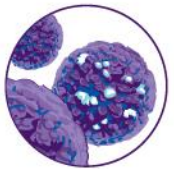
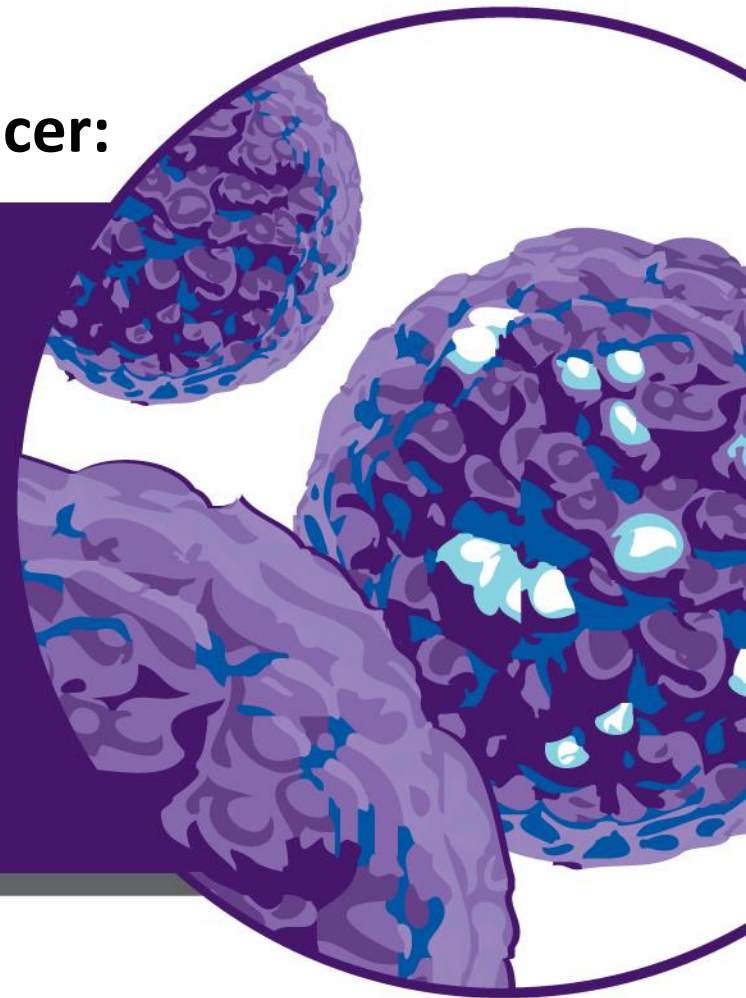


# A Molecular Portrait of Asian Breast Cancer:

## Multi-Omics and Immune Profiling of a Prospective Breast Cancer Cohort Enriched in Young, Premenopausal Patients

Zhengyan 'George' Kan

Pfizer Oncology Research, San Diego, CA



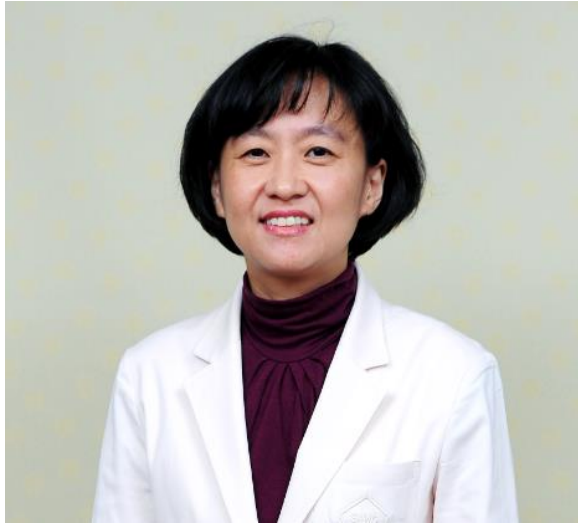
**Oncology**

A **Pfizer** Research Unit

# Disclosure

- I am an employee of Pfizer Inc.
- I own Pfizer stocks.

# Collaboration between SMC and Pfizer



## Dr. Yeon Hee Park

Associate Professor  
Division of Hematology-Oncology,  
Department of Medicine,  
Samsung Medical Center,  
Sungkyunkwan University School of Medicine,  
Seoul, Korea

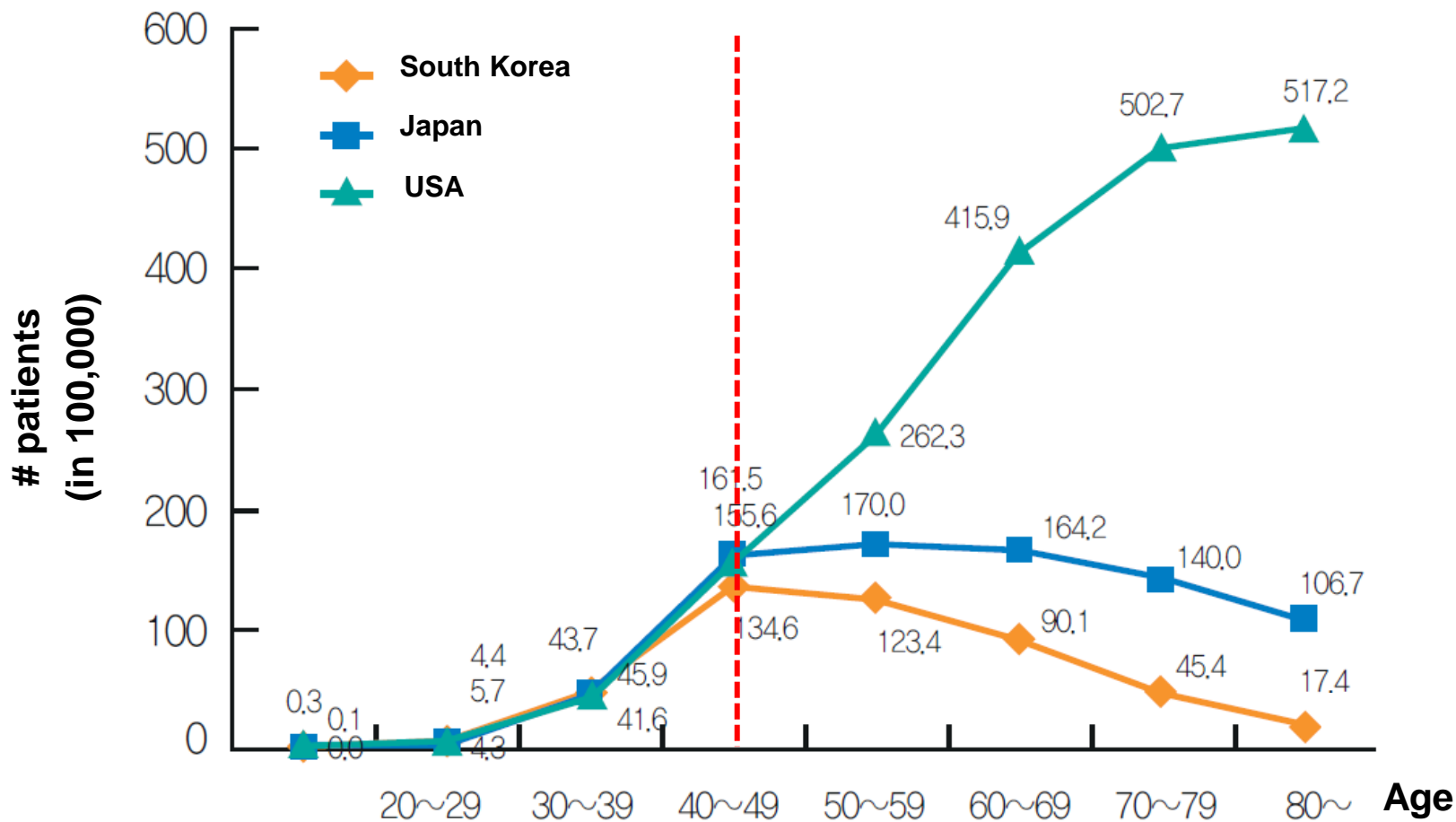


**SAMSUNG  
MEDICAL CENTER**

# Outline

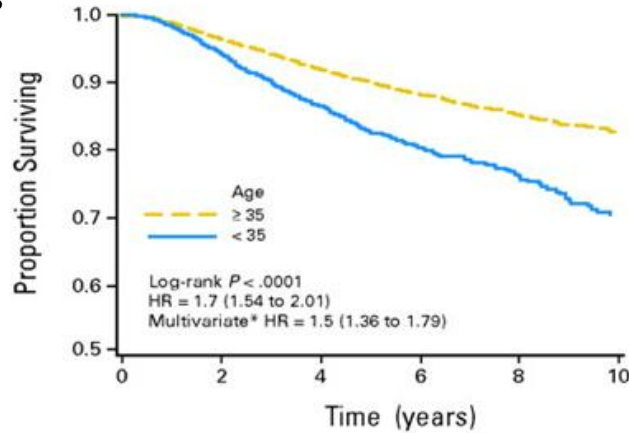
- Background on Asian young, pre-menopausal breast cancer (YBC)
- Genomic landscape of Asian YBC and OBC
- Comparing molecular characteristics between YBC and OBC
- Immune-oncology (IO) profiling using expression signature and histopathological analyses

# The Proportion of YBC is Significantly Higher in East Asia than in the West

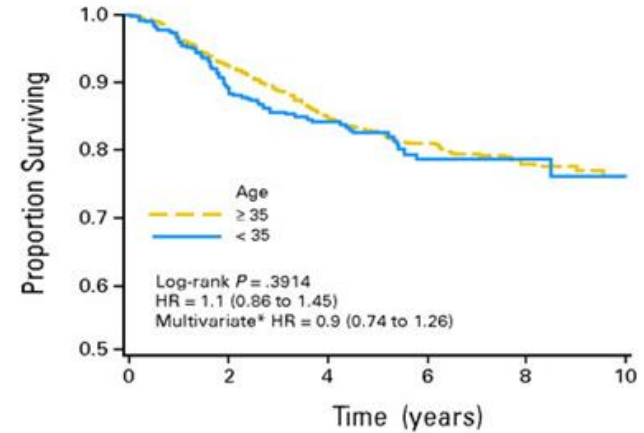


# Poor Outcome of HR+ Breast Cancer at Very Young Age is due to Tamoxifen Resistance

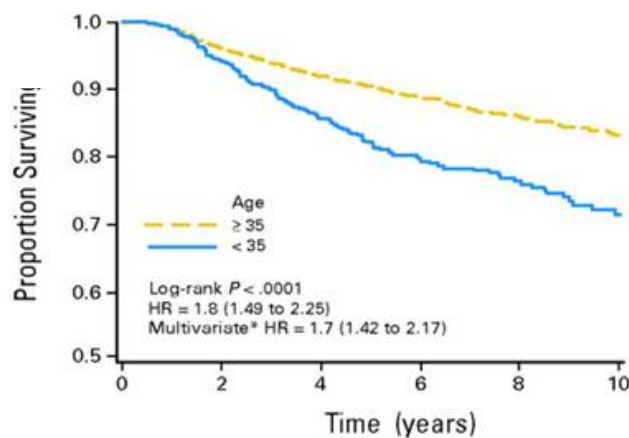
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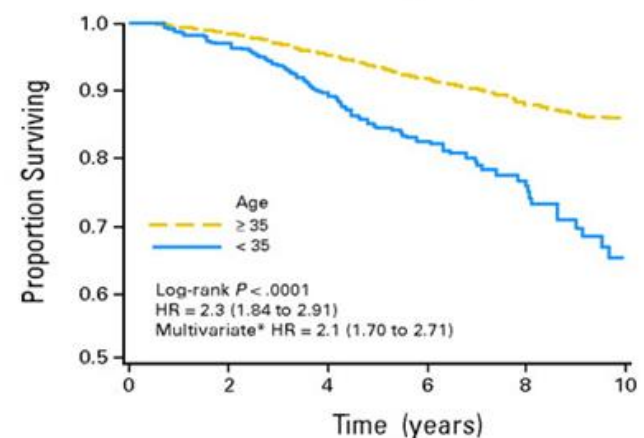
HR(-)



