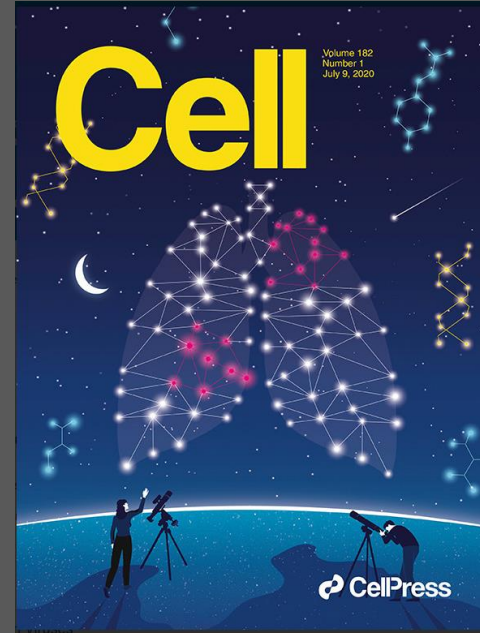


# Proteogenomic Characterization Reveals Therapeutic Vulnerabilities in Lung Adenocarcinoma



*Shankha Satpathy, PhD*

*On behalf of the CPTAC Lung Adenocarcinoma Working Group*

**Gillette\*, Satpathy\*.. Clinical Proteomic Tumor Analysis Consortium**

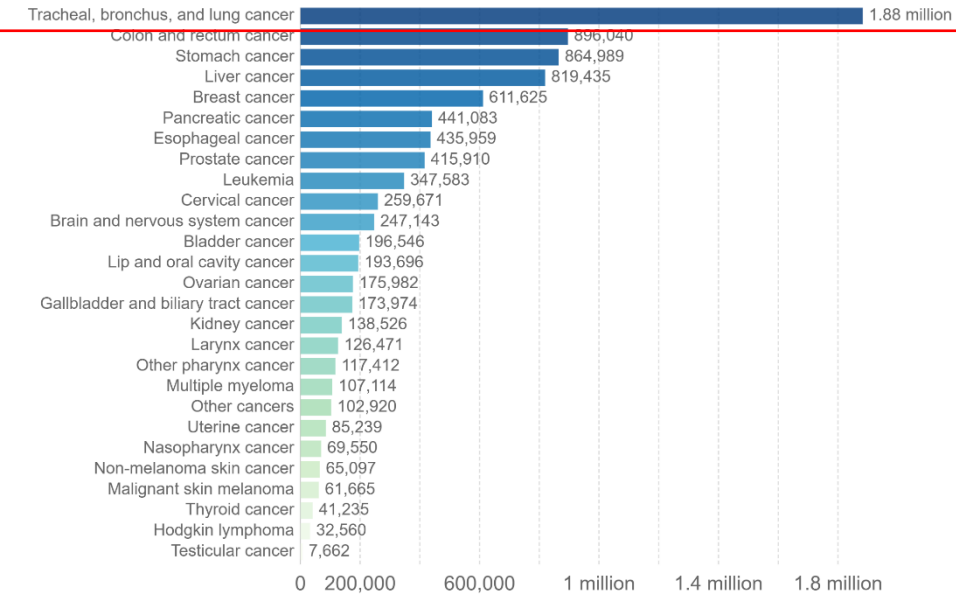


# Lung cancer is of unparalleled clinical importance and is still organized by histopathologic subtype

## Cancer deaths by type, World, 2017

Total annual number of deaths from cancers across all ages and both sexes, broken down by cancer type.

Our World  
in Data



Source: IHME, Global Burden of Disease (GBD)

CC BY

***Lung cancer is the leading cause of cancer death worldwide  
(1.8M cases; 1.6M deaths)***

- Non-small cell lung cancer (85%)
  - Adenocarcinoma (40%)
  - Squamous cell carcinoma (30%)
  - Large cell carcinoma (10%)
- Small cell lung cancer (15%)

<https://ourworldindata.org/cancer>

<https://lungevity.org/for-supporters-advocates/lung-cancer-statistics>

# Lung Adenocarcinoma

## Clinical importance:

- Adenocarcinoma is the most common histologic subtype, accounting for ~40% of lung cancer and >500,000 deaths annually
- Most LUAD is smoking related, but it is the least smoking-related lung cancer
- Molecularly targeted therapies have improved treatment for patients with somatically activated oncogenes: mutant EGFR, translocated ALK; also translocated RET and ROS1 and mutant BRAF and ERBB2
- Most lung adenocarcinomas not targetable (lack an identifiable driver oncogene or harbor KRAS mutations)

## Genomic Landscape

Smoking-related adenocarcinoma (~80%) has an exceptionally **high mutational burden**: 8 – 10 mutations / megabase  
~ 1 mutation / megabase in non-smoking related LUAD

In total ~18 – 40 genes significantly mutated [TCGA; Tumor Portal]

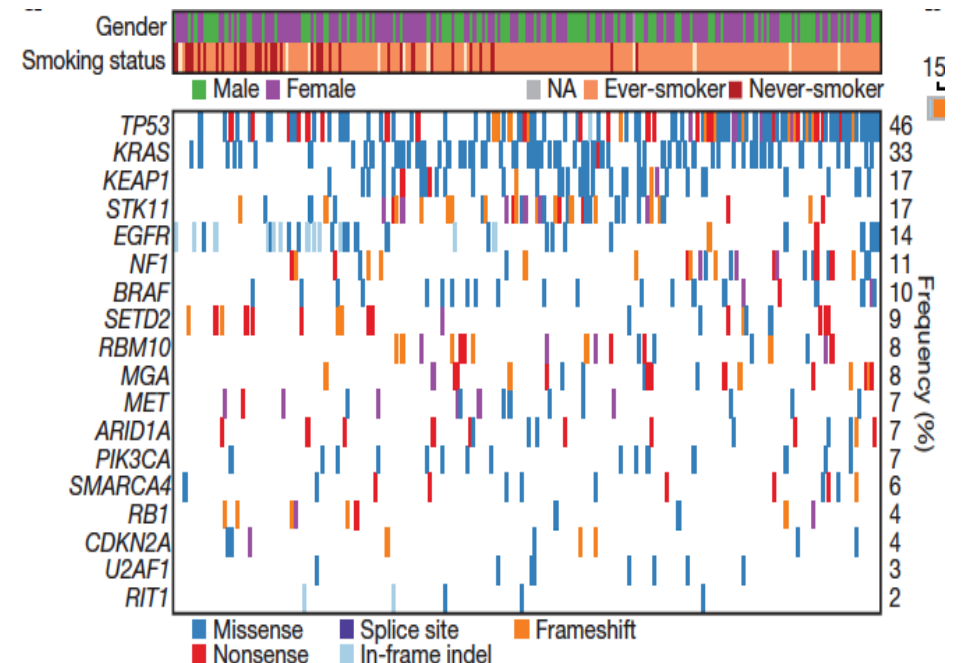
**Oncogene** mutations: KRAS (33%), EGFR (14%), BRAF (10%), PIK3CA (7%), MET (7%)

**Tumor suppressor** mutations: TP53 (46%), STK11 (17%), KEAP1 (17%), NF1 (11%), RB1 (4%), CDKN2A (4%)

**RNA-splicing** gene mutations: RBM10, U2AF1

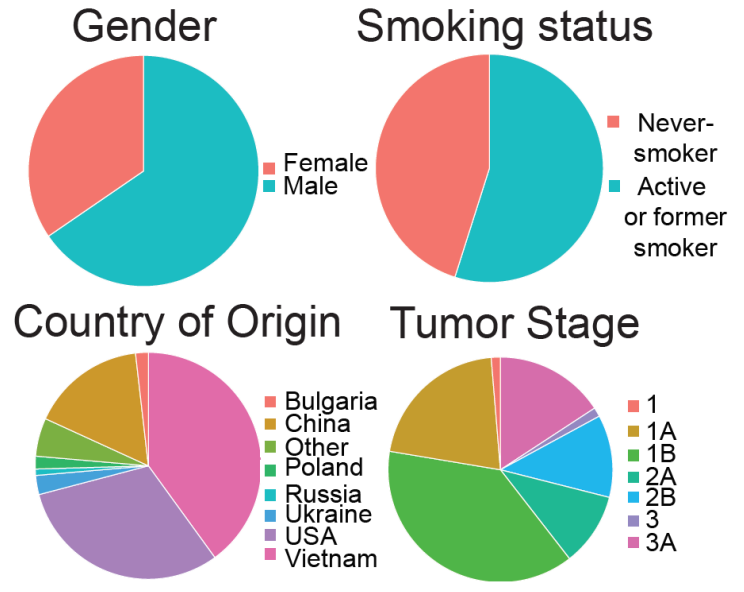
**Chromatin-modifying** gene mutations: SETD2, ARID1A, SMARCA4 } 10%

Genomic alterations segregate differently in smoking- and nonsmoking-related adenocarcinomas

