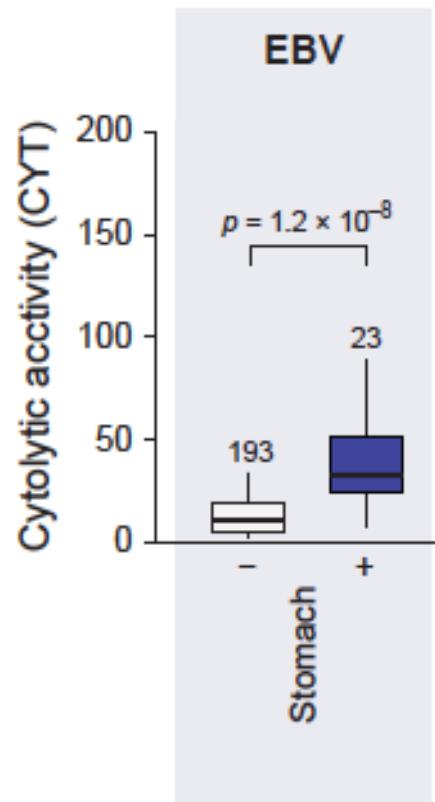
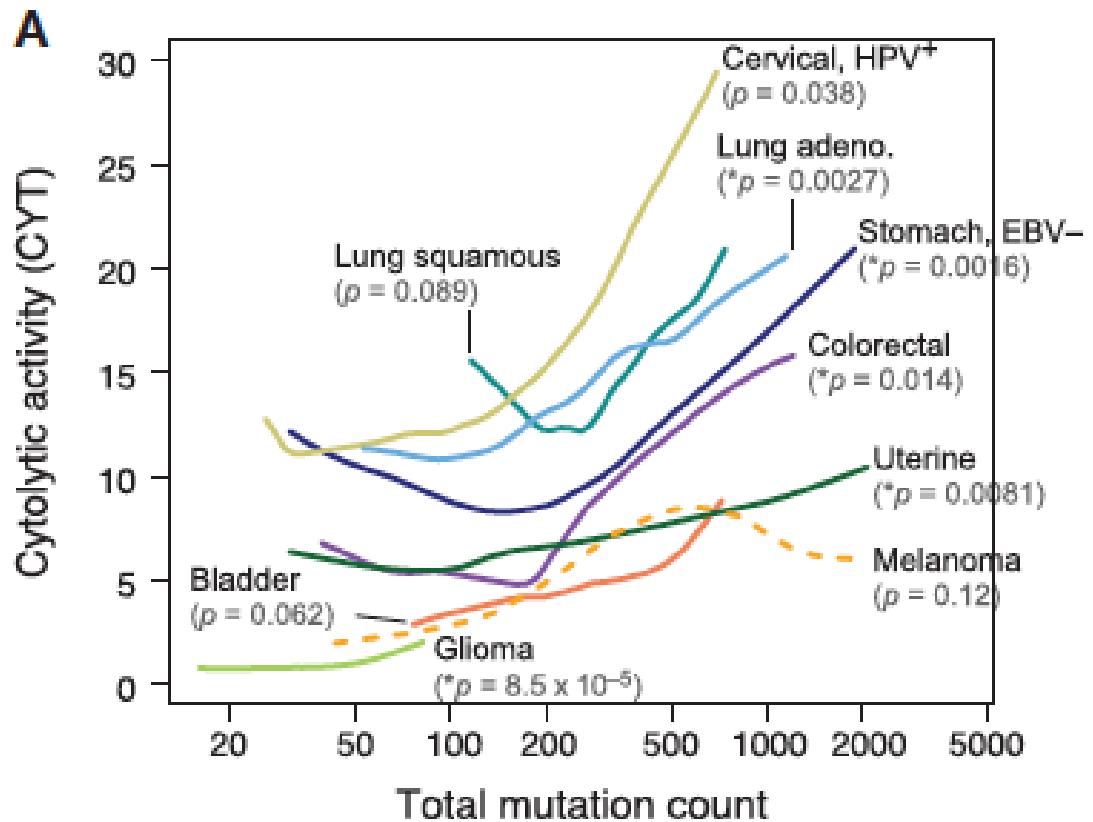
Cytotoxic (CD8 T cell inflammation) microenvironment signatures