HR unknown



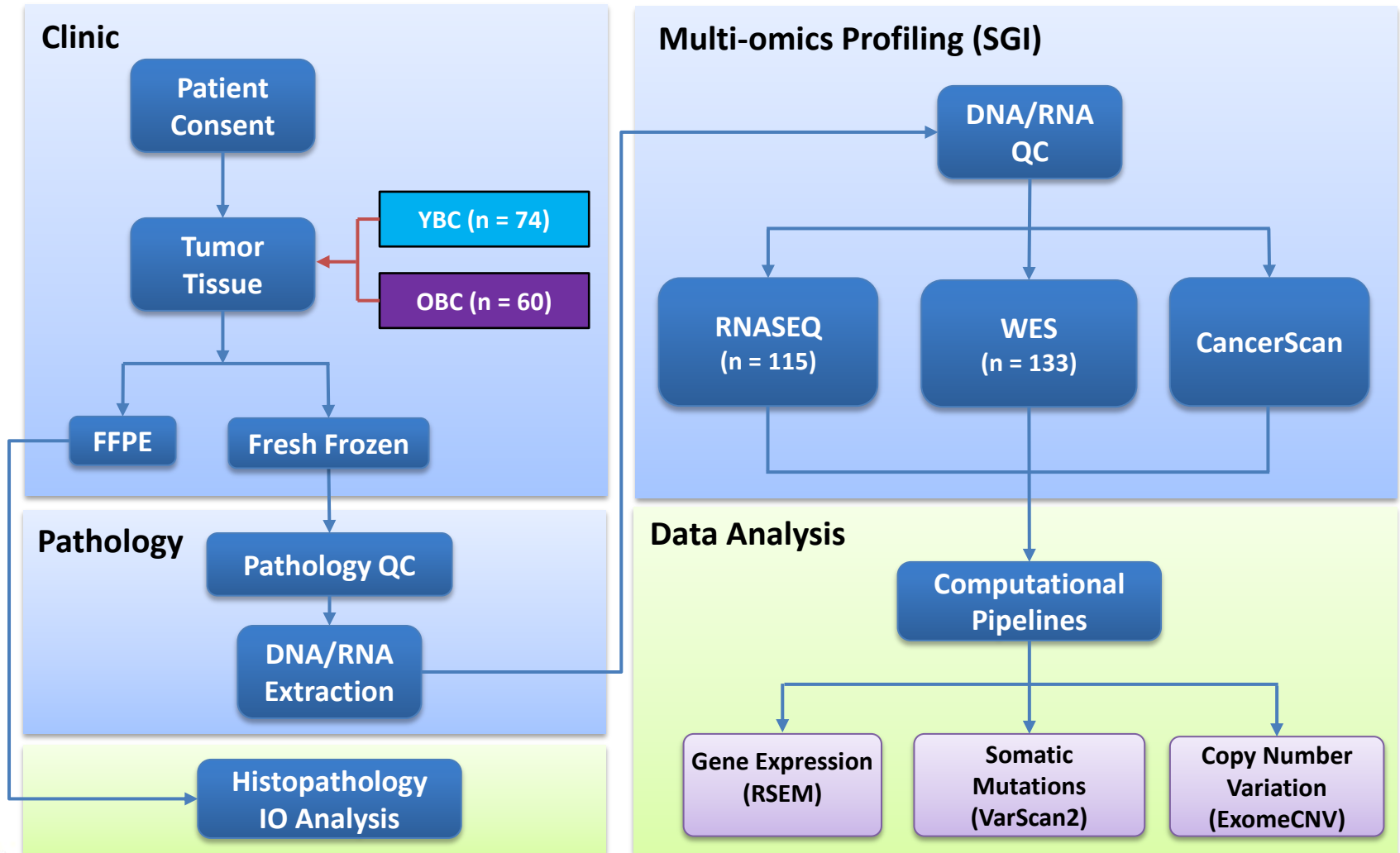
HR(+)



# Introduction

- The proportion of YBC (age  $\leq$  40) among BC in East Asia is estimated to be 16-32%, significantly higher than the 7% reported in Western countries.
- Breast cancers (BC) in younger, premenopausal patients (YBC) tend to be more aggressive with worse prognosis, higher chance of relapse and poorer response to endocrine therapies compared to breast cancers in older patients (OBC).
- Genomic and molecular characterizations have deepened our understanding of breast cancer biology, however, the molecular bases of Asian YBC remains poorly characterized.

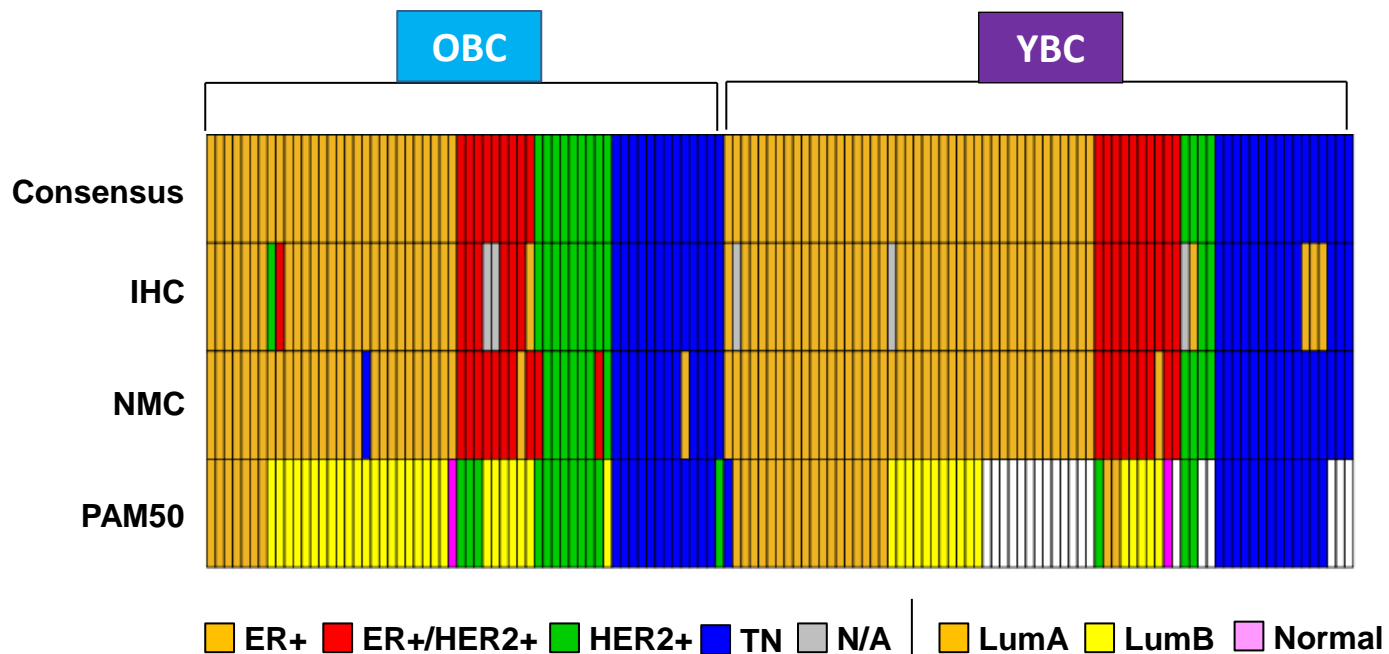
# Study Work Flow



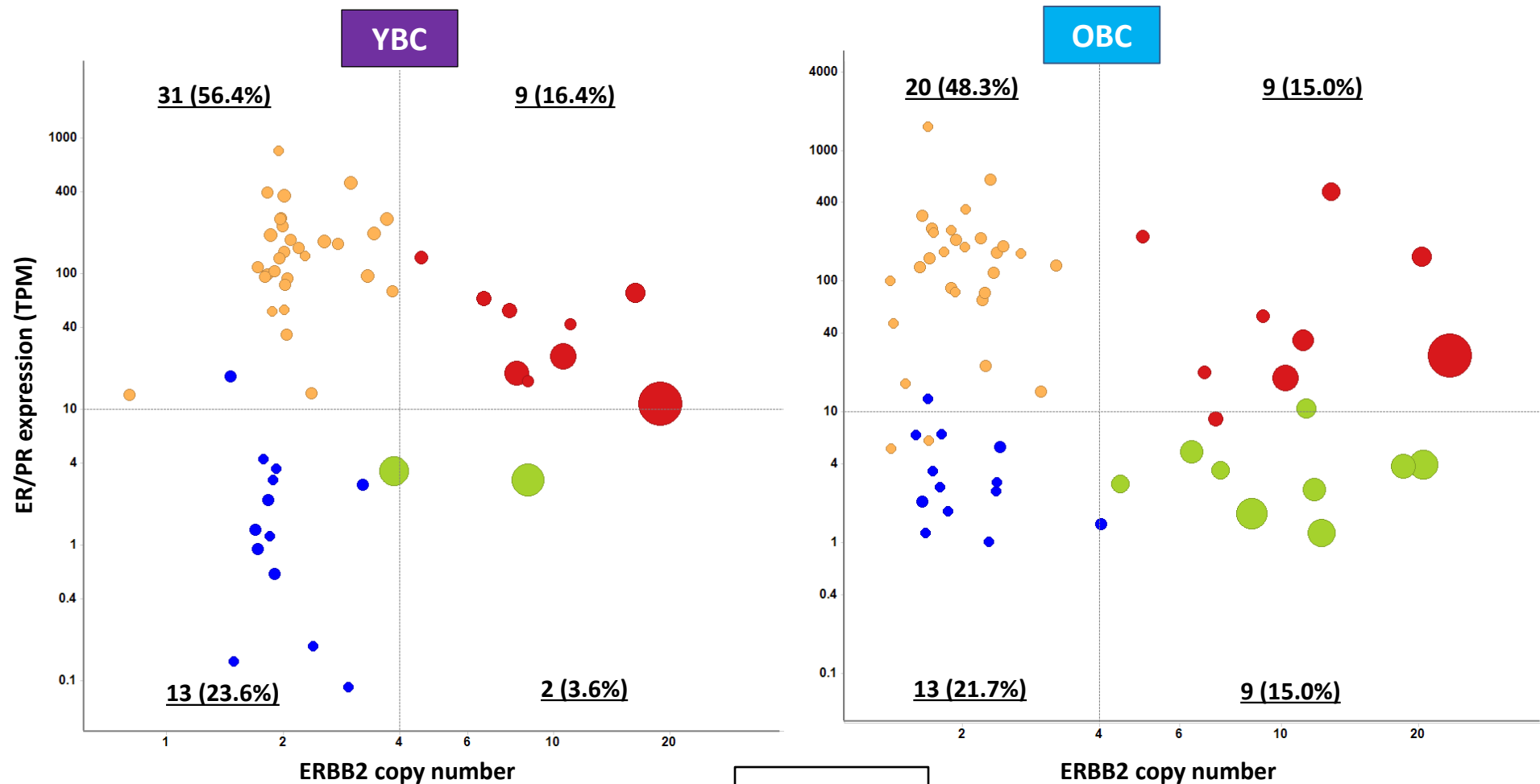


# Molecular Subtype Classification

- We identified molecular subtypes using three methods: ER and HER2 immunohistochemistry analyses (IHC); gene expression classifier called PAM50; naïve Bayesian classifier (NMC) based on *ESR1*, *PGR* gene expression and *ERBB2* copy number data.
- A consensus classification was derived based on all three classifications, which are 92% concordant.