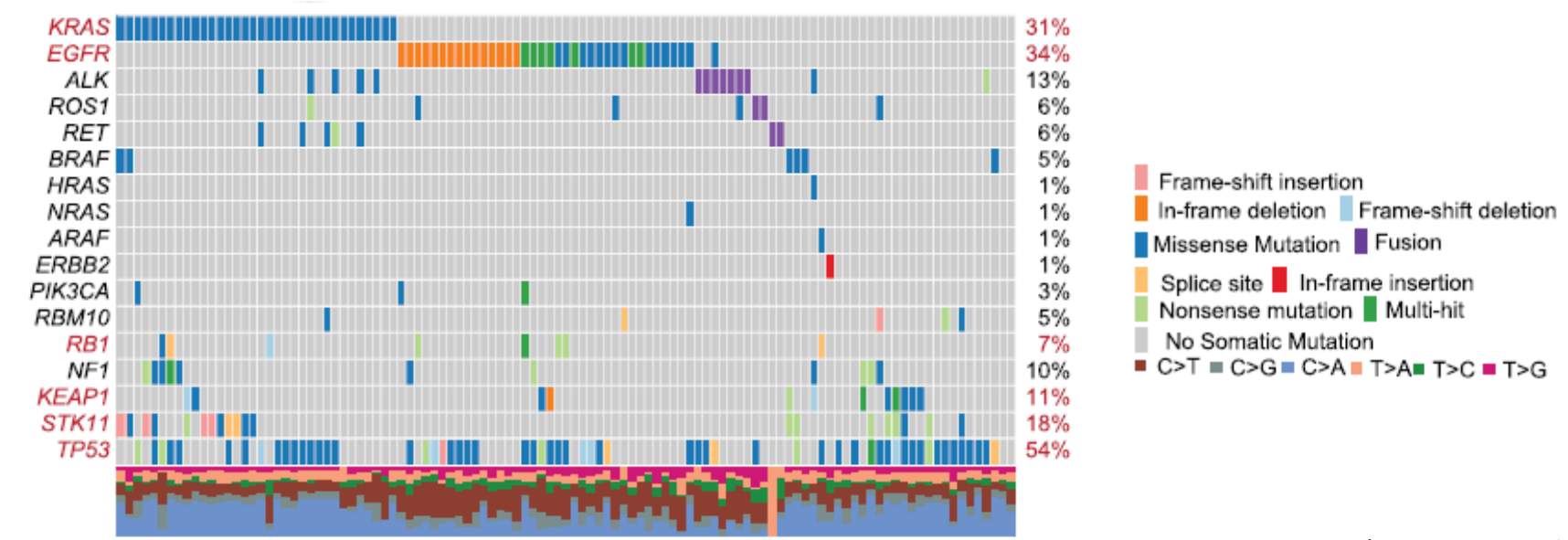


# LUAD Discovery samples represent diverse Country of Origin, Smoking Status and Stage

## Genomics and proteomics profiles were nearly complete for 110 LUADs & 101 NATs\*

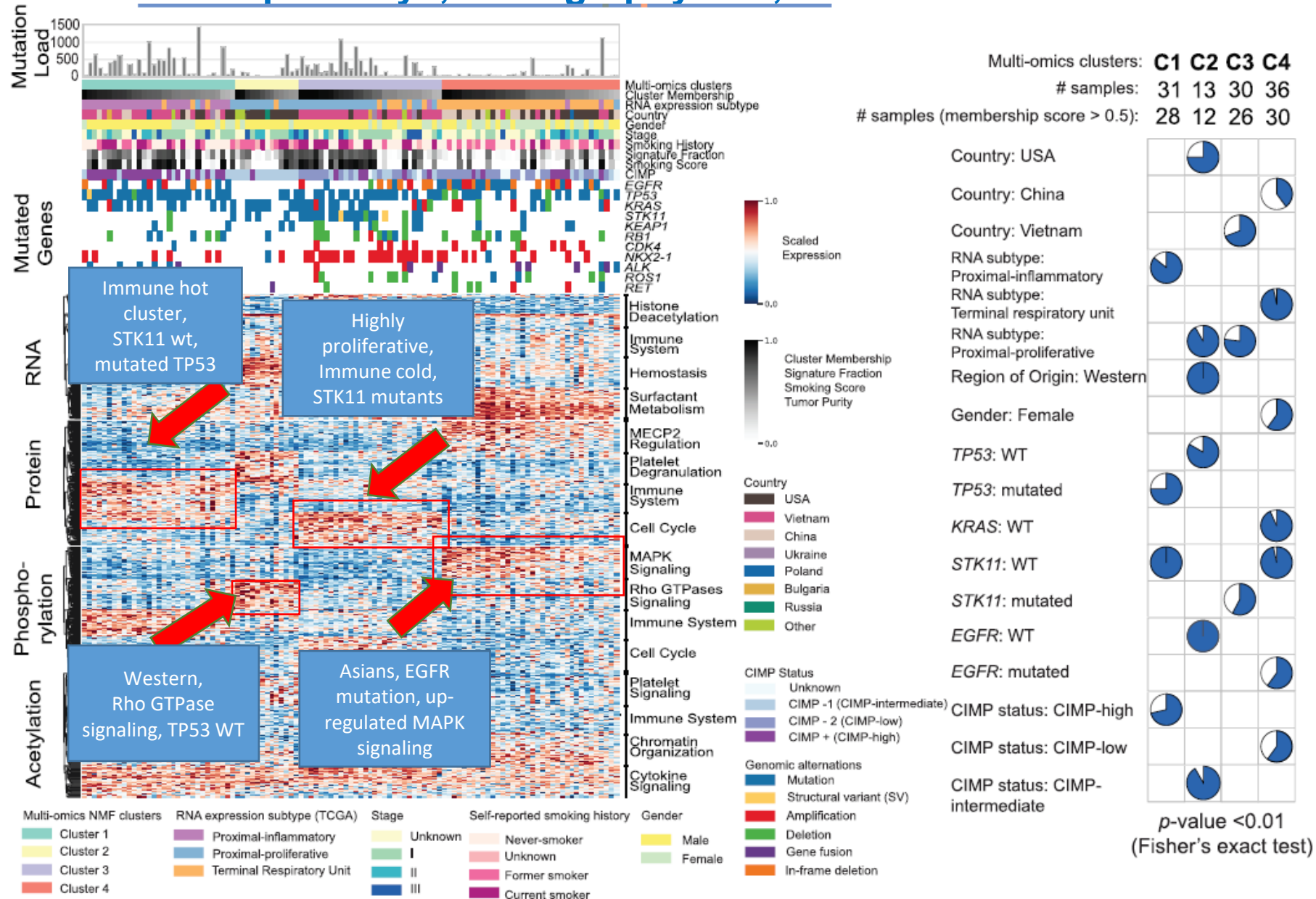


Platform	Data type	Features
Clinical metadata		15
WXS	Germline mutations	16,660
WGS	Somatic mutations	32,250
	CNA	19,267
Methylation array	DNA methylation	16,478
RNA-seq	mRNA	18,099
miRNA-seq	miRNA	2,585
TMT	Proteins	10,699
	Phosphorylation	41,188
Proteomics	Acetylation	6,906



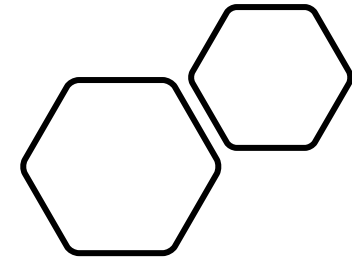
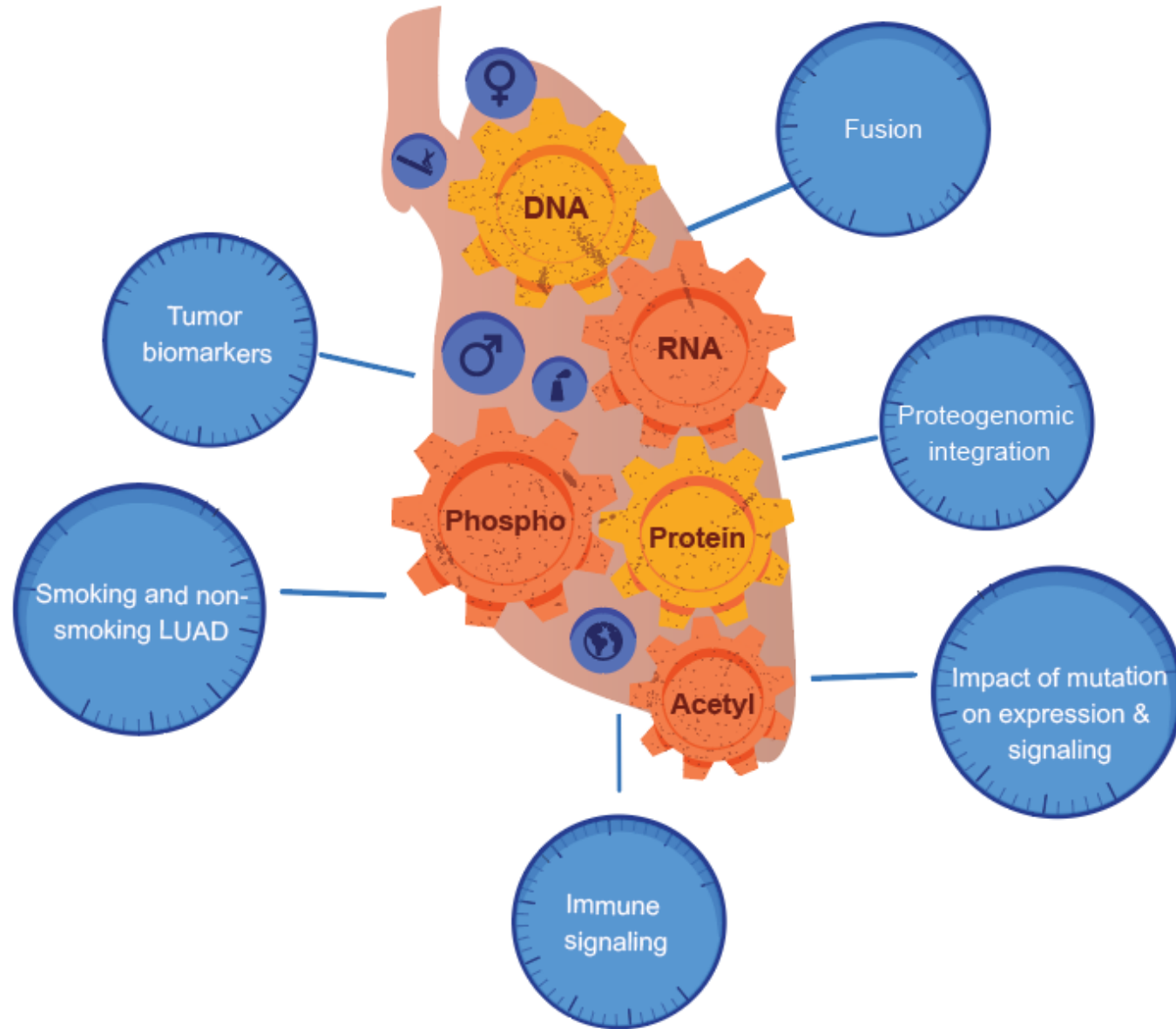
\*NAT= Normal Adjacent Tissue

# Multi-omics clustering (RNA, Protein, Phosphosite, Acetylsite) revealed 5 distinct clusters with unique characteristics for pathways, demography and, mutation status.