## Resistance

Pathway alterations – WNT high, TGFB high

# CYTOTOXIC SIGNATURES

granzyme A (*GZMA*) and perforin (*PRF1*)



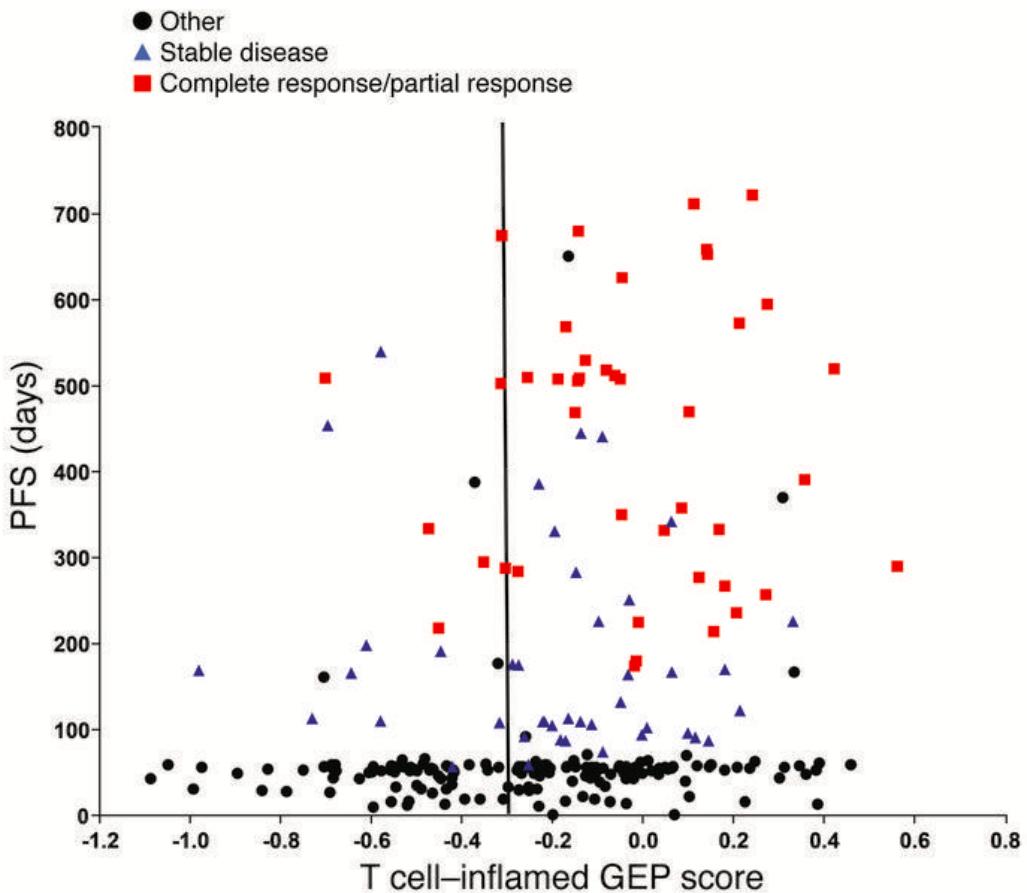
# CYTOTOXIC SIGNATURES