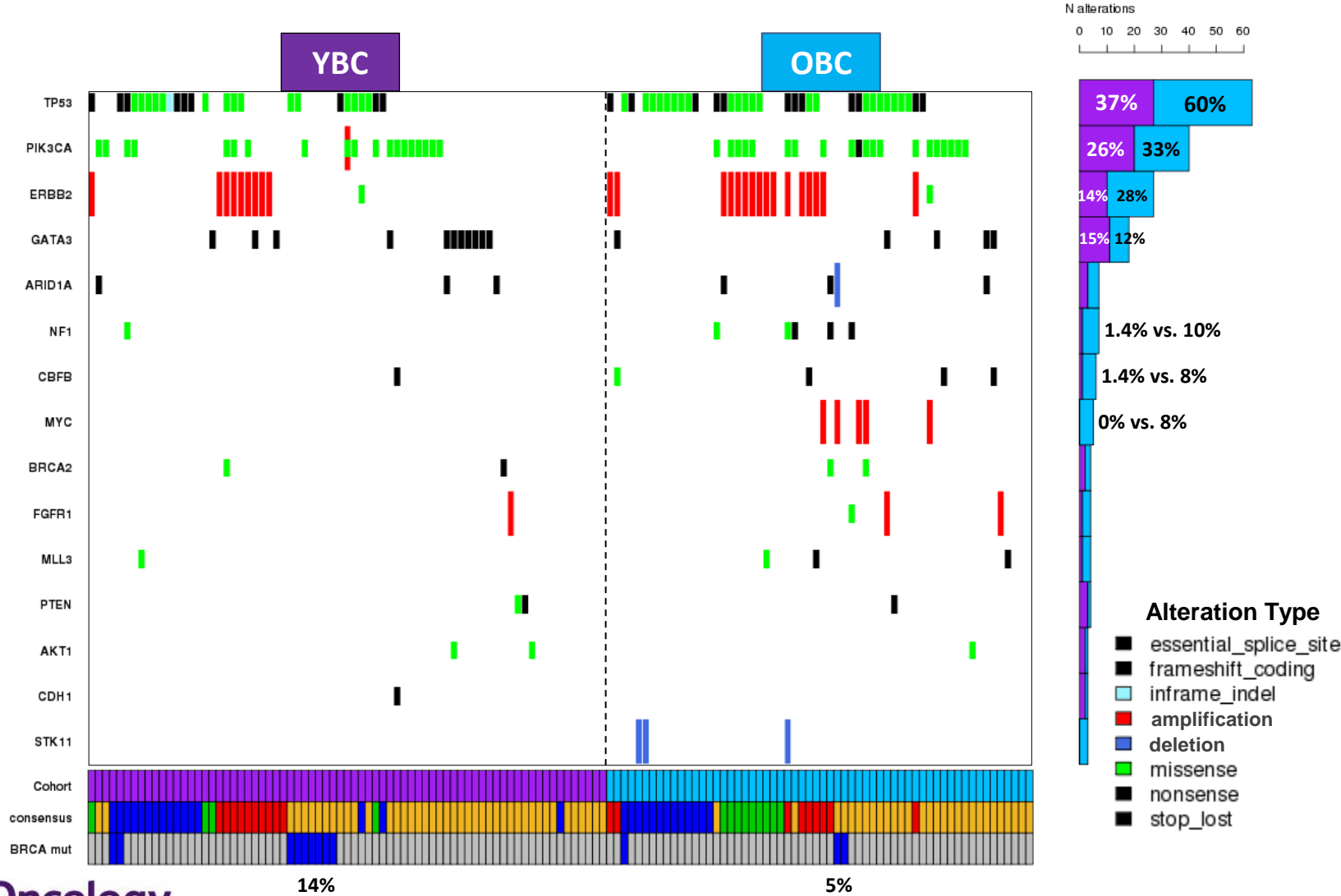
# Molecular Subtype Comparison



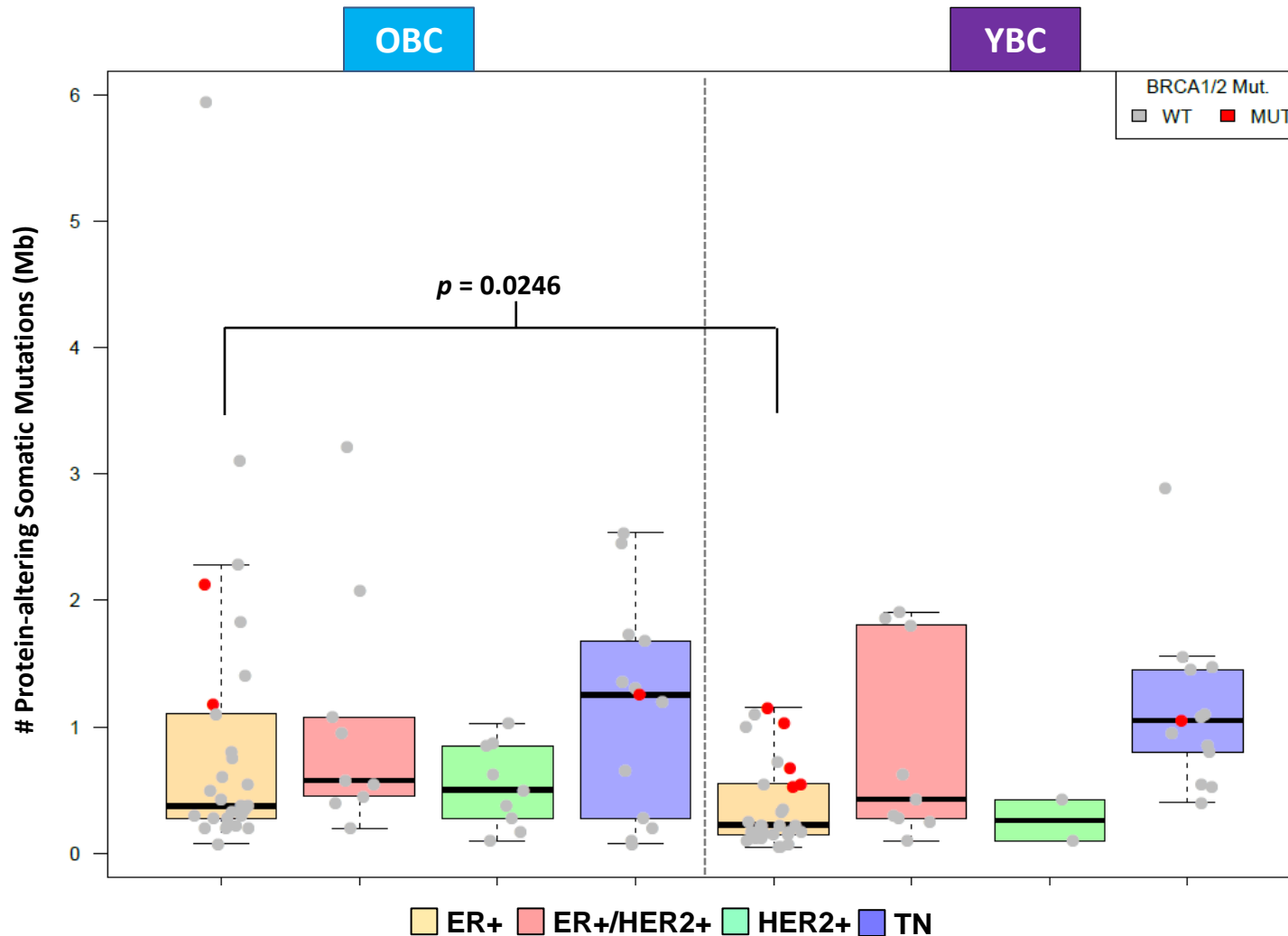
# Significantly Mutated Genes

Gene	# Mut. samples	Mut. Freq. (n = 133)	Mut. Rate (Mb)	p-value	q-value	Mut. Freq. (TCGA)	Rank (TCGA)	Gene Description
<i>TP53</i>	63	47.37%	153.34549	0	0	36.9%	1	tumor protein p53
<i>GATA3</i>	18	13.53%	55.74866	8.88E-16	8.38E-12	10.7%	3	GATA binding protein 3
<i>PIK3CA</i>	39	29.32%	40.9562	3.77E-15	2.37E-11	35.5%	2	phosphatidylinositol-4,5-bisphosphate 3-kinase, catalytic subunit alpha
<i>CBFB</i>	6	4.51%	30.50222	4.19E-08	0.000198	1.6%	13	core-binding factor, beta subunit
<i>PTEN</i>	4	3.01%	9.93236	1.39E-06	0.00525	3.4%	9	phosphatase and tensin homolog
<i>NF1</i>	7	5.26%	2.88505	6.55E-05	0.195	2.8%	25	neurofibromin 1
<i>ARID1A</i>	6	4.51%	3.28988	7.23E-05	0.195	2.4%	N/A	AT rich interactive domain 1A (SWI-like)

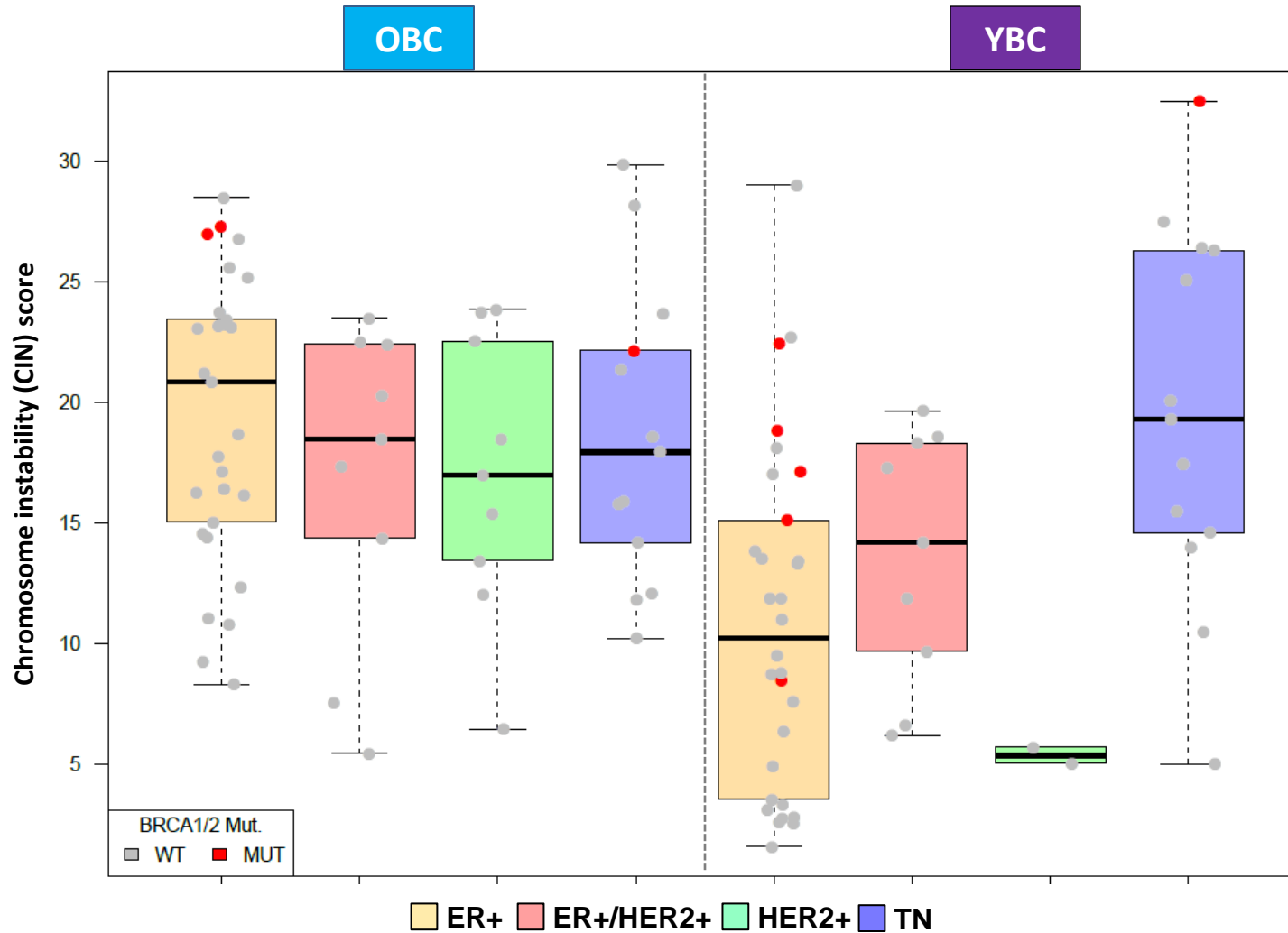
# Landscape of Genomic Alterations



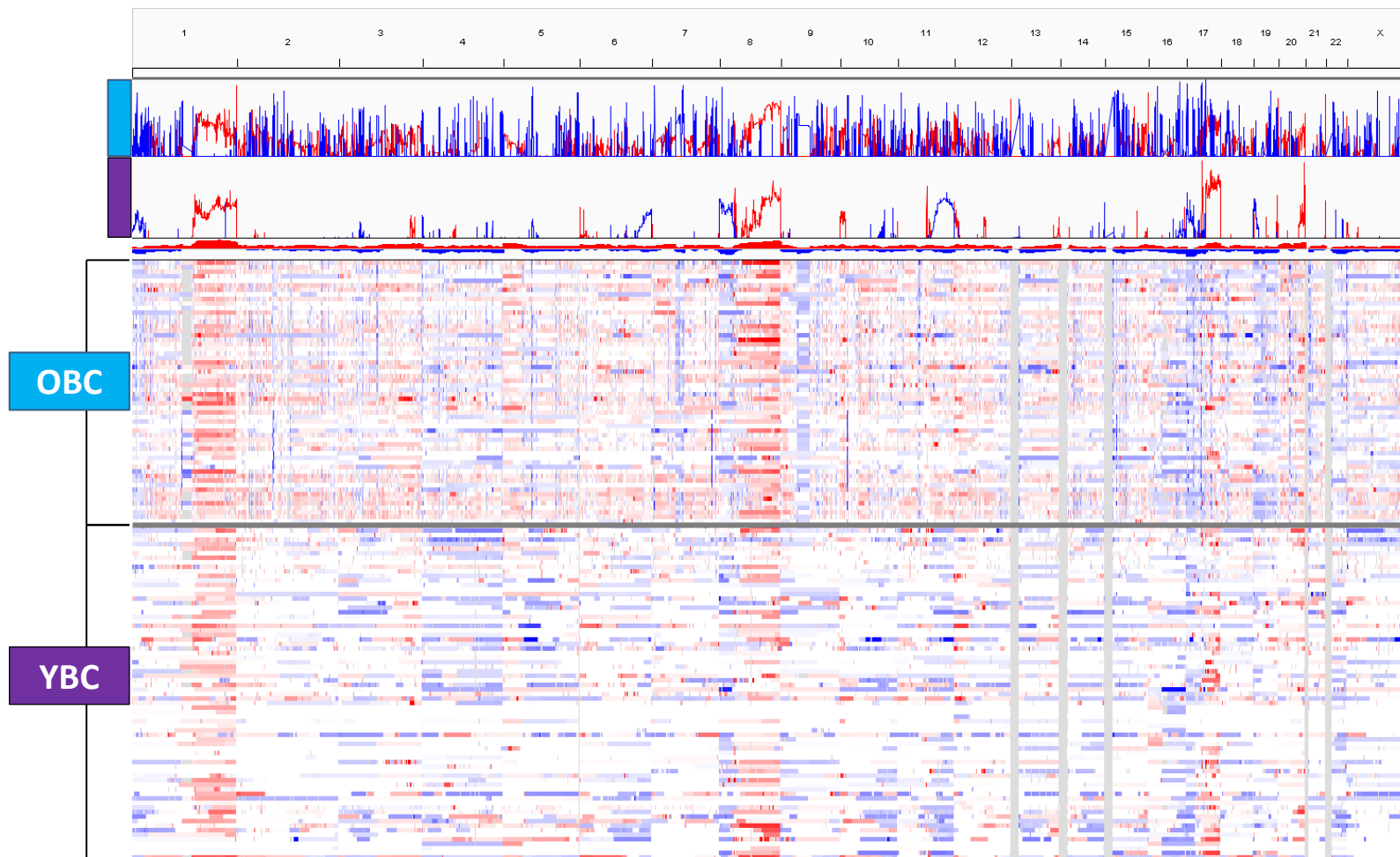
# Mutations More Prevalent in OBC than in YBC