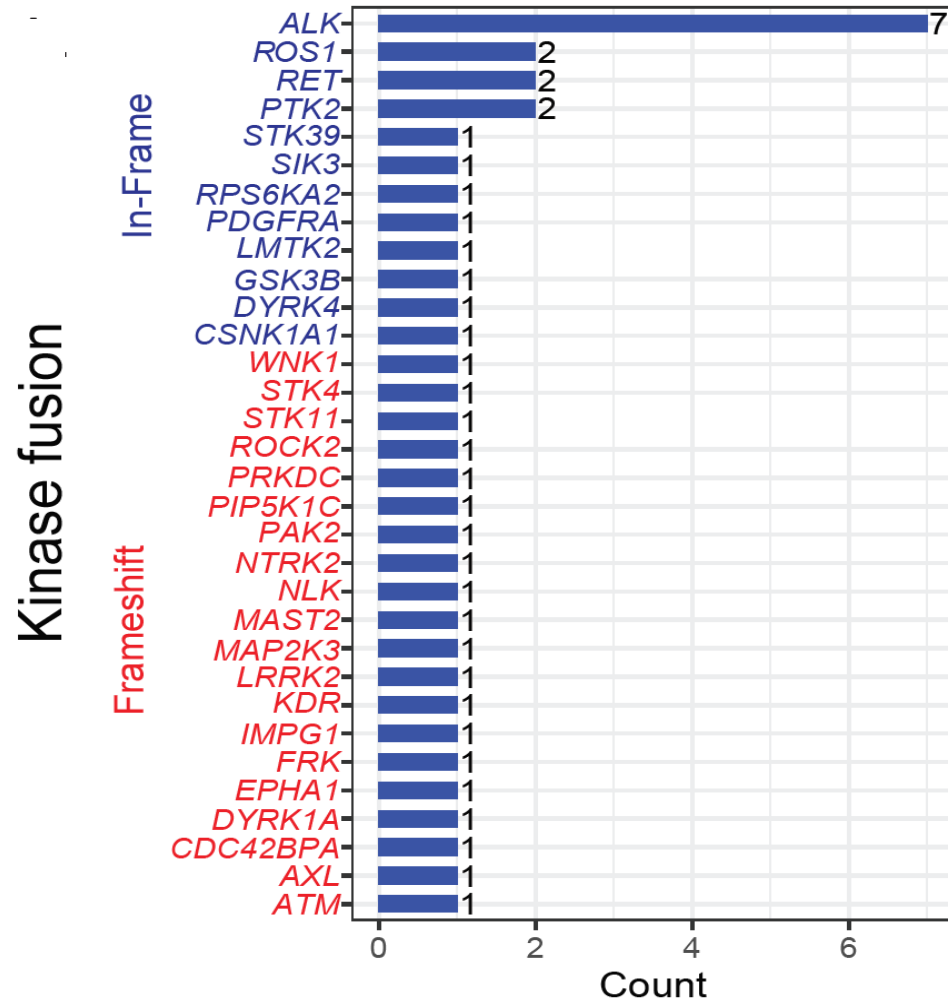
# Key biological vignettes exemplified by this state-of-the art CPTAC LUAD effort



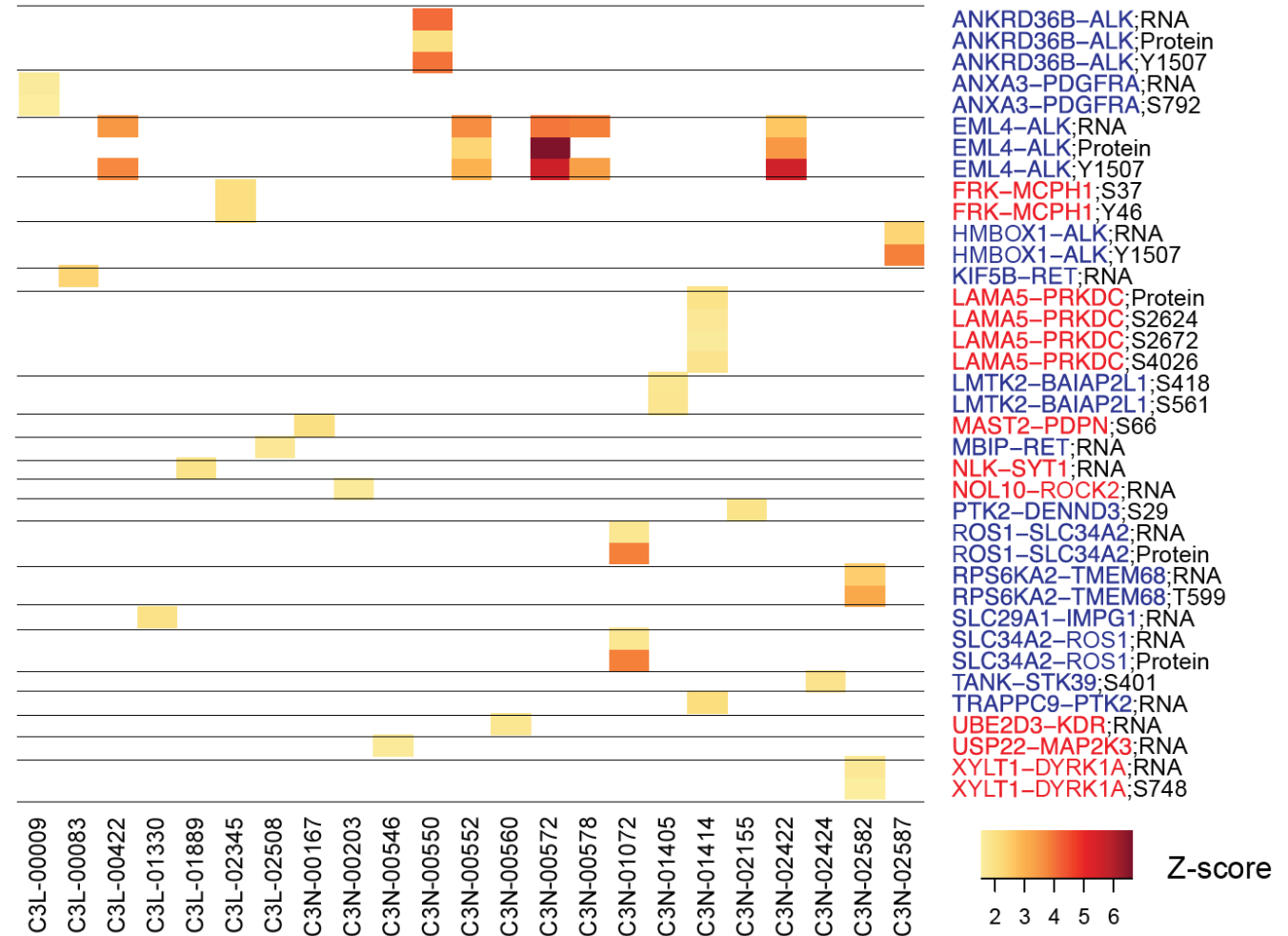
# Global characterization of kinase fusions includes *ROS1*, *RET*, and many others

## Outlier analysis suggested that more than half were likely functional

Fusions observed in this cohort



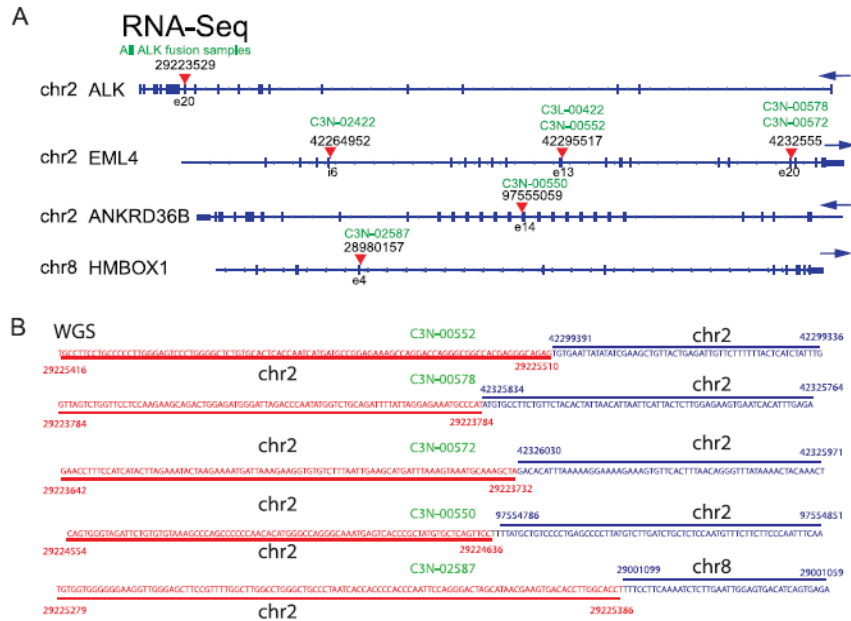
Outlier expression



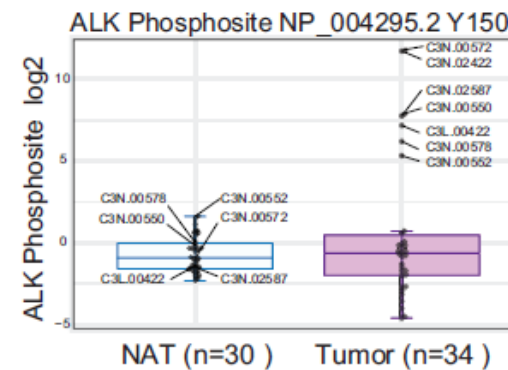
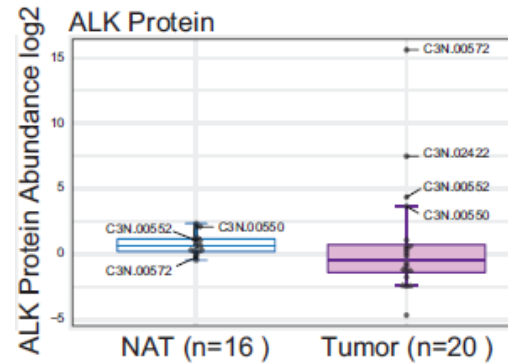
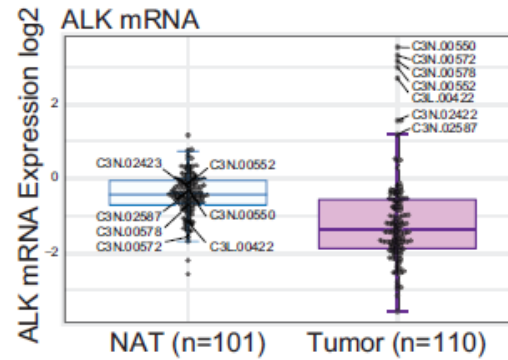
# Novel *ALK* fusion partners are identified with spanning read support from WGS