## Metanalysis

Melanoma, HNSCC, gastric  
Pembrolizumab

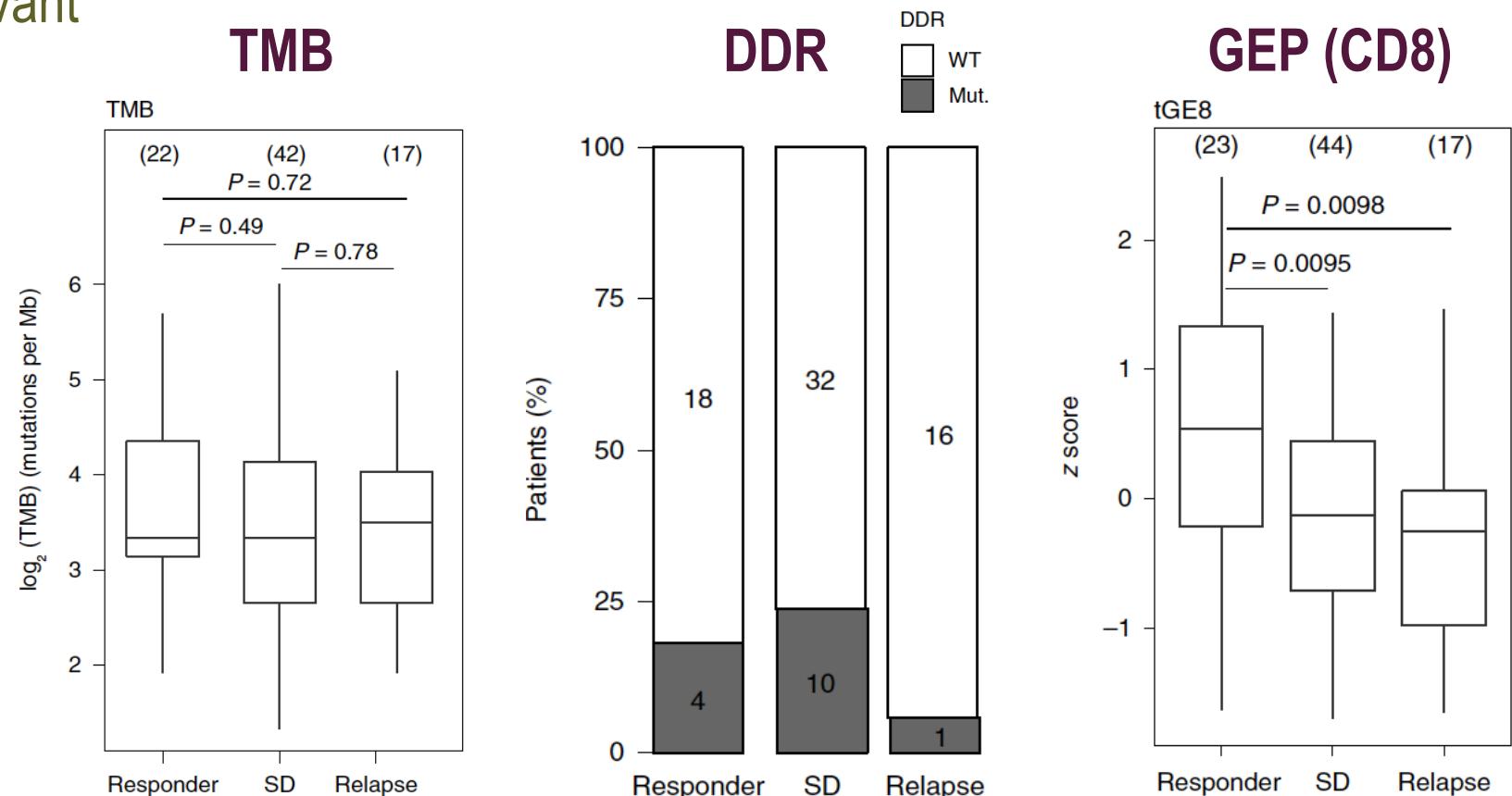
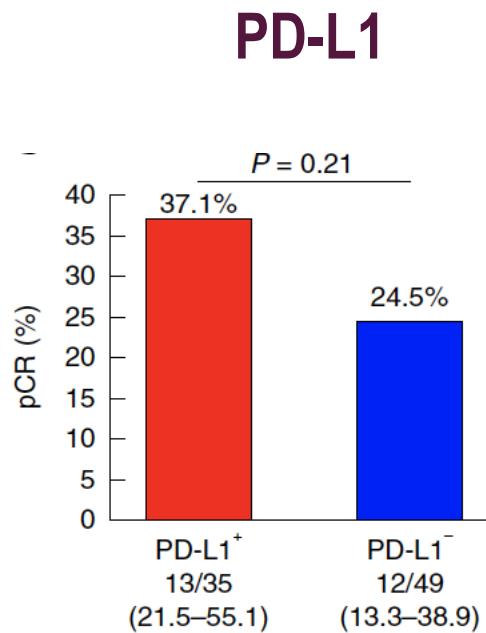
GEP cytotoxicity signature (10 genes)  
Nanostring nCounter