# CNVs More Prevalent in OBC than in YBC



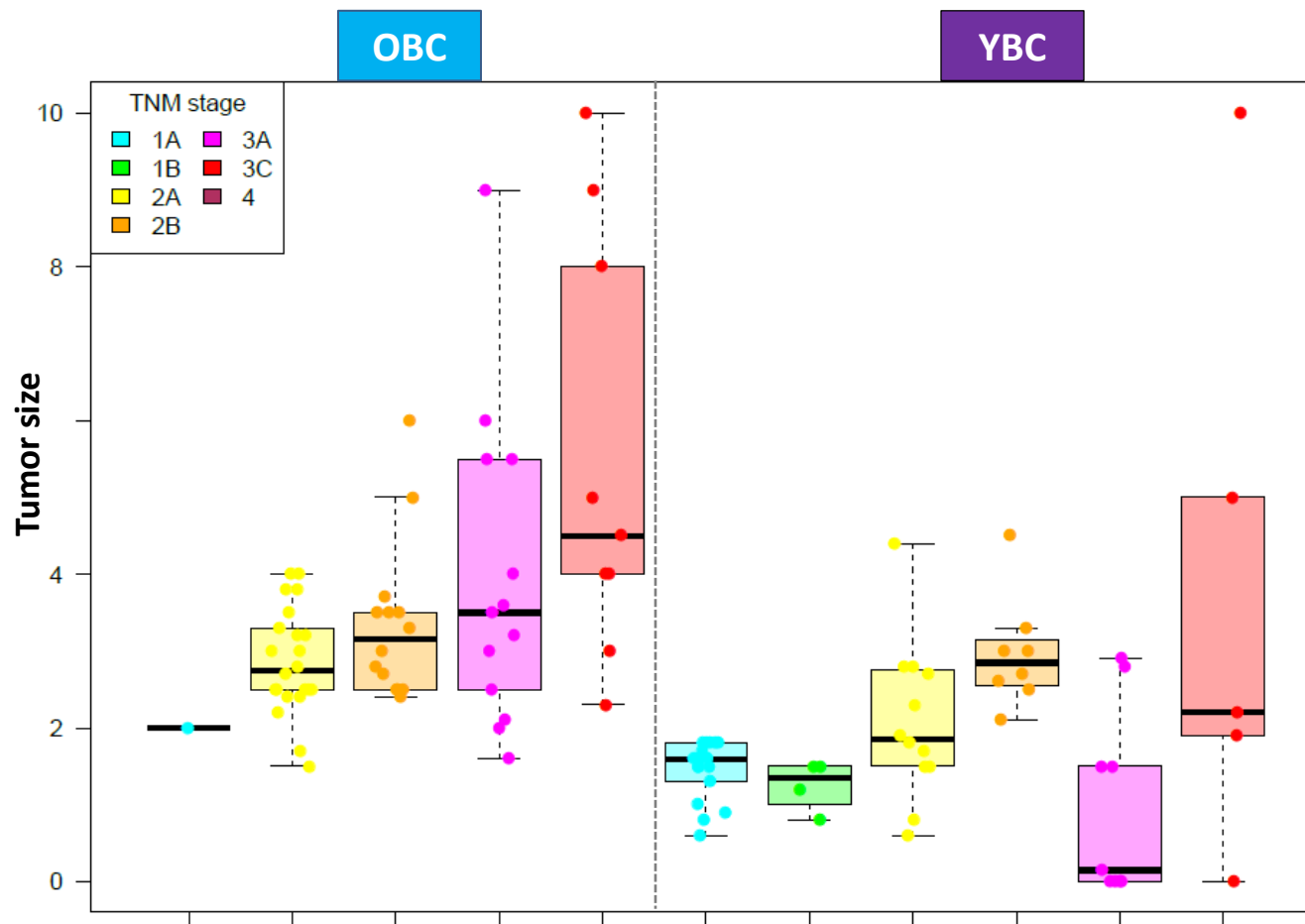
# CNV More Prevalent in OBC than in YBC



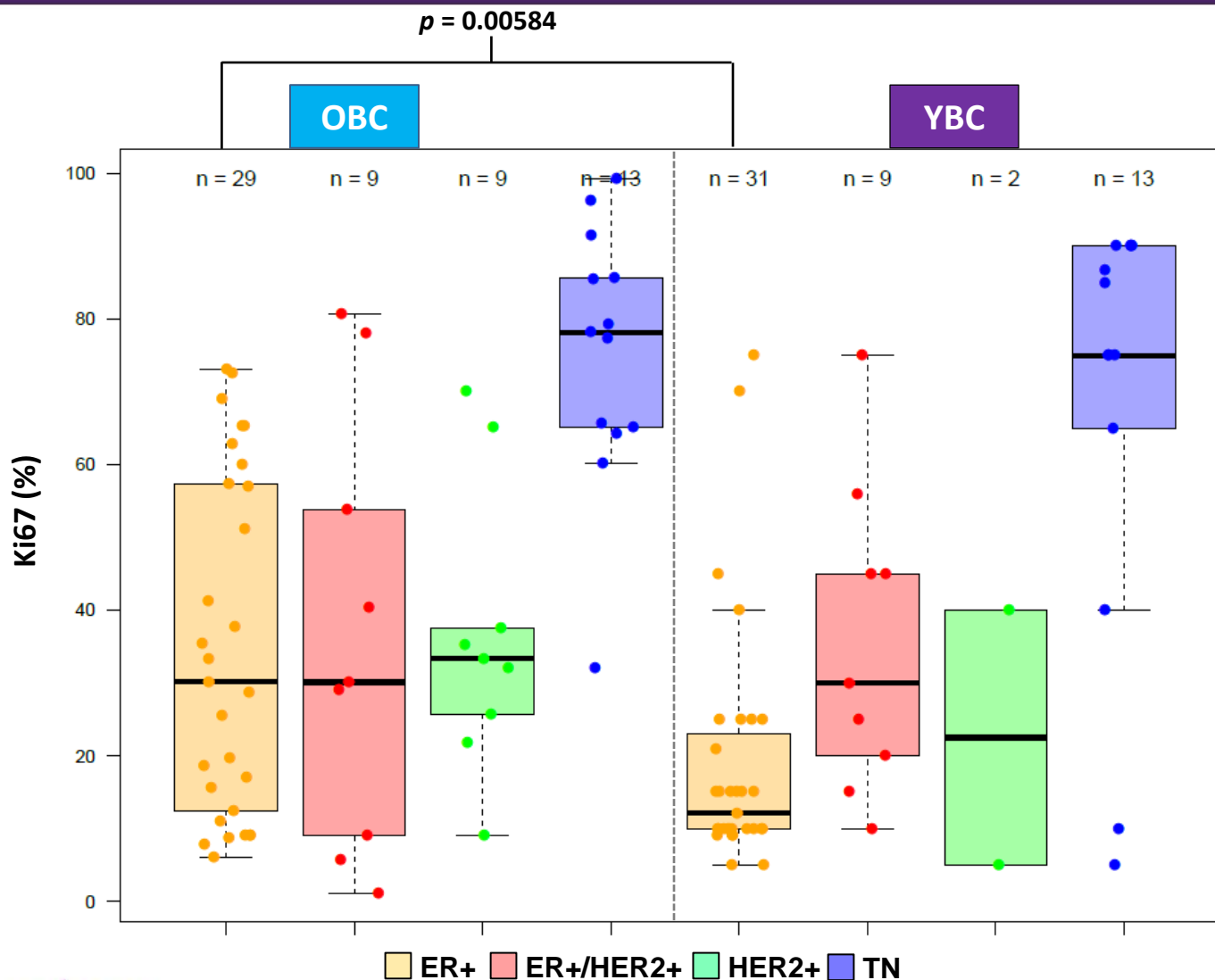




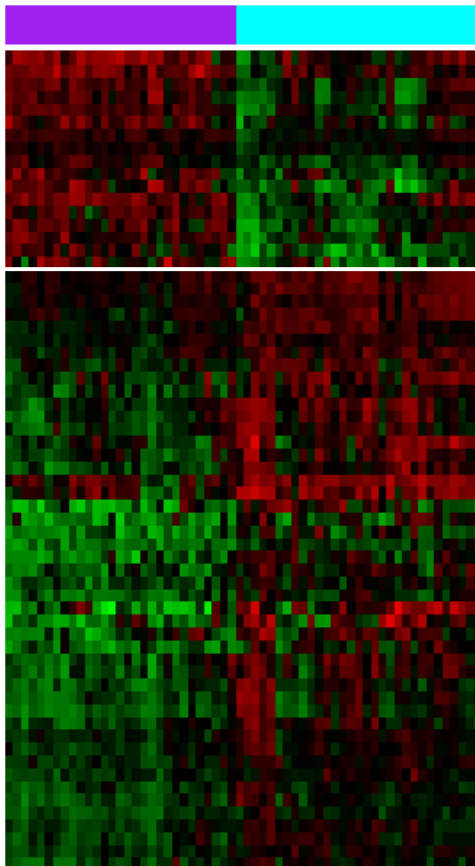
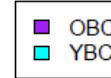
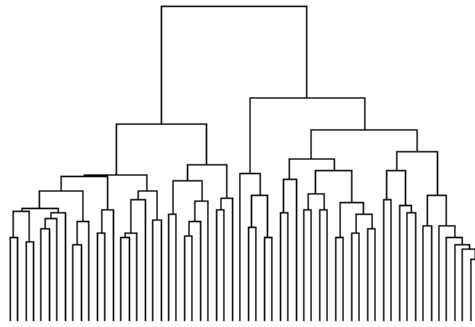
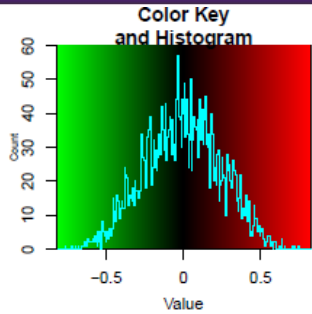
# OBC Tumors More Proliferative than YBC



# OBC Tumors More Proliferative than YBC



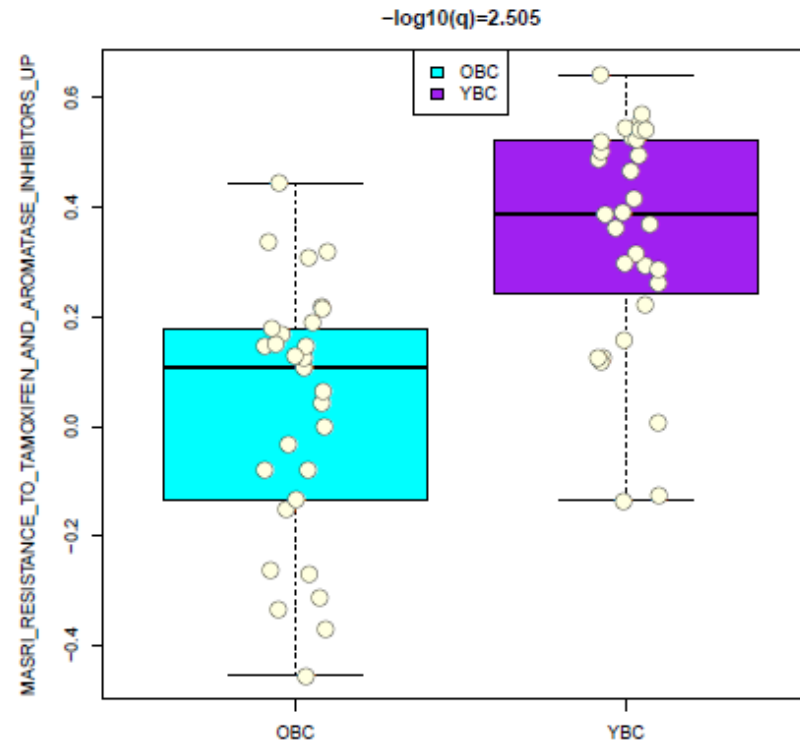
# What Pathways are Differentially Expressed in HR+ YBC vs. OBC?



- KEGG\_NON\_HOMOLOGOUS\_END\_JOINING
- MATTIOLI\_MBUS\_VS\_MULTIPLE\_MYELOMA
- WHITFIELD\_CELL\_CYCLE\_S
- WHITFIELD\_CELL\_CYCLE\_G1\_S
- CHANDRAN\_METASTASIS\_UP
- REACTOME\_DESTABILIZATION\_OF\_MRNA\_BY\_BRF1
- KRIGE\_RESPONSE\_TO\_TOSEDOSTAT\_SHR\_UP
- BROWNE\_HCMV\_INFECTION\_4HR\_DN
- ZWANG\_DOWN\_BY\_2ND\_EGF\_PULSE
- VANTVEER\_BREAST\_CANCER\_BRCA1\_UP
- XU\_HGF\_TARGETS\_INDUCED\_BY\_AKT\_48HR\_DN
- BILD\_CTNNB1\_ONCOGENIC\_SIGNATURE
- DORRAN\_HOX9\_TARGETS\_DN
- HOEBEK\_LYMPHOID\_STEM\_CELL\_UP
- REACTOME\_CD28\_DEPENDENT\_PI3K\_AKT\_SIGNALING
- SABATES\_COLORECTAL\_ADENOMA\_SIZE\_UP
- RAMJAIN\_APOPTOSIS\_BY\_TGFB\_VIA\_SMAD4\_DN
- BLADOCK\_ALZHEIMER\_DISEASE\_DN
- KIM\_ALL\_DISORDERS\_CALB1\_CORR\_UP
- FLECHNER\_BIOPSY\_KIDNEY\_TRANSPLANT\_REJECTED\_VS\_OK\_DN
- KAAB\_FAILED\_HEART\_ATRIUM\_DN
- KIM\_BIPOLAR\_DISORDER\_OLIGODENDROCYTE\_DENSITY\_CORR\_UP
- HALLMARK\_BILE\_ACID\_METABOLISM
- VALK\_AML\_CLUSTER\_16
- REACTOME\_DARPP\_32\_EVENTS
- KEGG\_PROPANOATE\_METABOLISM
- KEGG\_FATTY\_ACID\_METABOLISM
- REACTOME\_SYNTHESIS\_OF\_BILE\_ACIDS\_AND\_BILE\_SALTS
- KEGG\_PRIMARY\_BILE\_ACID\_BIOSYNTHESIS
- REACTOME\_BILE\_ACID\_AND\_BILE\_SALT\_METABOLISM
- TURASHVIL\_BREAST\_LOBULAR\_CARCINOMA\_VS\_LOBULAR\_NORMAL\_UP
- FOOLA\_INVASIVE\_BREAST\_CANCER\_DN
- PLASARI\_NFIC\_TARGETS\_BAGAL\_UP
- MAGGARWEH\_RESPONSE\_TO\_17BETADOL
- MASRI\_RESISTANCE\_TO\_TAMOXIFEN\_AND\_AROMATASE\_INHIBITORS\_UP
- BYSTRYKH\_HEMATOPOIESIS\_STEM\_CELL\_IL3RA
- MATZUK\_ISTEROIDOGENESIS
- AZARE\_NEOPLASTIC\_TRANSFORMATION\_BY\_STAT3\_DN
- DAIRKEE\_CANCER\_PRONE\_RESPONSE\_E2
- KEGG\_PROXIMAL\_TUBULE\_BICARBONATE\_RECLAMATION
- KANG\_FLUOROURACIL\_RESISTANCE\_UP
- GAUSSMANN\_IL11\_AFD\_FUSION\_TARGETS\_D\_UP
- LEIN\_LOCALIZED\_TO\_PROXIMAL\_DENRITES
- SCHAEFFER\_PROSTATE\_DEVELOPMENT\_AND\_CANCER\_BOXES\_DN
- MONTERO\_THYROID\_CANCER\_POOR\_SURVIVAL\_DN
- REACTOME\_HORMONE\_SENSITIVE\_LIPASE\_HSL\_MEDIATED\_TRIACYLGLYCEROL\_HY
- REACTOME\_ADHATION\_ENDPRODUCT\_RECEPTOR\_SIGNALING
- YANG\_MUC2\_TARGETS\_DUODENUM\_3MO\_DN
- YANG\_MUC2\_TARGETS\_DUODENUM\_5MO\_DN
- KEGG\_RETINOL\_METABOLISM
- KEGG\_DRUG\_METABOLISM\_CYTOCHROME\_P450
- KEGG\_METABOLISM\_OF\_XENOBIOTICS\_BY\_CYTOCHROME\_P450
- KEGG\_GLUTATHIONE\_METABOLISM
- SCHAEFFER\_PROSTATE\_DEVELOPMENT\_48HR\_UP
- HOSHIDA\_LIVER\_CANCER\_SUBCLASS\_S3
- LEE\_TARGETS\_OF\_PTOCH\_AND\_SUFU\_DN
- REACTOME\_INTEGRATION\_OF\_ENERGY\_METABOLISM
- CHIANG\_LIVER\_CANCER\_SUBCLASS\_PROLIFERATION\_DN
- LEE\_LIVER\_CANCER\_DENA\_DN
- LE\_EGR2\_TARGETS\_DN
- HALLMARK\_XENOBIOTIC\_METABOLISM
- HALLMARK\_ACID\_BIOSYNTHESIS
- KAAB\_HEART\_ATRIUM\_VS\_VENTRICLE\_DN
- LANDIS\_ERBB2\_BREAST\_PRENEOPLASTIC\_DN