## Tyrosine phosphopeptides offer insights into biology and potential diagnostic & therapeutic targets

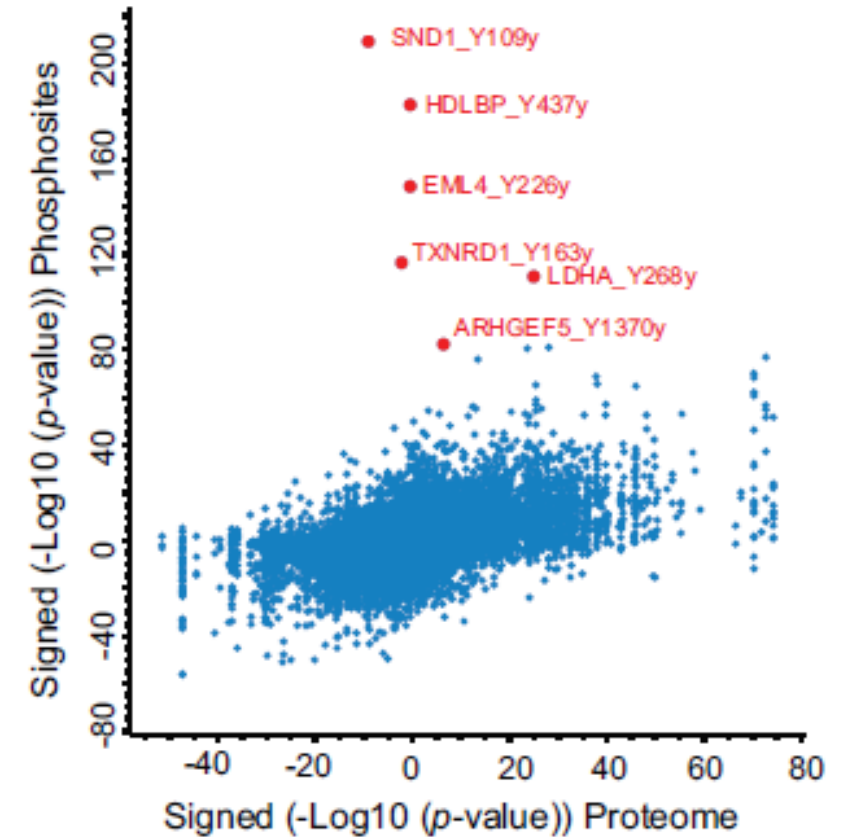
### Fusion architecture



### ALK outlier expression



### ALK fusion driven phosphosites

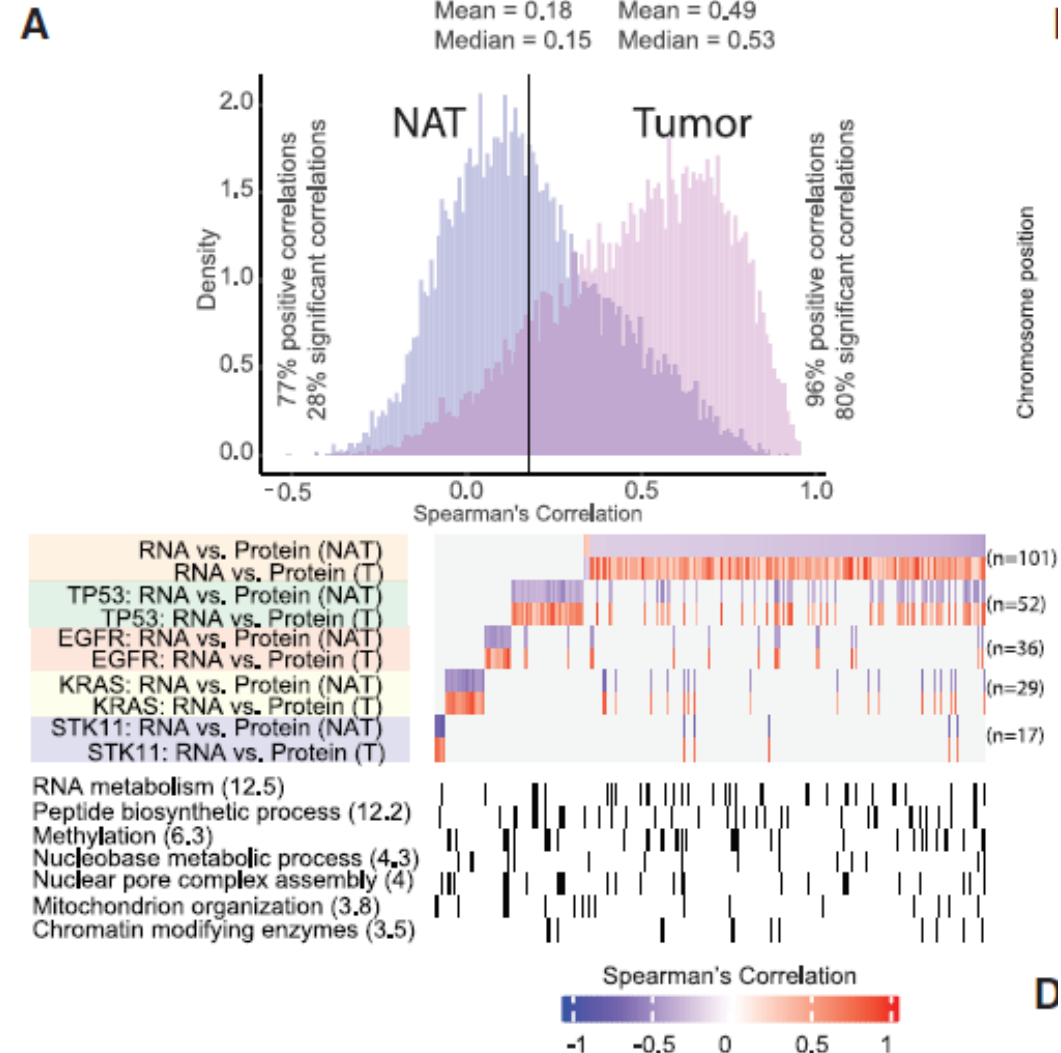
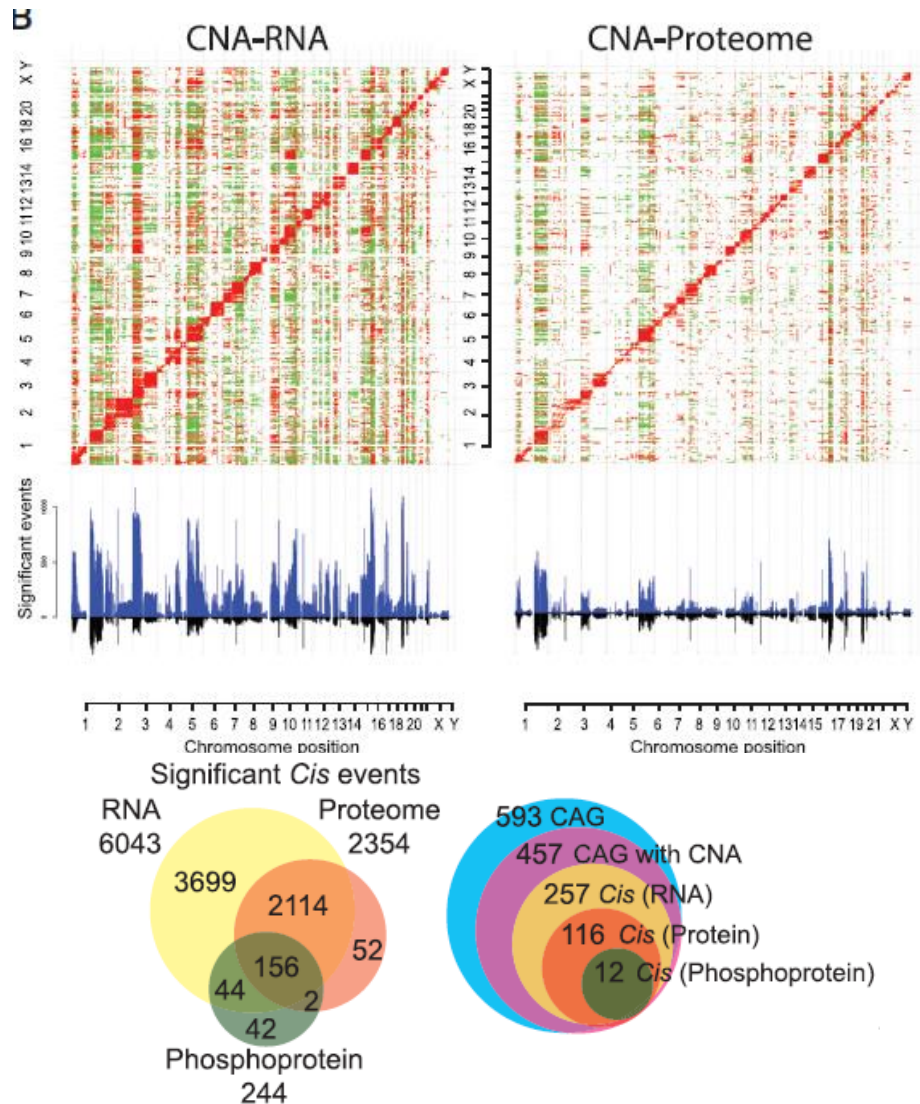




# Proteogenomic integrative analysis prioritizes Copy number aberrations and highlights dichotomy in mRNA-protein correlation in tumors and NATs

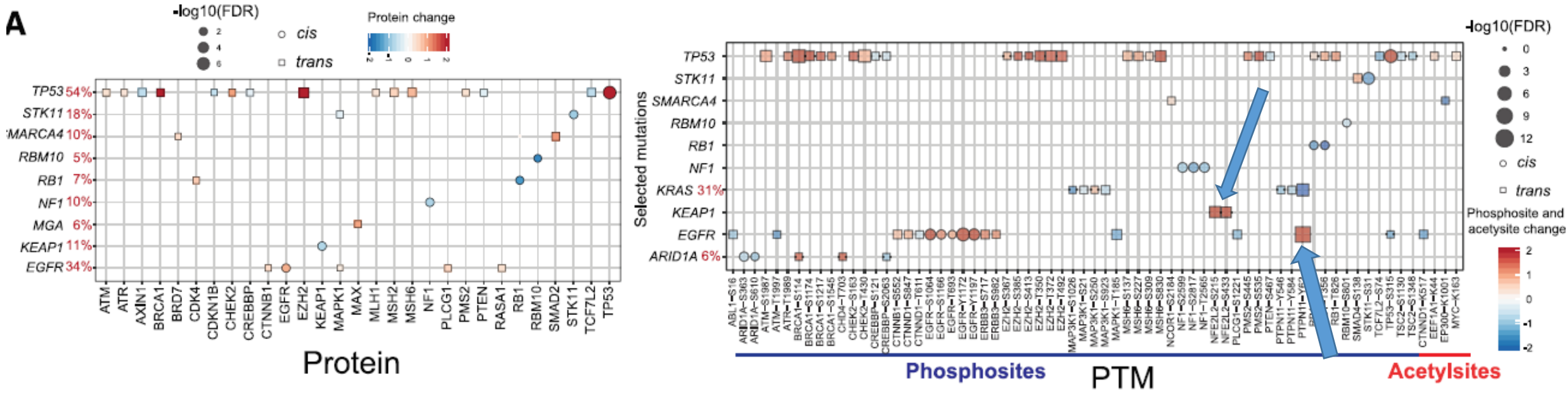
Prioritizing copy number aberrations using proteomics