# CYTOTOXIC SIGNATURES



## ABACUS trial Bladder Cancer Atezolizumab neoadjuvant



# TRANSCRIPTOMIC MARKERS



## Response

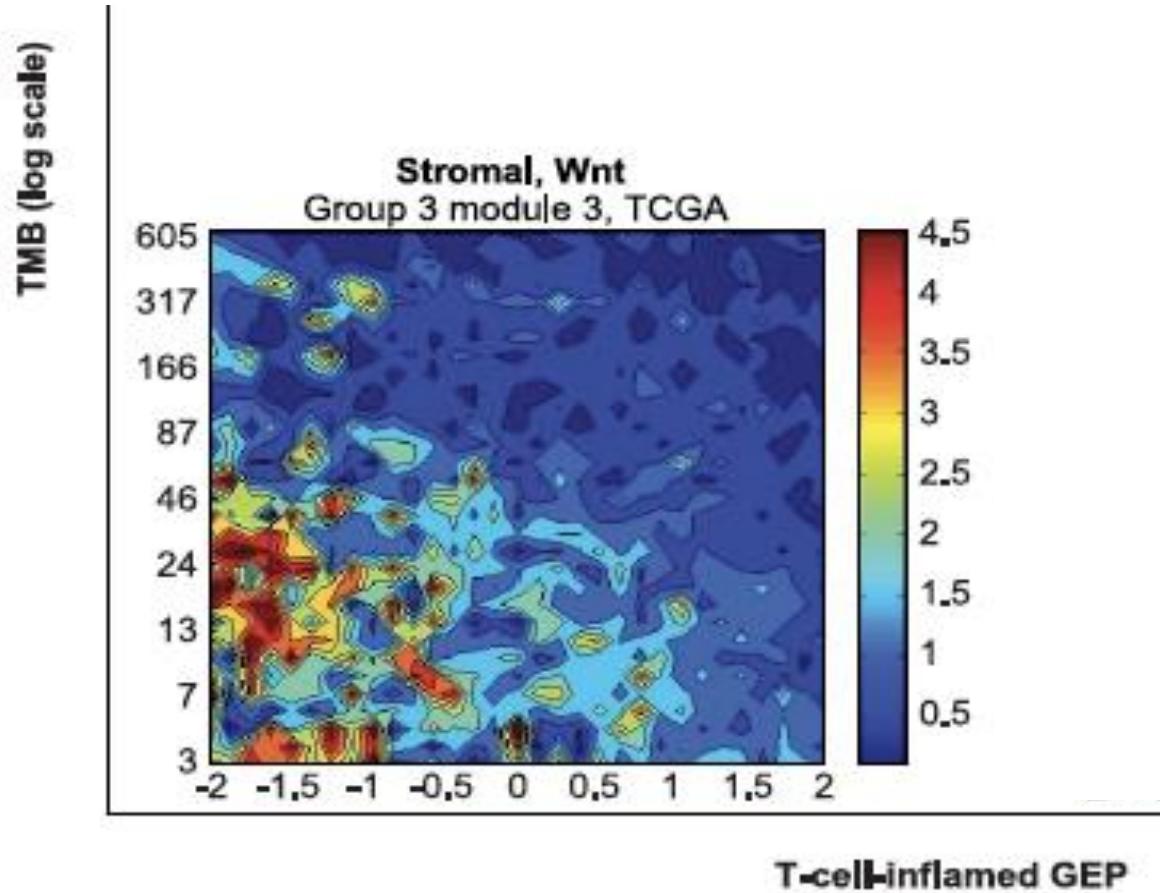
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# WNT AND TGFB HIGH SIGNATURES