**MASRI RESISTANCE TO TAMOXIFEN AND AROMATASE INHIBITORS UP**

# Endocrine Therapy Resistance Signatures Up-regulated in YBC



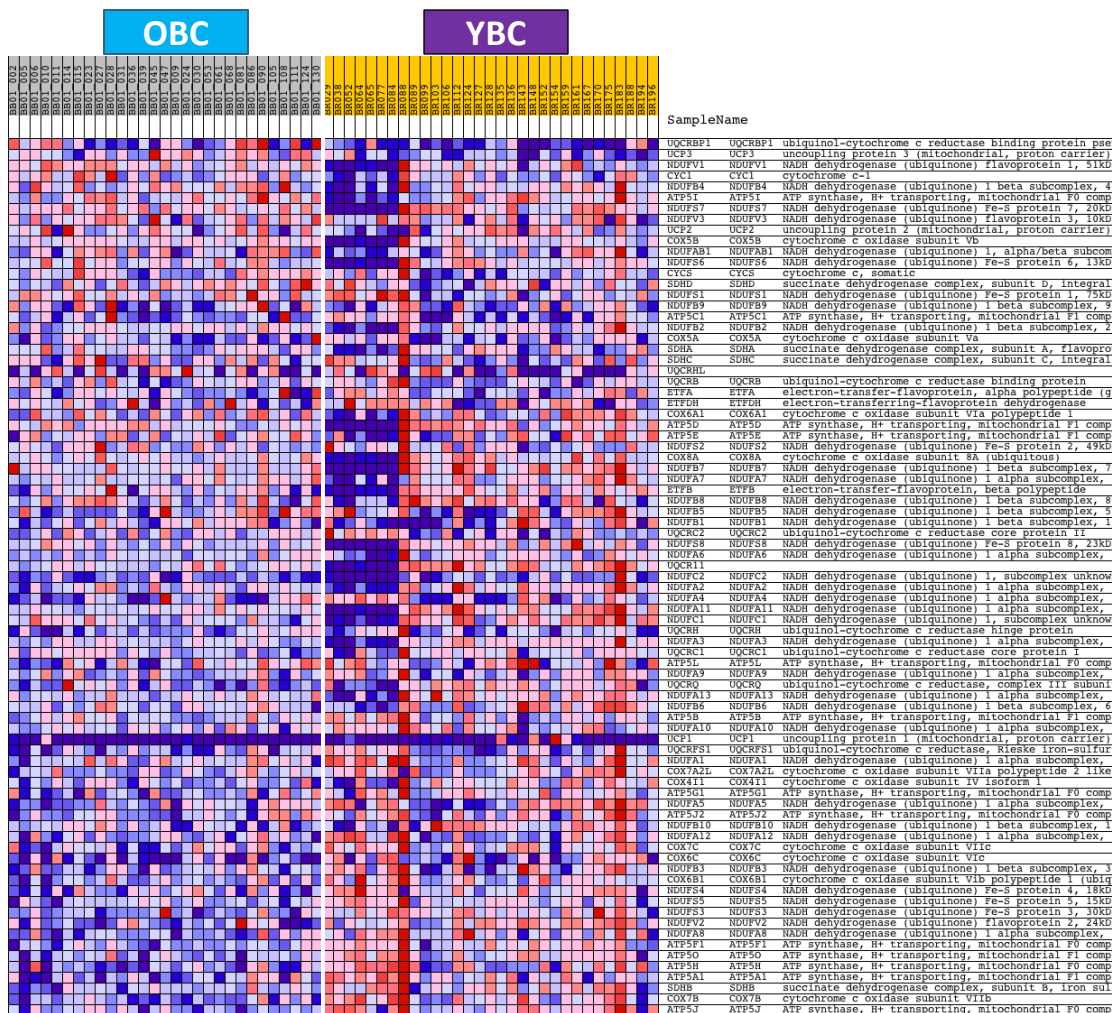
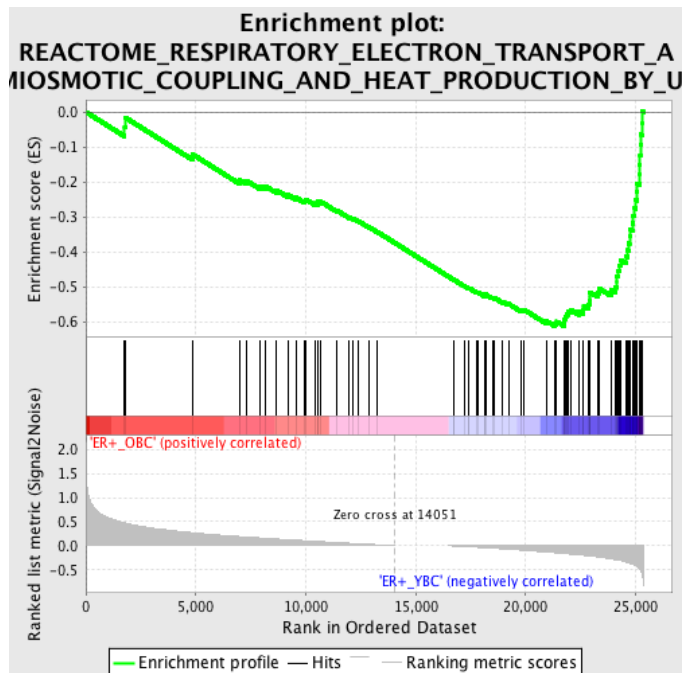
## Research Article

### Genome-Wide Analysis of Aromatase Inhibitor-Resistant, Tamoxifen-Resistant, and Long-Term Estrogen-Deprived Cells Reveals a Role for Estrogen Receptor

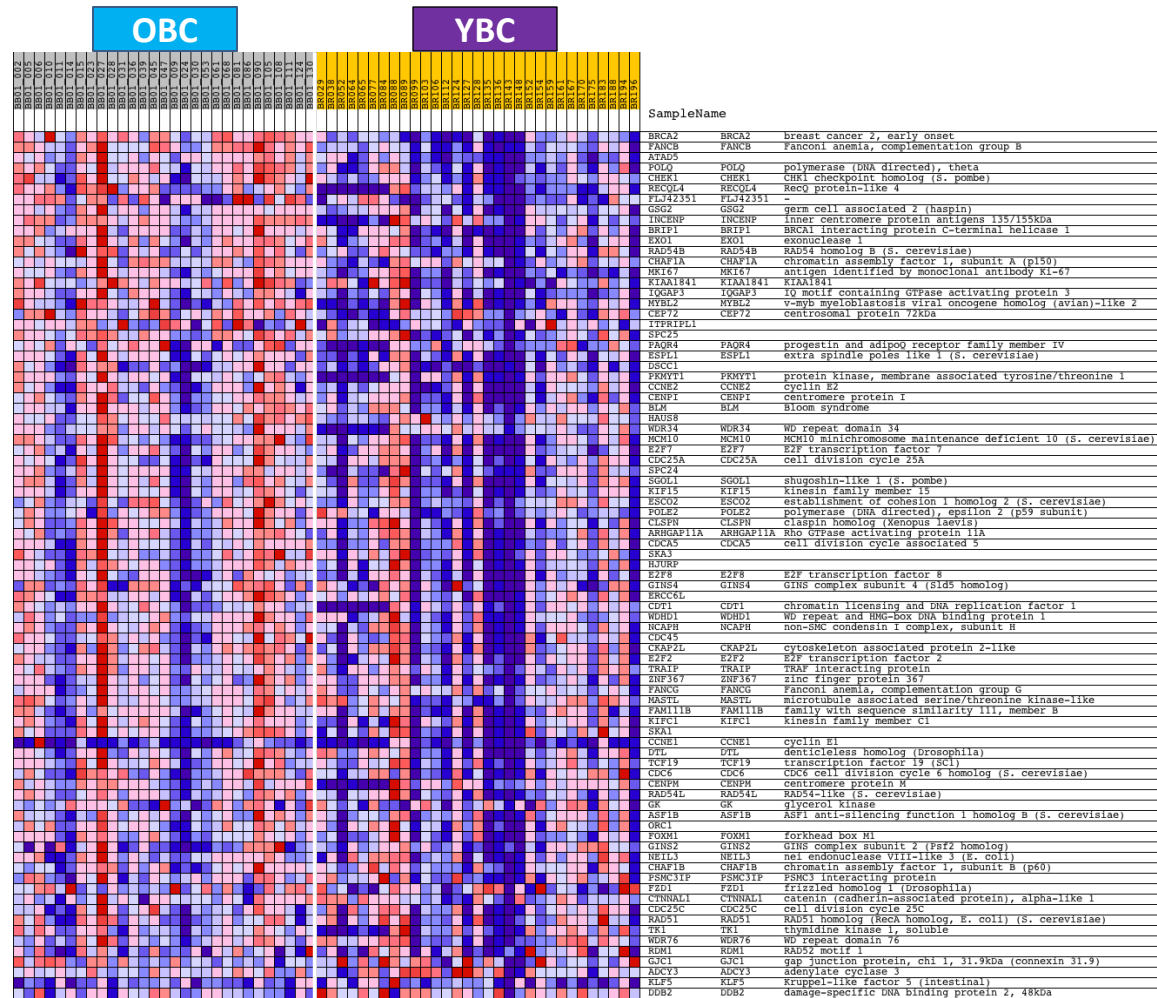
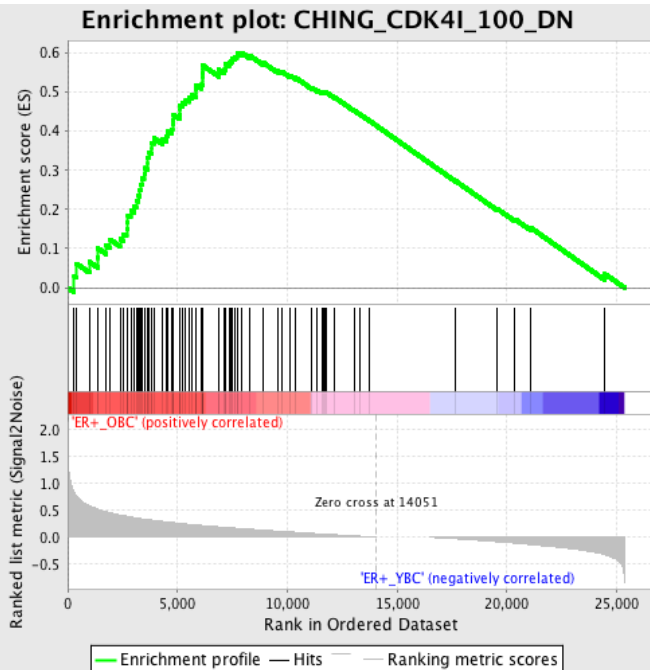
Selma Masri,<sup>1</sup> Sheryl Phung,<sup>1</sup> Xin Wang,<sup>1</sup> Xiwei Wu,<sup>2</sup> Yate-Ching Yuan,<sup>2</sup> Lawrence Wagman,<sup>3</sup> and Shiuan Chen<sup>1</sup>

<sup>1</sup>Department of Surgical Research, <sup>2</sup>Division of Information Sciences, and <sup>3</sup>Department of General Oncologic Surgery, Beckman Research Institute of the City of Hope, Duarte, California