Differential mRNA-Protein correlation between tumors and NATs

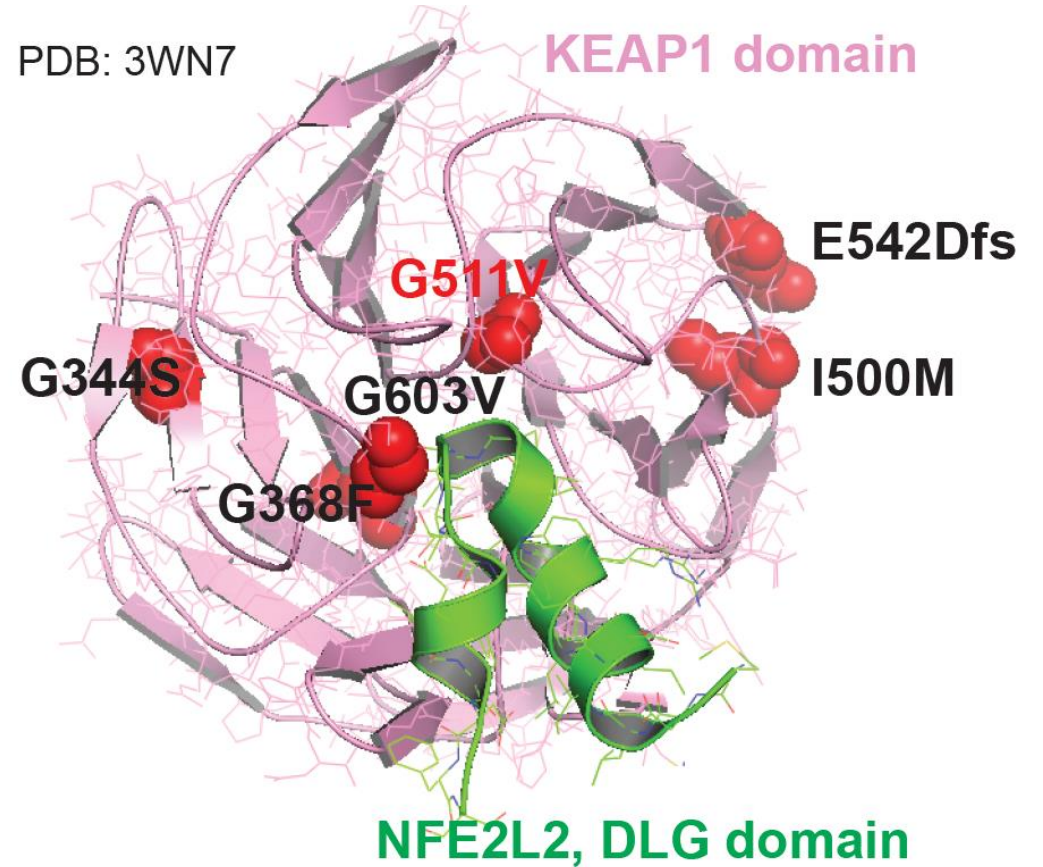
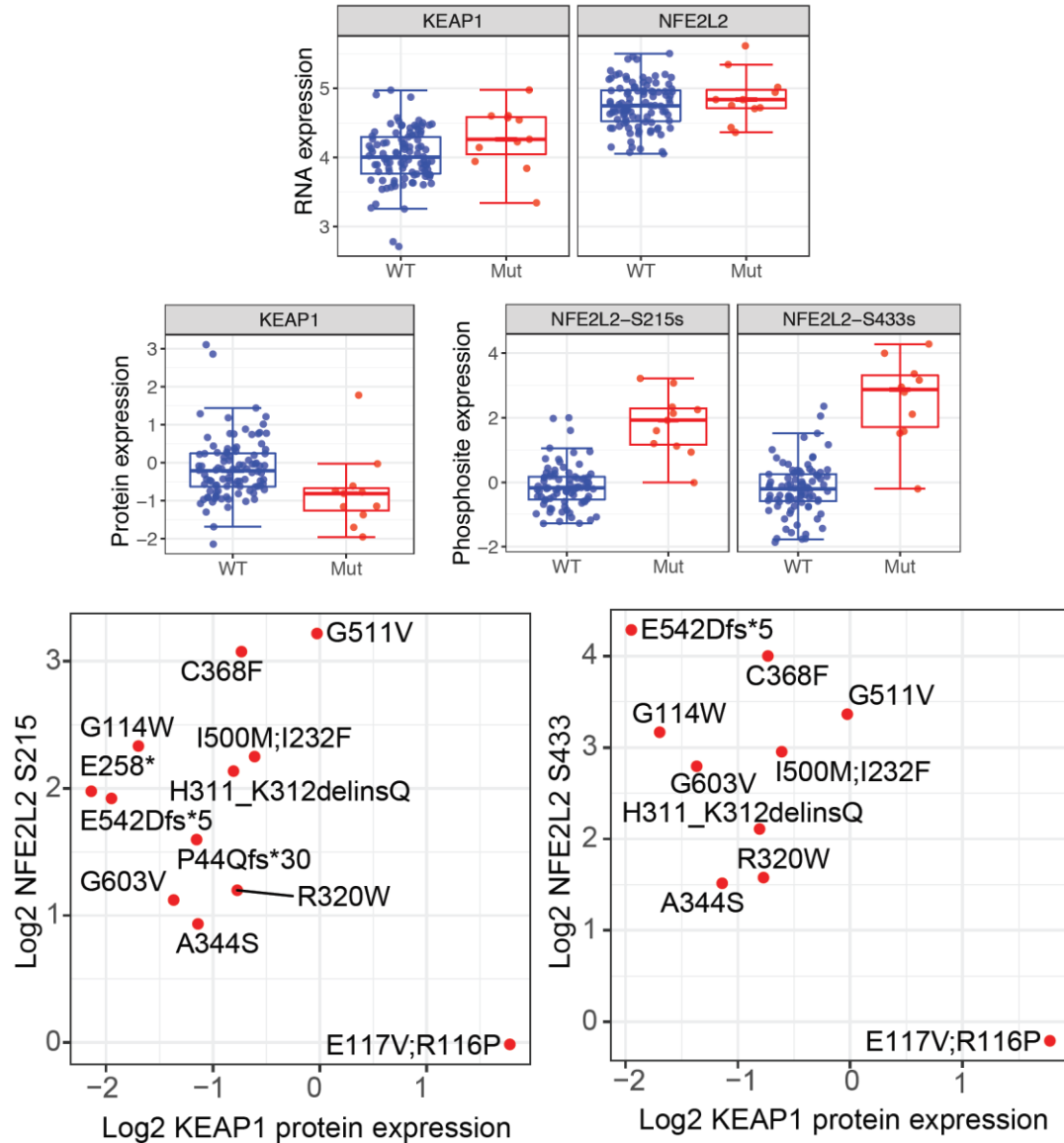