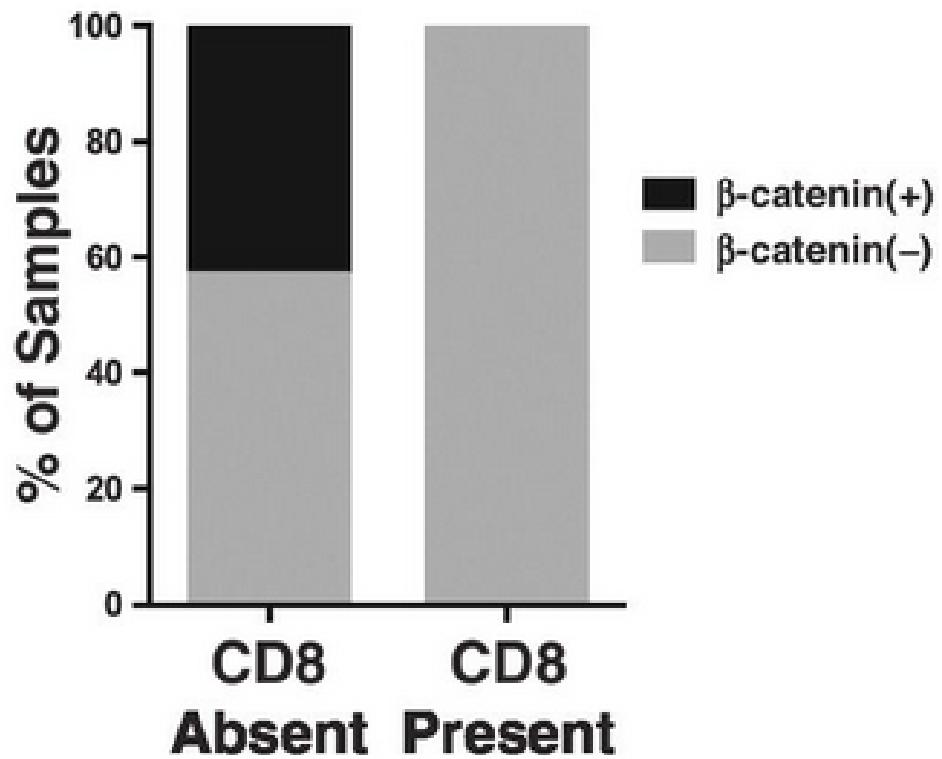
Cristescu et al, Science 2018

ESMO

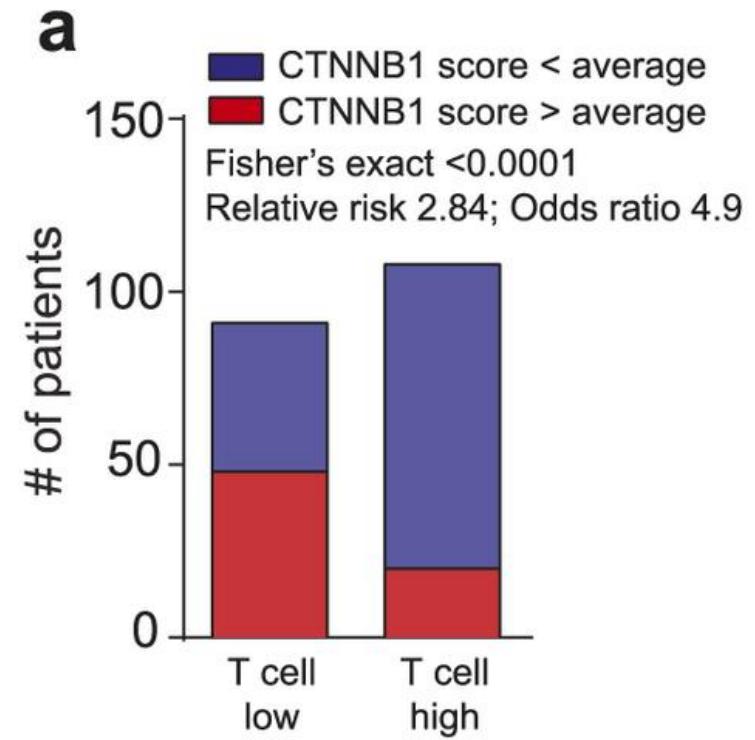
# B CATENIN POSITIVE/HIGH



## Bladder



## Melanoma



Sweis et al, Cancer Immunol Res. 2016

Spranger et al, Nature 2015



# CONCLUSIONS

- Response to immune checkpoint inhibitors is multi-factorial
- PD-L1, TMB and CD8 signatures (and combinations) have highest potential
  - Tumor type and disease setting matter
- There is room for further biomarker development (digital pathology, radiomics, patient genetics/phenomics)
- Design clinical trials with power for retrospective correlative analysis (not only “exploratory analysis”) in homogeneous populations.

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  - Design clinical trials with power for retrospective correlative analysis (not only “exploratory analysis”) in homogeneous populations.
- TIME TO MOVE TO NEGATIVE PREDICTIVE MARKERS?**  
**ARE THERE UNIVERSAL RESISTANCE MARKERS?**