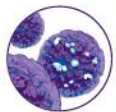
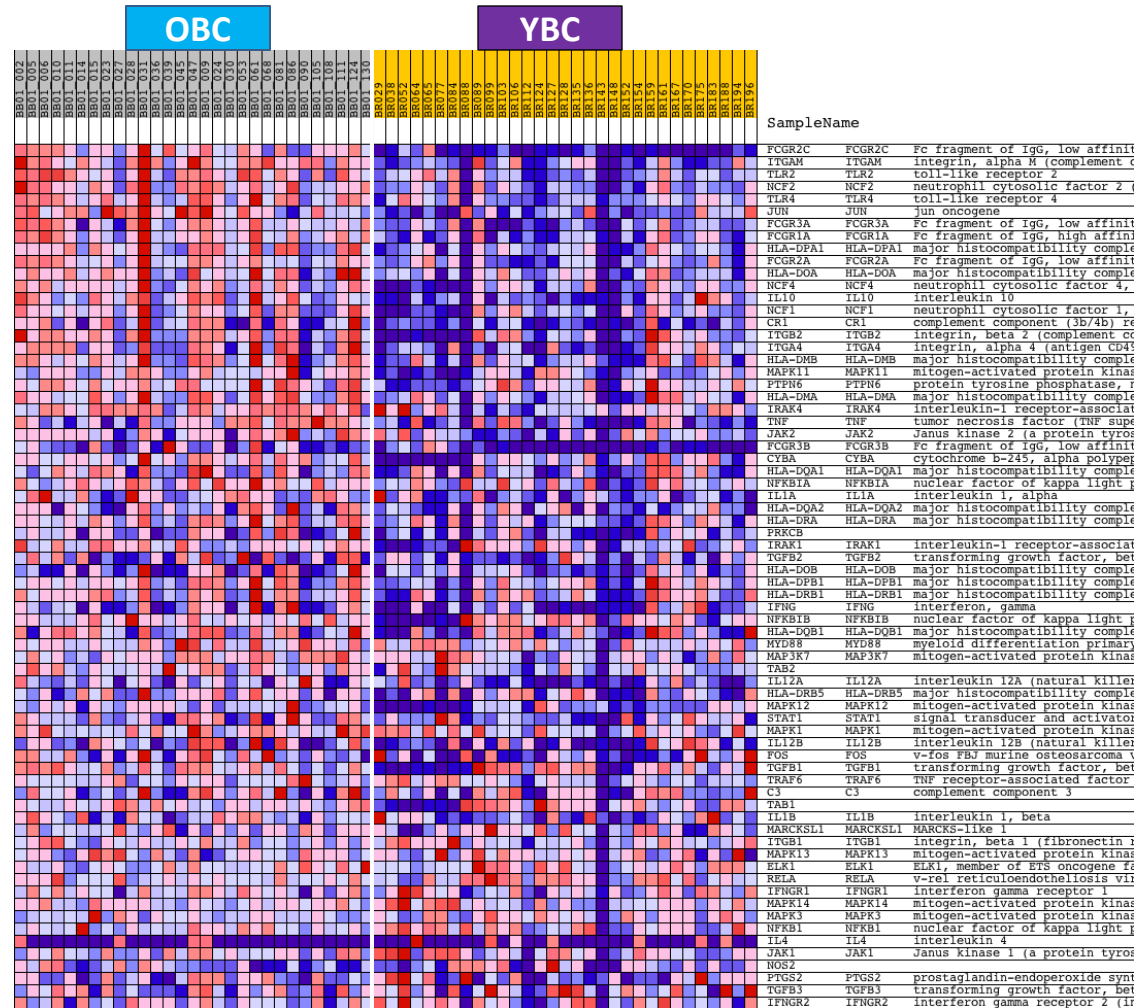
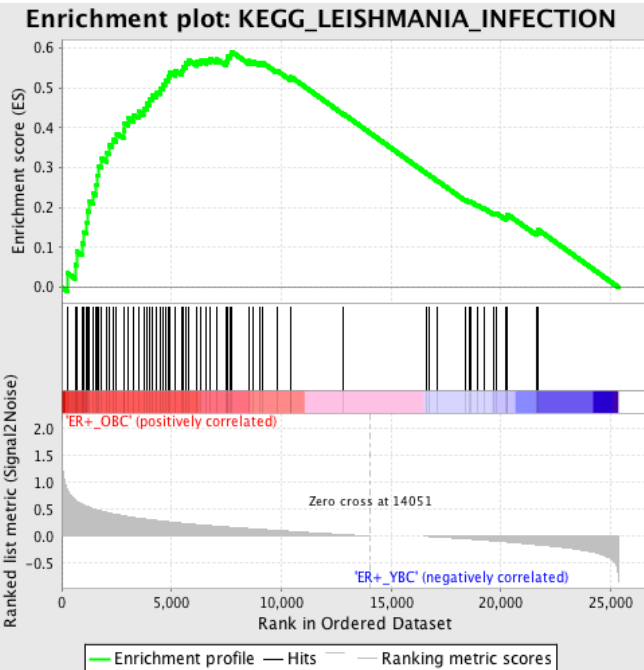
# Oxidative Phosphorylation Pathways Up-regulated in HR+ YBC vs. OBC



# Cell Cycle and Proliferation Pathways Up-regulated in HR+ OBC vs. YBC

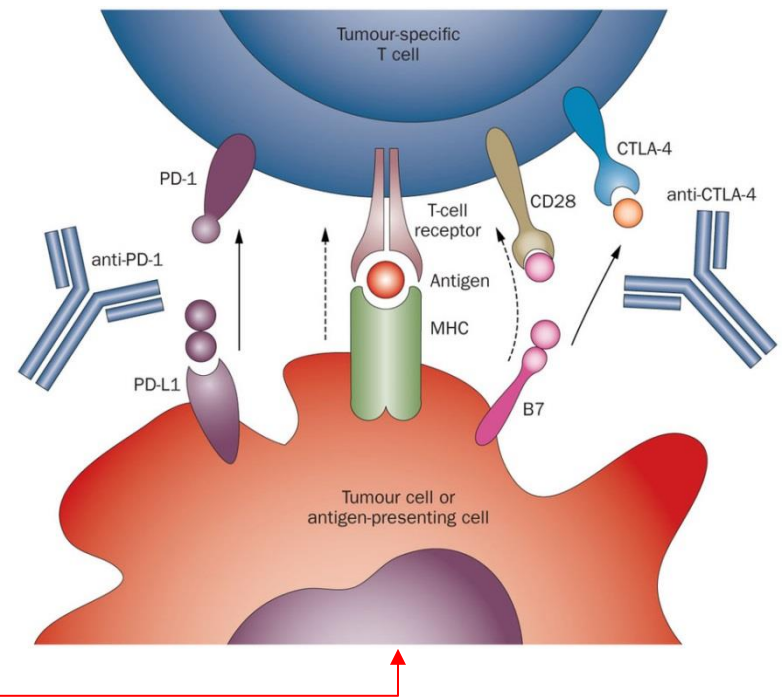
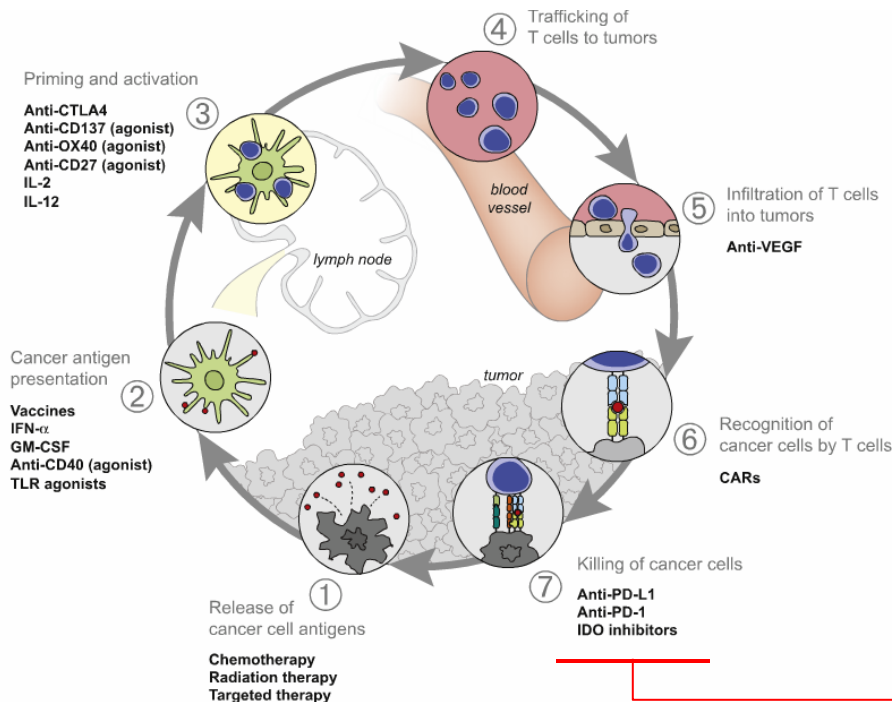


# Immune and Inflammatory Pathways Up-regulated in HR+ OBC vs. YBC



# Immuno-oncology (IO) Therapies

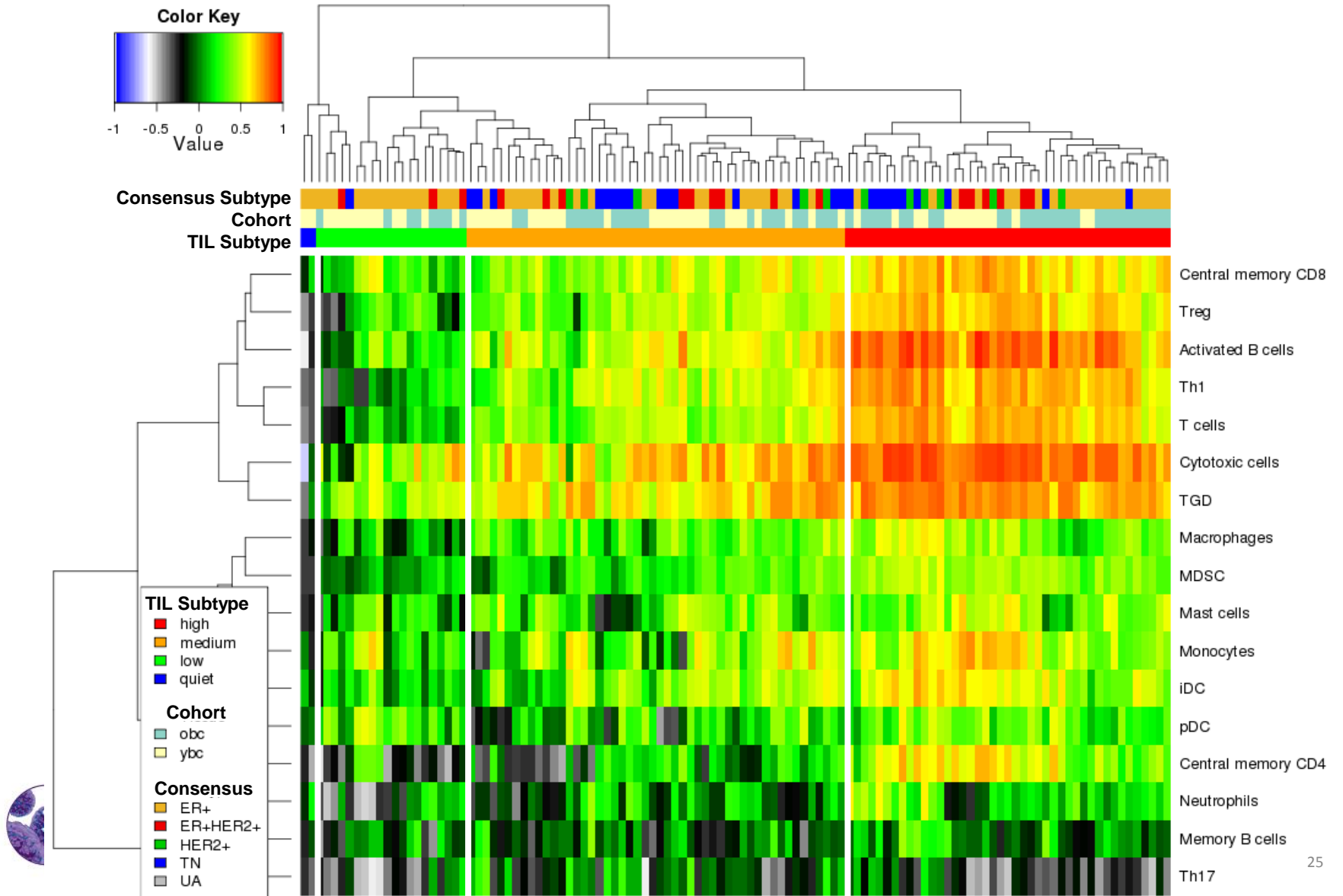
- Tumor antigens may be recognized by immune surveillance and activates cell killing by tumor infiltrating cytotoxic T lymphocytes (CTL).
- T-cell responses are inhibited by immune checkpoint pathways mediated by CTLA4, PD1/PD-L1 etc.
- Immune checkpoint blockade by IO therapies amplifies anti-tumor immune responses - Nivolumab ( $\alpha$ CTLA4), Pembrolizumab ( $\alpha$ PD1), Avelumab ( $\alpha$ PDL1).