# Impact of Somatic Mutation on the Proteogenomic Landscape

Impact of recurrent mutations on protein expression and PTM abundance

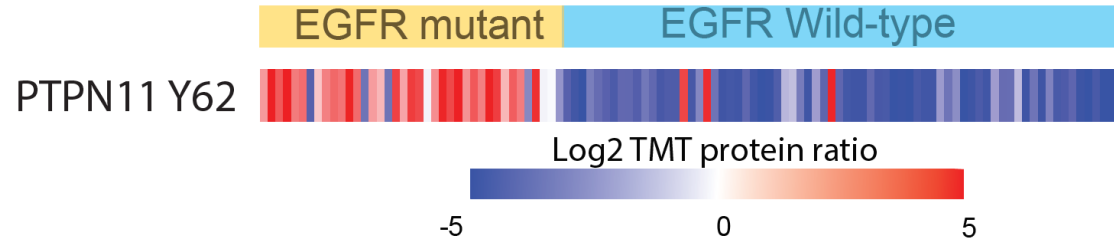
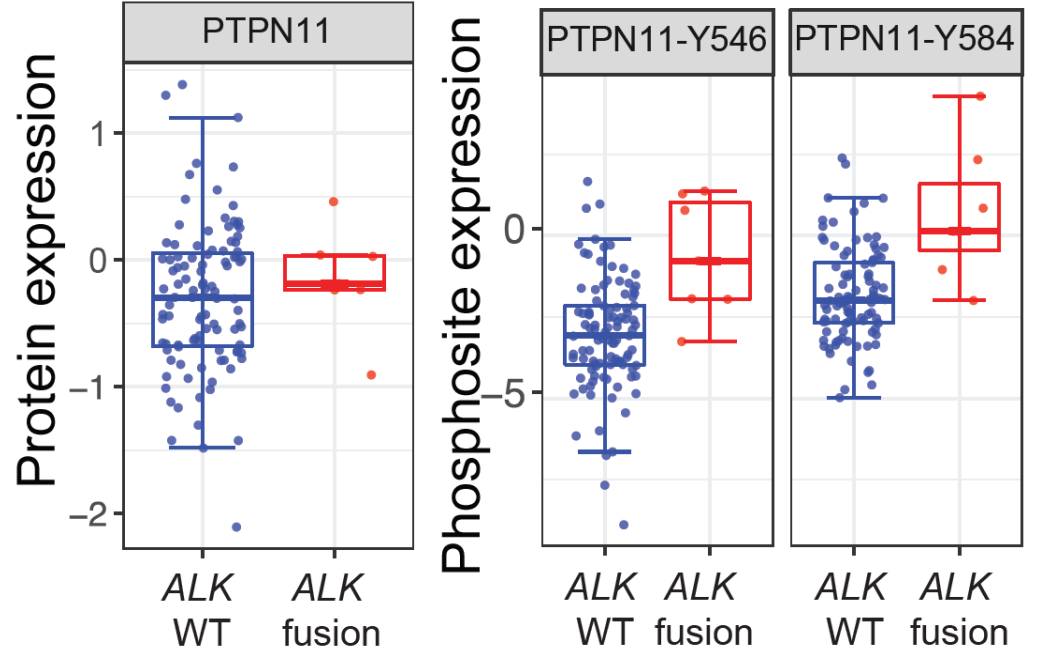
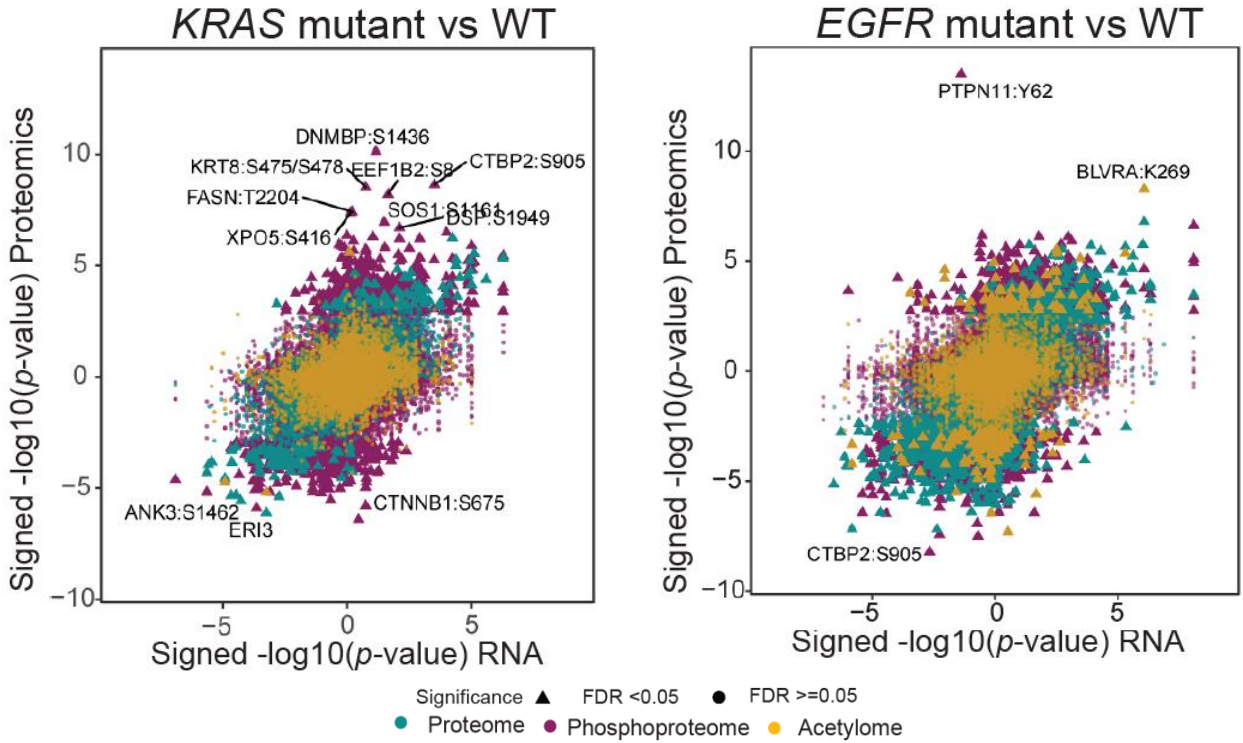


# Deep proteogenomics exposes *KEAP1* / *NFE2L2* (*NRF2*) biology and a putative novel *KEAP1* / *NFE2L2* regulatory mechanism



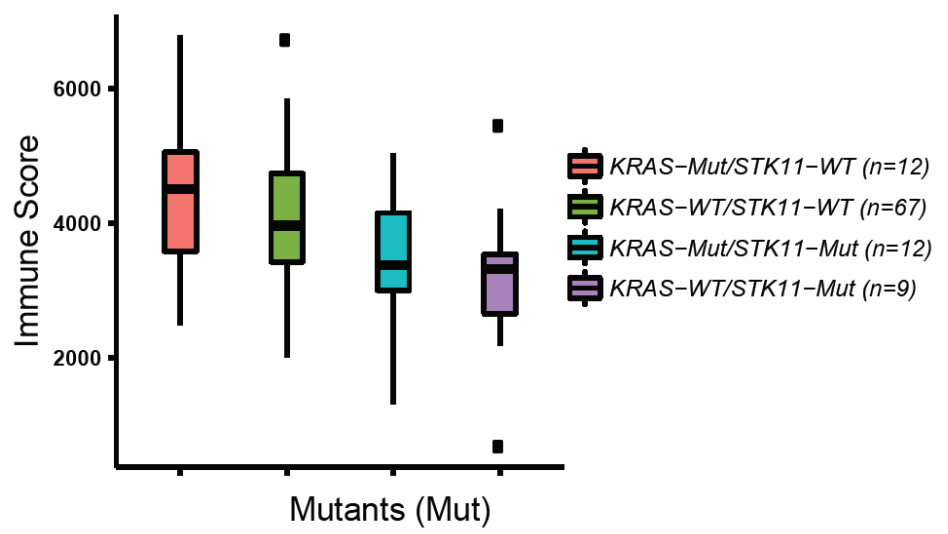
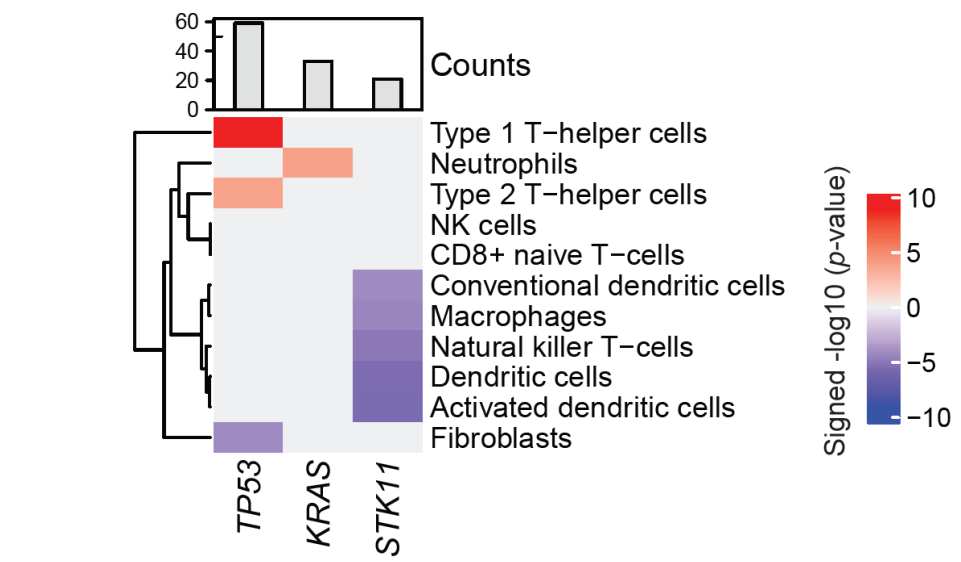
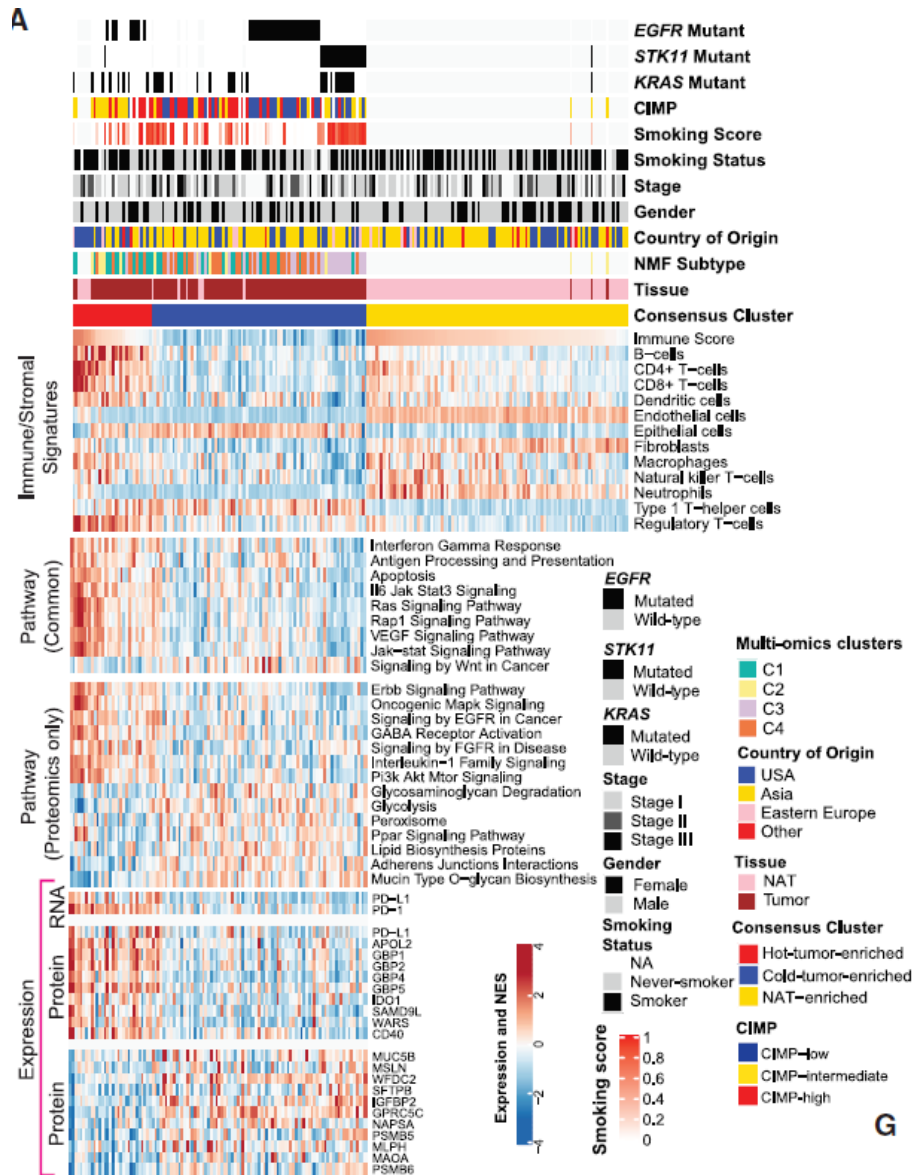


**KRAS mutation association analysis highlights important outliers seen only in the phospho data**  
**EGFR mutant tumors are associated with extreme outliers of PTPN11 (SHP2) phosphopeptide Y62**



# The immune landscape of LUAD shows “cold” and “hot” tumor and intermediate NAT clusters

## *STK11* mutant, *KRAS* WT tumors are especially “cold”



**G**

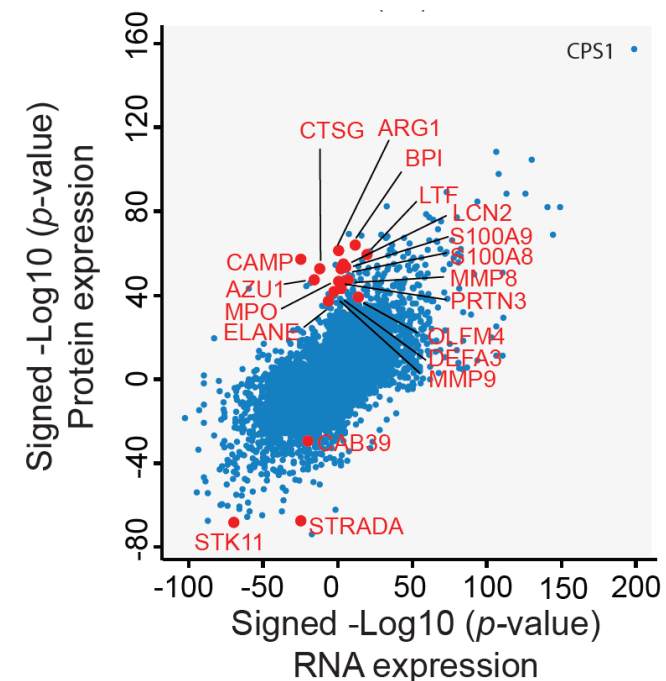
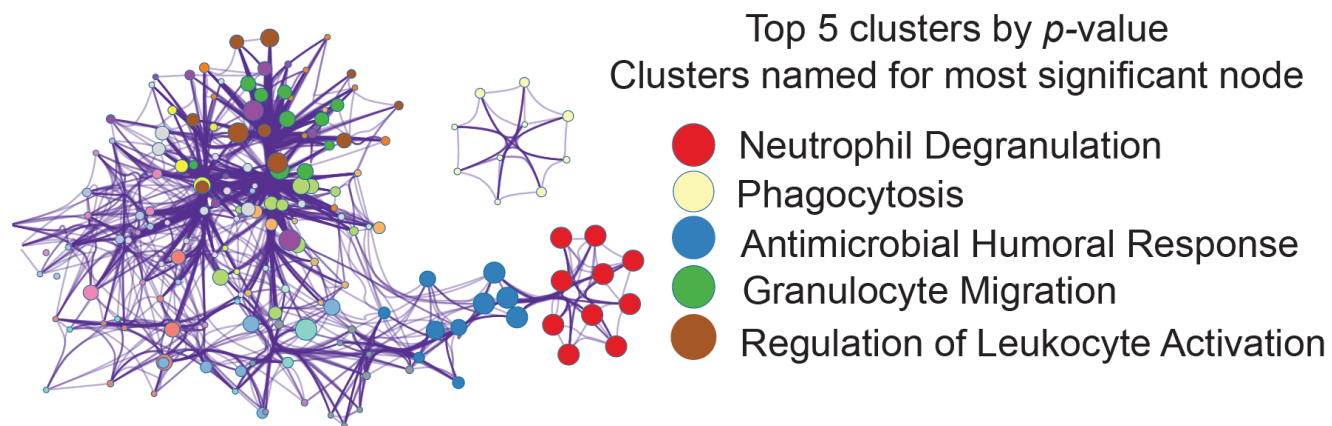


# Neutrophil degranulation is a dominant *STK11* signature seen only in the proteome

*Most of these proteins have well-established immunomodulatory functions*

Proteins that drive unsupervised segregation of *STK11* mutant samples are enriched for neutrophil degranulation

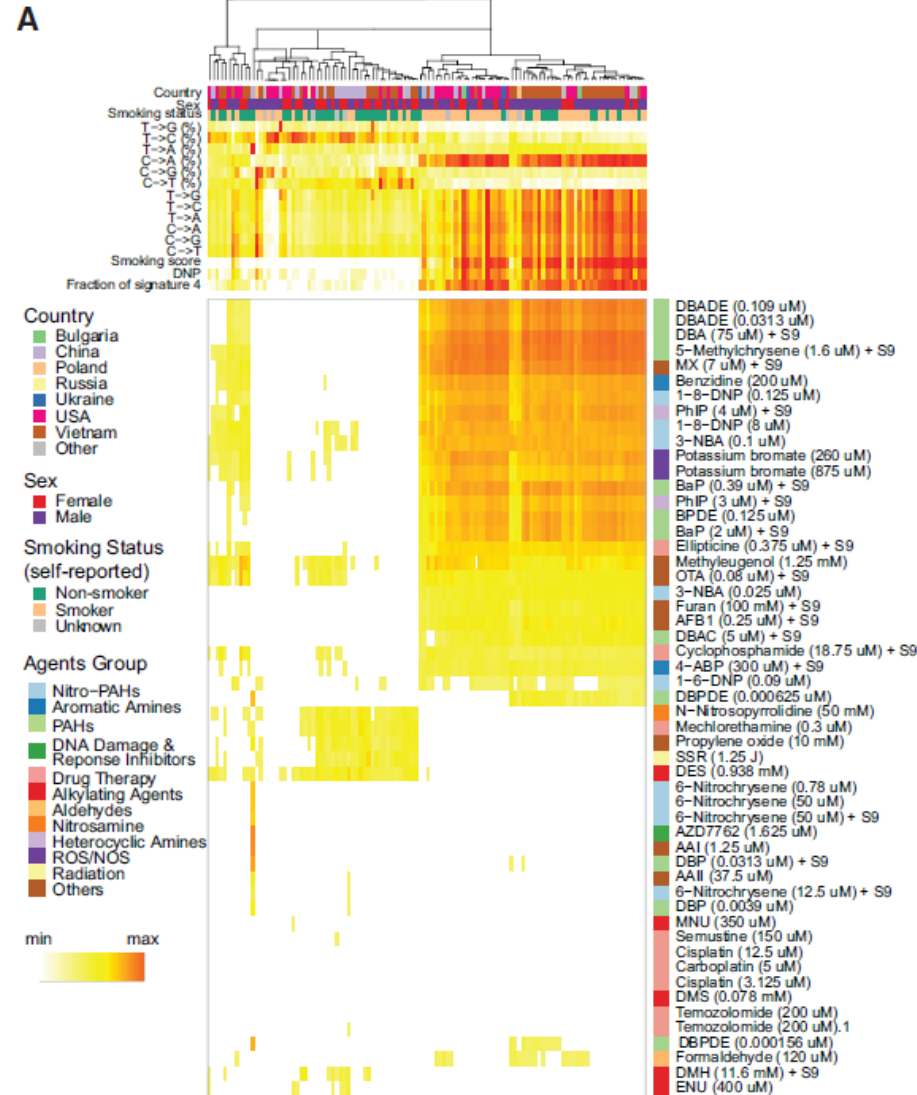
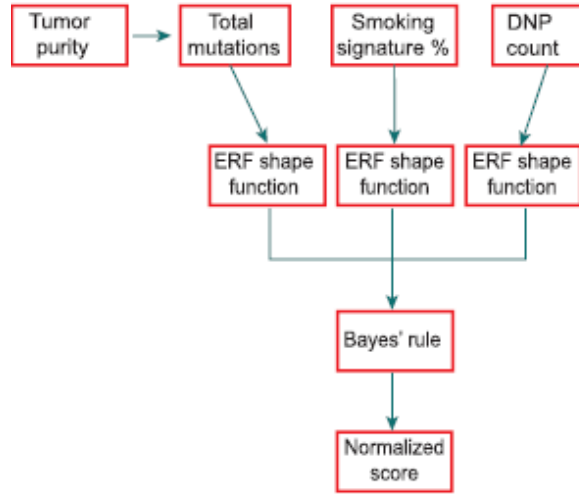
Differential regulation of neutrophil degranulation signature is exclusively captured in proteome



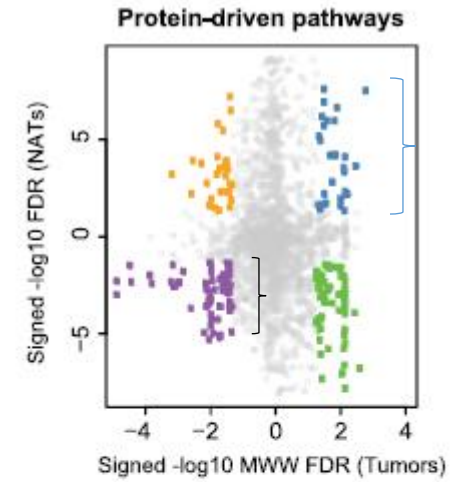
# Evidence of environment exposure and oncogenic signaling in non-smokers