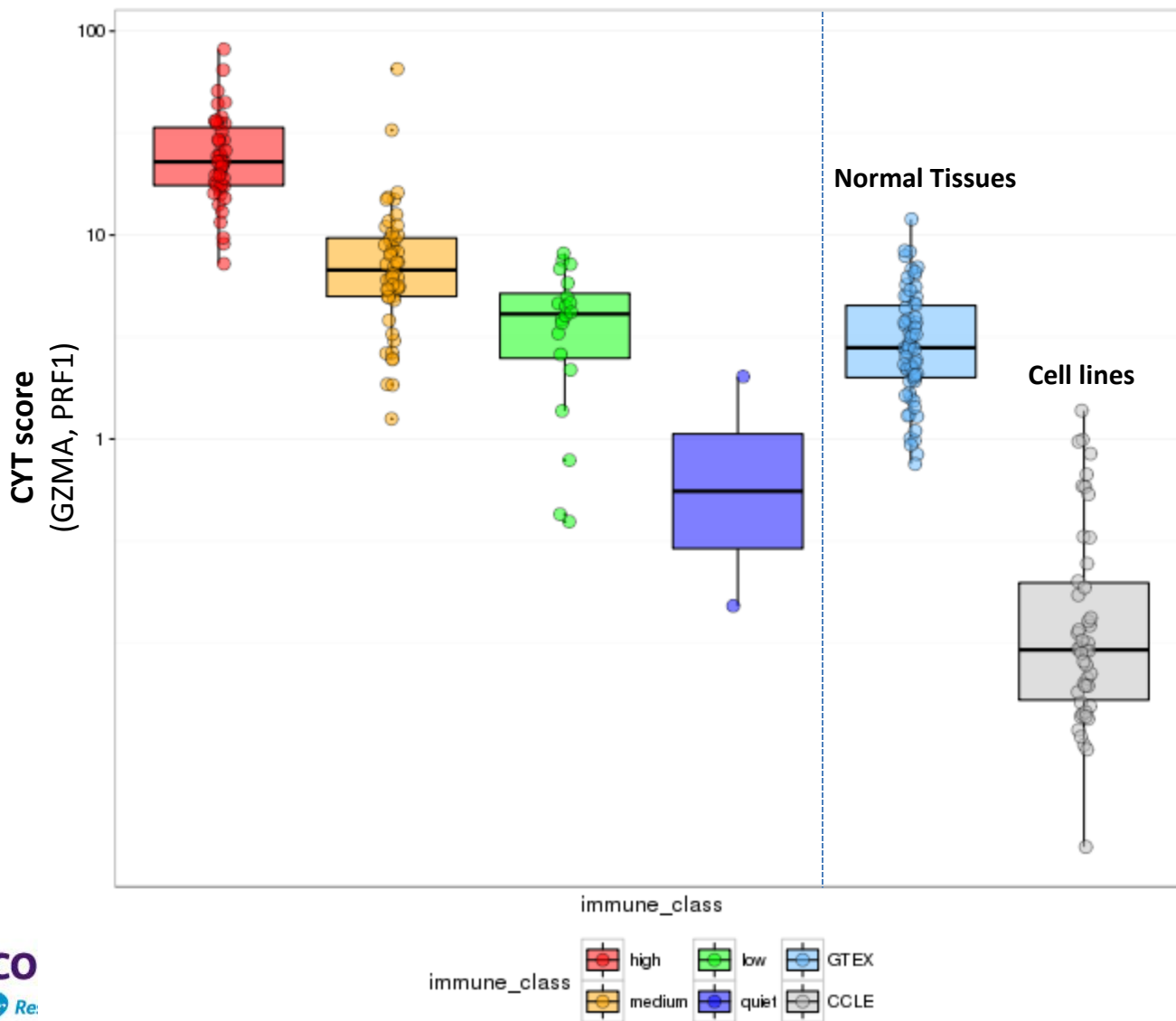
Drake et al. **Breathing new life into immunotherapy.** 2014. Nature Reviews Clinical Oncology.



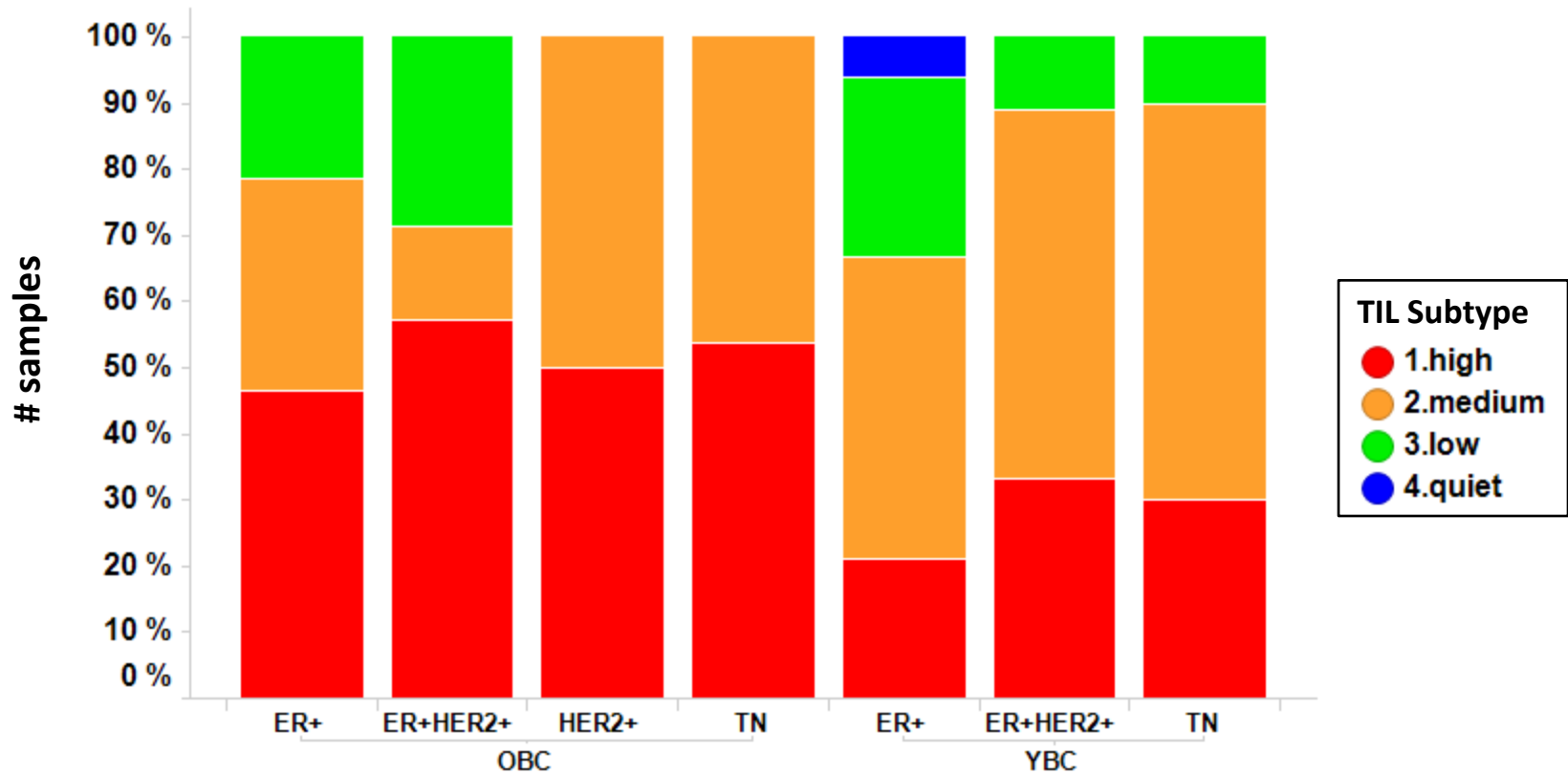
# Classification of TIL Subtypes based on Immune Expression Signature



# Cytolytic Activity Varies across TIL Subtypes, Normal Breast Tissues and Cell lines



# OBC Seem More Immunogenic than YBC

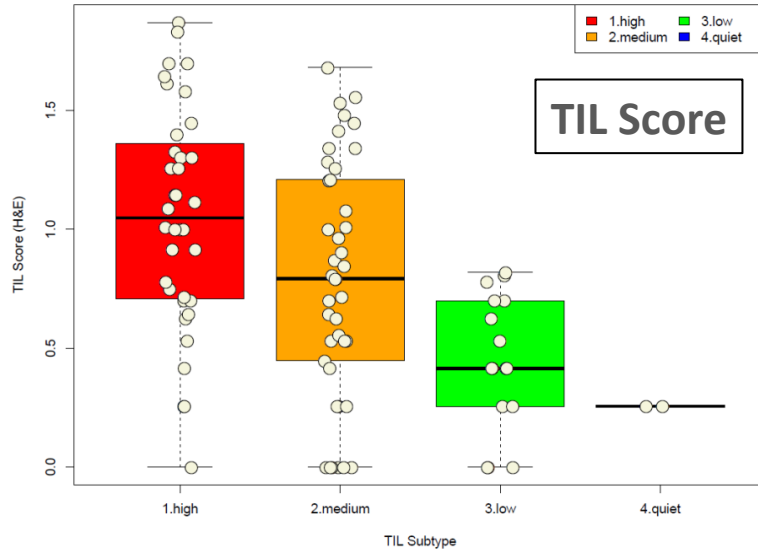


# Histopathological IO analyses

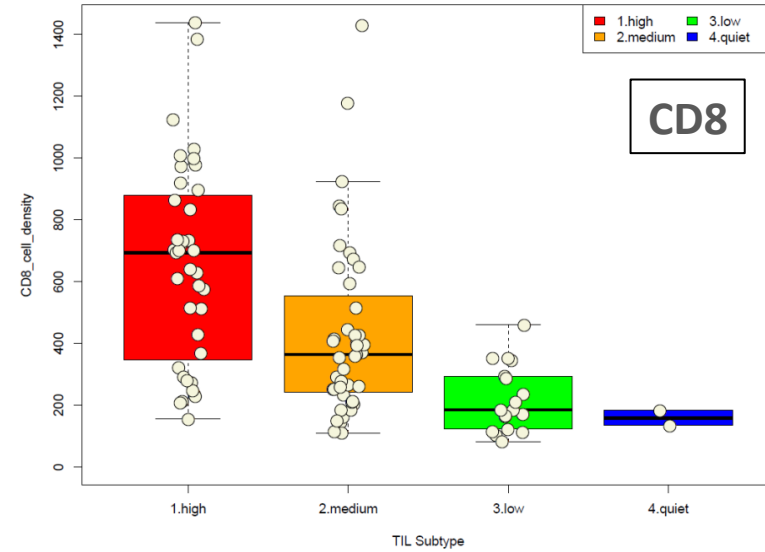
- We performed H&E staining and immunohistochemistry (IHC) analyses of three TIL markers (*CD4*, *CD8* and *CD45*) on 111 tumors.
- TIL score was calculated as  $\log_{10}T$ , where T is the average TIL count from 5 separate regions of the H&E image.
- Digital imaging analysis was performed to quantify the relevant tissue area and the number of marker positive cells within those regions for each IHC slide.
  - Cell density is calculated as the number of marker positive cells in each  $\text{mm}^2$  of analyzed tissue.