## Differential chemical exposure signatures in smokers and non-smokers

### Computing smoking score

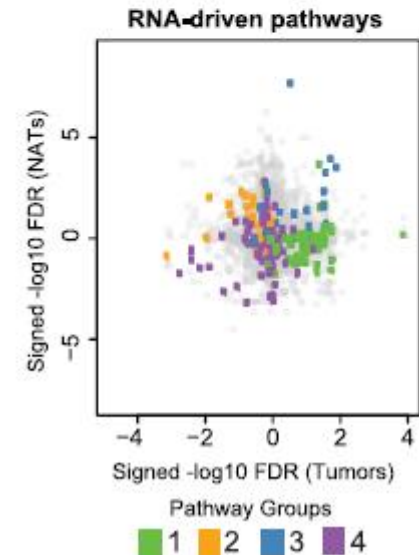


## Differential pathways between samples with High smoking score vs. low smoking score



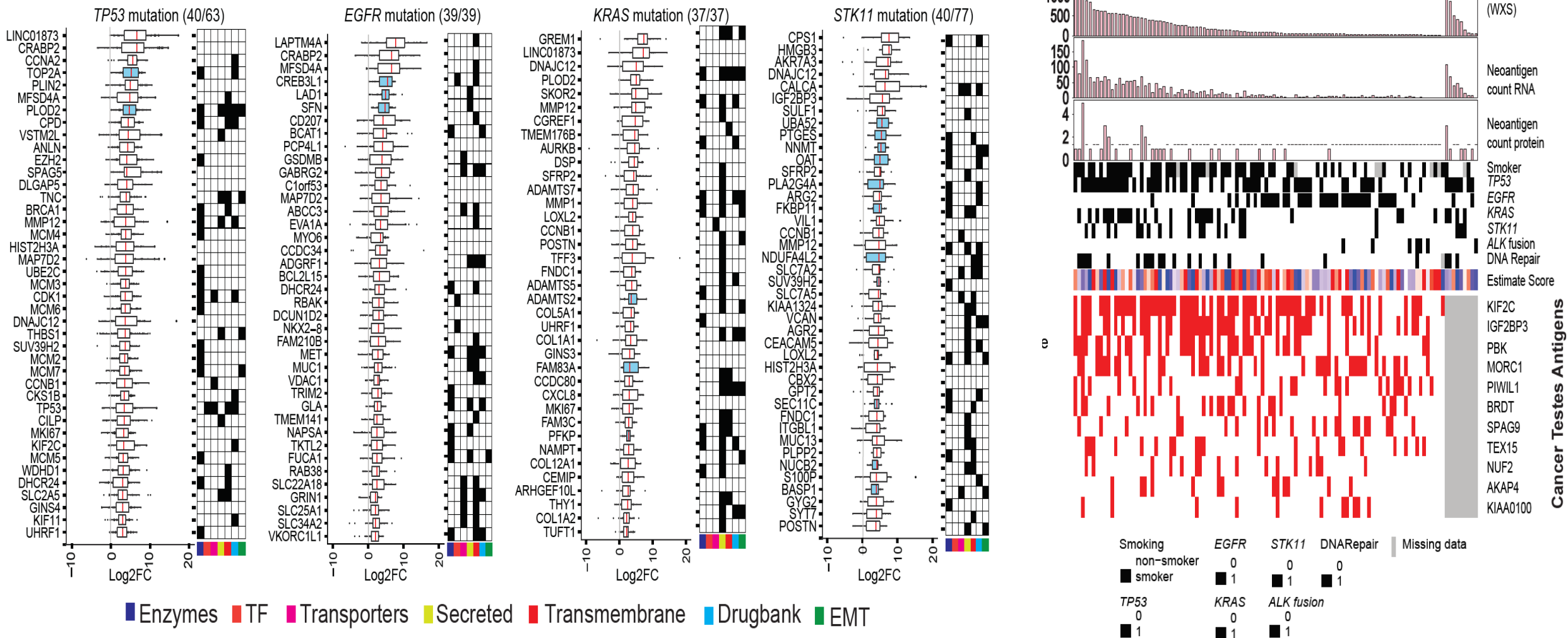
up/up  
 Ferroptosis  
 MYC response  
 UV response

Down/down  
 HIPPO signaling  
 NF-KB signaling  
 IL signaling



# Data provide a resource for global and subtype-specific LUAD biomarker development

## Widely expressed Cancer-testis (CT) antigens are prime candidates as both biomarkers and immunogenic targets



# Partial summary of findings

- The mutational landscape of this diverse sample set is largely familiar.
- Phosphoproteomics provides new, actionable insights into *KRAS*, *EGFR*, *KEAP1-NFF2* and other biology
- The immune landscape of LUAD is highly variable. *STK11* mutant tumors are especially cold. We have mechanistic hypotheses including the contribution of neutrophil degranulation to *STK11* mutant pauci-immune status.
- Cancerization of Normal adjacent tissue in smokers.
- Tumor-normal analyses provide candidate diagnostic markers, immunogenic and oncogenic targets, and potential insights into lung tumorigenesis

# Acknowledgements



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Mount  
Sinai

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  - Ramaswamy Govindan



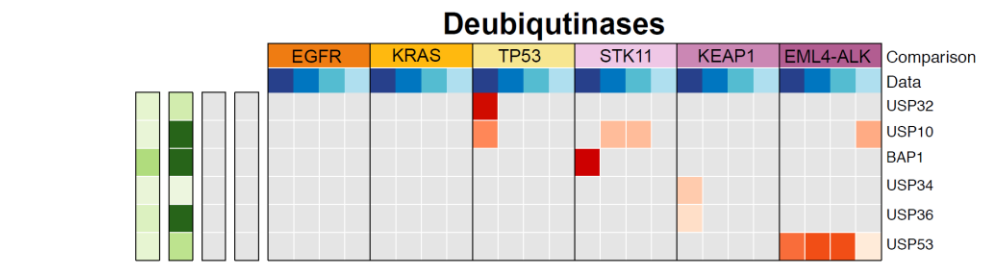
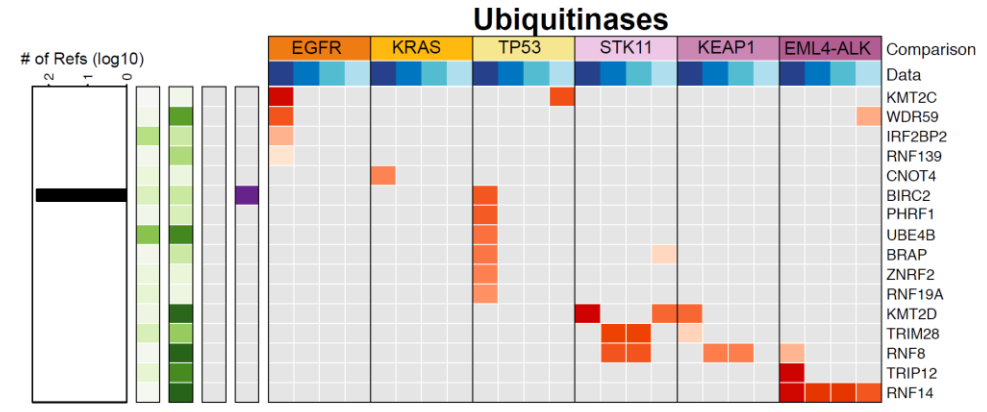
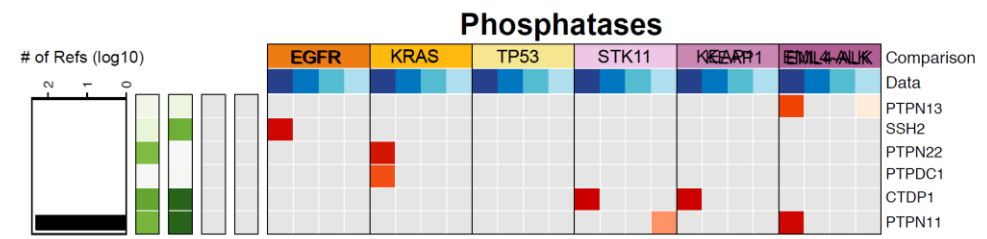
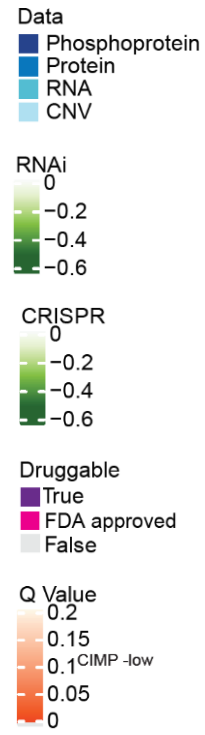
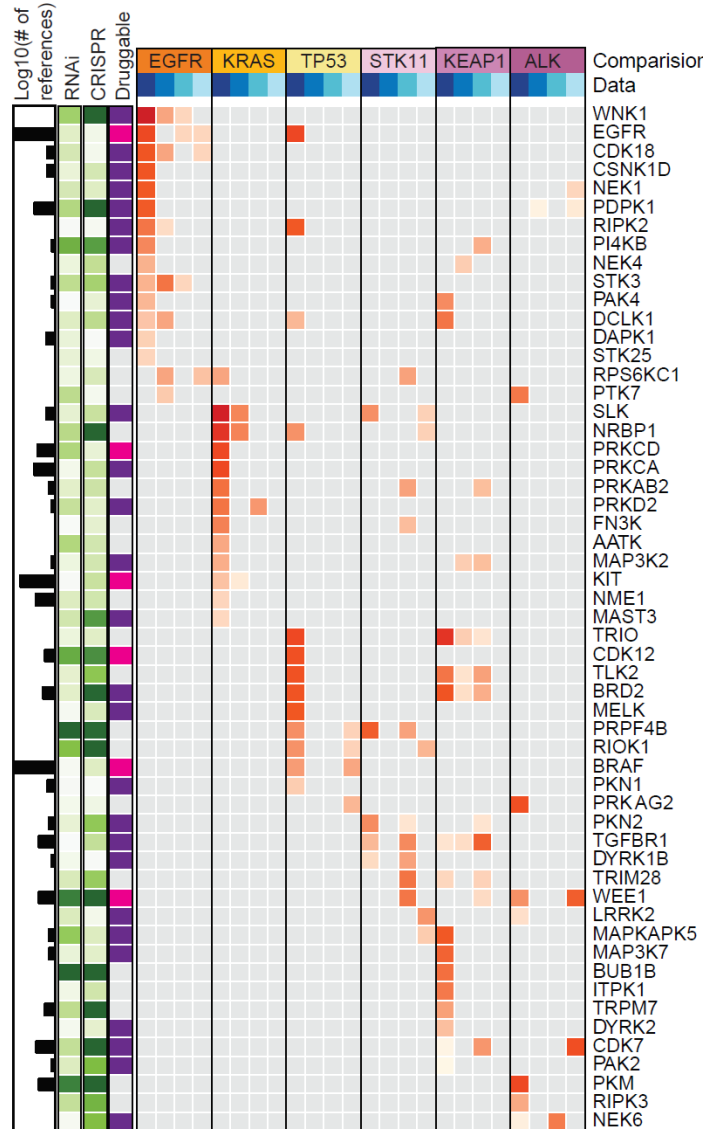
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  - Henry Rodriguez



# Kinase, phosphatase, ubiquitinase and deubiquitinase outlier analyses highlight the importance of post-translational modification data and nominate candidate therapeutic targets



Shaleigh Smith  
 Lili Blumenberg