# Histopathological and Expression IO Analyses are Highly Concordant

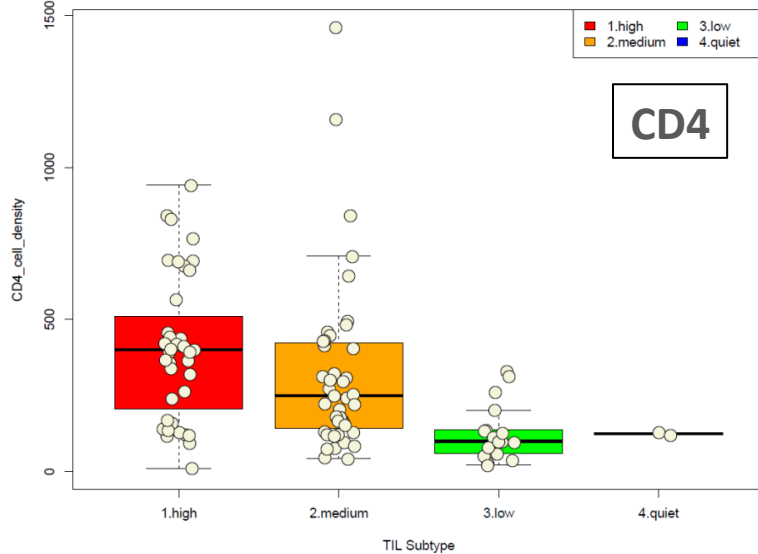
TIL Score:  $p=0.000104$



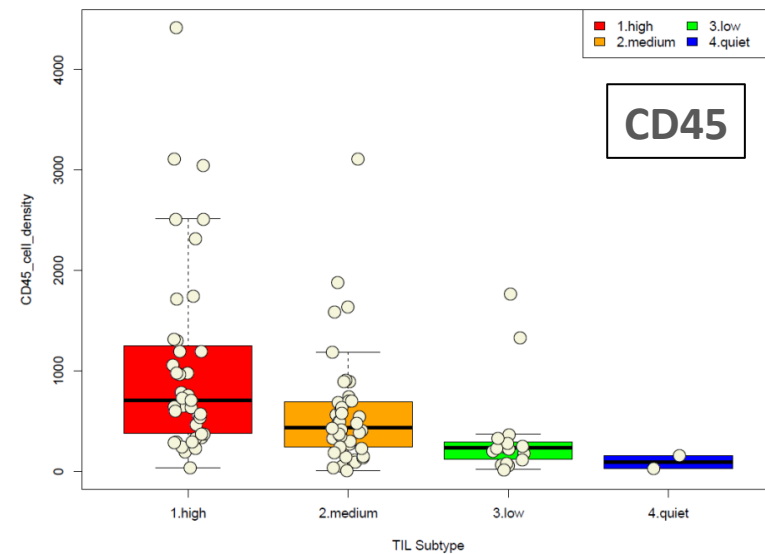
CD8\_cell\_density:  $p=2e-06$



CD4\_cell\_density:  $p=0.000813$

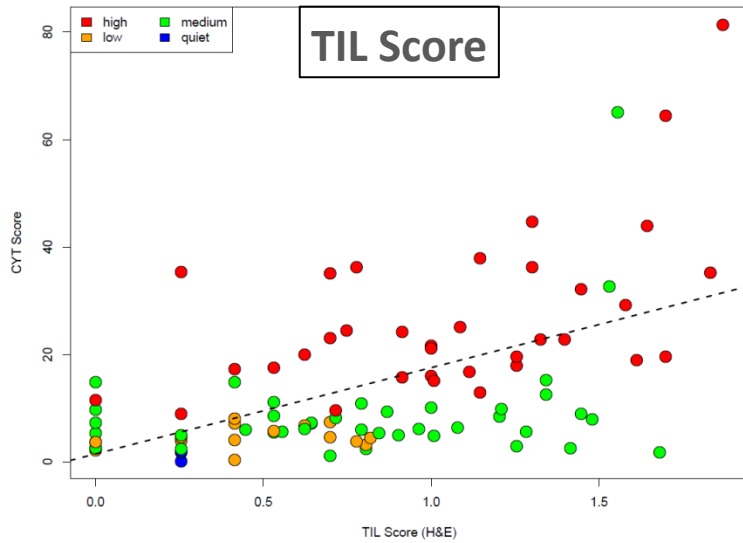


CD45\_cell\_density:  $p=0.0024$

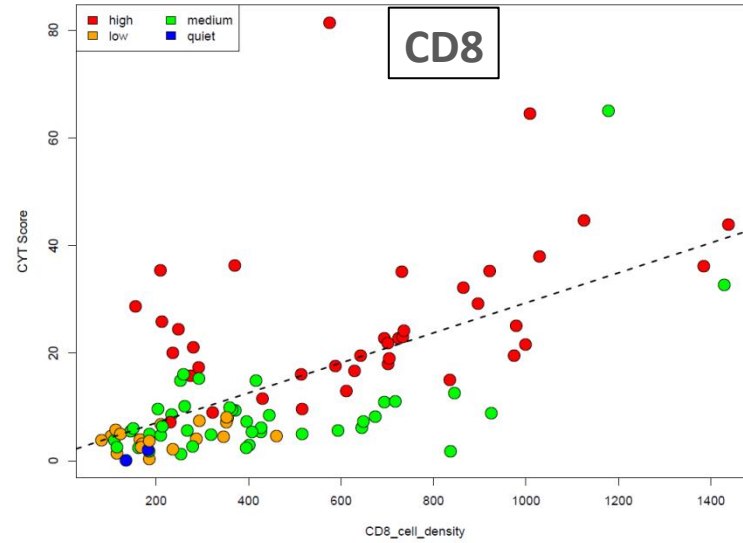


# Histopathological and Expression IO Analyses are Highly Concordant

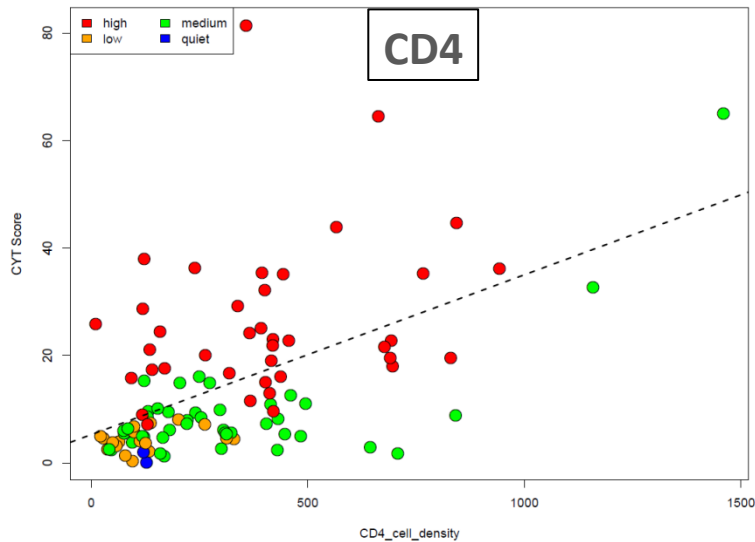
Spearman Corr: 0.515; p: 0



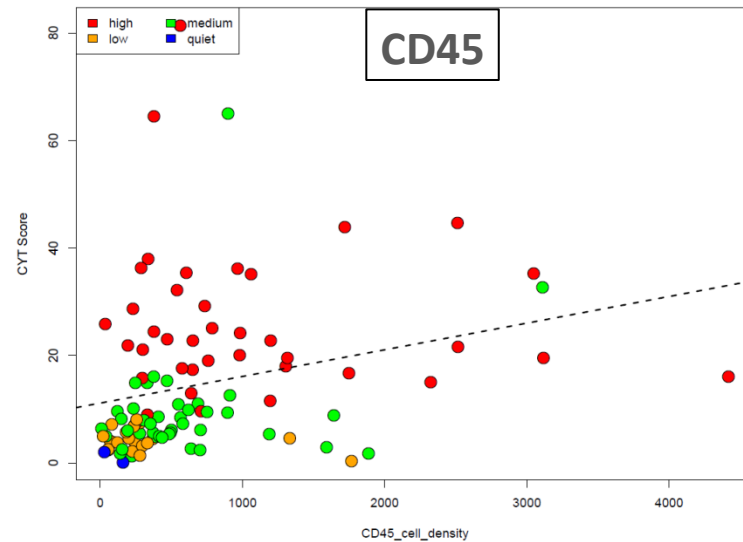
Spearman Corr: 0.633; p: 0



Spearman Corr: 0.504; p: 0



Spearman Corr: 0.435; p: 1e-05



# Summary

- We have performed the first large-scale multi-omics study of Asian breast cancer that would significantly contribute to the compendium of molecular data available for young, premenopausal breast cancer.
- The molecular landscape of Asian BC cohort is similar to Western BC studies in terms of major landmarks – ER over-expression, *ERBB2* amplification and mutations in *TP53*, *PIK3CA* and *GATA3*.
  - We have identified ARID1A as a significantly mutated gene in breast cancer.
- There are potentially significant molecular distinctions between Asian YBC vs. OBC.
  - *BRCA1/BRCA2* germline loss-of-function mutations are enriched in HR+ YBC.
  - YBC tumors appear to be less proliferative and smaller in size than OBC while OBC tumors harbor more mutations and copy number alterations than YBC.
  - Endocrine resistance signatures are up-regulated in HR+ YBC than in OBC, pointing to a molecular mechanism for tamoxifen resistance previously reported for Korean YBC.
  - Within the HR+ subtype, energy metabolism pathways such as oxidative phosphorylation appears to be up-regulated in YBC while cell cycle/proliferation and immune/inflammatory pathways appear to be up-regulated in OBC.
- Gene expression signature analyses have identified four subtypes of varying tumor-infiltrating lymphocyte (TIL) and cytolytic activities.
  - YBC seems to be less immunogenic than OBC with a lower mutation burden.
  - Expression-based and histopathological analyses of IO markers are strongly correlated.

# Acknowledgements

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- Yeon Hee Park
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- Woong-Yang Park (SGI)
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- Seok Won Kim
- Jeong Eon Lee
- Ji-Yeon Kim
- Jin Seok Ahn
- Young-Hyuck Im
- Seok Jin Nam

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- Ying Ding
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- Soo-Hyeon Lee (Pfizer Korea)
- Eric Powell
- Shibing Deng (Pfizer Statistics)
- Pamela Vizcarra
- Julio Fernandez
- Tim Nichols (Pfizer DSRD)
- Sripad Ram (Pfizer DSRD)
- Keith A. Ching
- Jadwiga Bienkowska
- Paul Rejto
- Yuan-Hua Ding (Pfizer ERDI)



# Back Up

# References

1. Park, Y.H., et al., *Prevalence and clinical outcomes of young breast cancer (YBC) patients according to intrinsic breast cancer subtypes: Single institutional experience in Korea*. *Breast*, 2015. **24**(3): p. 213-7.
2. Cancer Genome Atlas, N., *Comprehensive molecular portraits of human breast tumours*. *Nature*, 2012. **490**(7418): p. 61-70.
3. Ahn, S.H., et al., *Poor outcome of hormone receptor-positive breast cancer at very young age is due to tamoxifen resistance: nationwide survival data in Korea--a report from the Korean Breast Cancer Society*. *J Clin Oncol*, 2007. **25**(17): p. 2360-8.
4. Lawrence, M.S., et al., *Mutational heterogeneity in cancer and the search for new cancer-associated genes*. *Nature*, 2013. **499**(7457): p. 214-8.
5. Mermel, C.H., et al., *GISTIC2.0 facilitates sensitive and confident localization of the targets of focal somatic copy-number alteration in human cancers*. *Genome Biol*, 2011. **12**(4): p. R41.
6. Hanzelmann, S., R. Castelo, and J. Guinney, *GSVA: gene set variation analysis for microarray and RNA-seq data*. *BMC Bioinformatics*, 2013. **14**: p. 7.
7. Angelova, M., et al., *Characterization of the immunophenotypes and antigenomes of colorectal cancers reveals distinct tumor escape mechanisms and novel targets for immunotherapy*. *Genome Biol*, 2015. **16**: p. 64.

# Clinical Characteristics of Western YBC

## Box 3 | Clinical characteristics in women <40

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- High risk of local recurrence
- Short median time from diagnosis to local recurrence
- High risk of mortality following local recurrence
- High risk of contralateral breast cancer
- High proportion oestrogen receptor-negative or progesterone receptor-negative disease
- High proportion of HER2-positive disease
- High proportion *TP53*-positive tumours

# Compare Subtype Proportions in YBC vs. OBC

IHC/Clinical	OBC	OBC (%)	YBC	YBC (%)
ER+	28	46.7%	46*	62.2%
ER+HER2+	7	11.7%	10	17.9%
HER2+	10	16.7%	2	3.6%
TN	13	21.7%	13	23.2%
UA	2	3.3%	3	5.4%
	<b>60</b>		<b>74</b>	

$p = 0.08$

$p = 0.006$

PAM50	OBC	OBC (%)	YBC	YBC (%)
LumA	7	11.7%	21	38.2%
LumB	28	46.7%	16	29.1%
Her2	12	20.0%	3	5.5%
Basal	12	20.0%	14	25.5%
Normal	1	1.7%	1	1.8%
	<b>60</b>		<b>55</b>	

$p = 0.0011$

$p = 0.06$

(RNASEQ n = 115)

Consensus	OBC	OBC (%)	YBC	YBC (%)
ER+	29	48.3%	44	59.5%
ER+HER2+	9	15.0%	10	17.9%
HER2+	9	15.0%	4	7.1%
TN	13	21.7%	16	28.6%
	<b>60</b>		<b>74</b>	

$P = 0.225$

$P = 0.08$

$P = 0.58$

Consensus	OBC	OBC (%)	YBC	YBC (%)
ER+	29	48.3%	31	56.4%
ER+HER2+	9	15.0%	9	16.4%
HER2+	9	15.0%	2	3.6%
TN	13	21.7%	13	23.6%
	<b>60</b>		<b>55</b>	

$P = 0.456$

$P = 0.056$

$P = 0.83$

- Contrary to previous reports, Asian YBC is enriched in Luminal A and HER2+ subtypes.
- In addition, Asian YBC is not significantly enriched in TNBC.
- Asian YBC is dominated by HR+ diseases - 77% including both ER+ and ER+/HER2+.

# Genomic alterations enriched in YBC or OBC.

Type	Gene	YBC (n=73)	OBC (n=60)	p-value	q-value
Somatic Mutation	<i>TP53</i>	27 (37.0%)	36 (60.0%)	0.0093	0.1395
Somatic Mutation	<i>NF1</i>	1 (1.4%)	6 (10.0%)	0.0456	0.293143
Somatic Mutation	<i>CBFB</i>	1 (1.4%)	5 (8.3%)	0.0903	0.507938
Somatic Mutation	<i>PIK3CA</i>	19 (26.0%)	20 (33.3%)	0.4444	1
Somatic Mutation	<i>GATA3</i>	11 (15.1%)	7 (11.7%)	0.6191	1
Somatic Mutation	<i>PTEN</i>	3 (4.1%)	1 (1.7%)	0.6266	1
Somatic Mutation	<i>ARID1A</i>	3 (4.1%)	3 (5.0%)	1	1
Amplification	<i>MYC</i>	0	5 (8.3%)	0.017	0.136
Amplification	<i>ERBB2</i>	10 (13.7%)	17 (28.3%)	0.0507	0.2028
Somatic Mutation	<i>BRCA1</i>	1 (1.4%)	0	0.55	
Germline LOF	<i>BRCA1</i>	3 (4%)	0	0.16	
Germline LOF	<i>BRCA2</i>	6 (8%)	3 (5.0%)	0.3533	
Somatic/Germline	<i>BRCA1/2</i>	10 (13.7%)	3 (5.0%)	0.08	

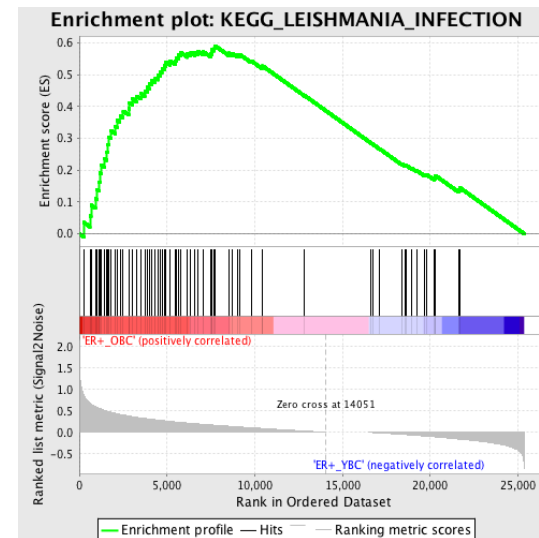
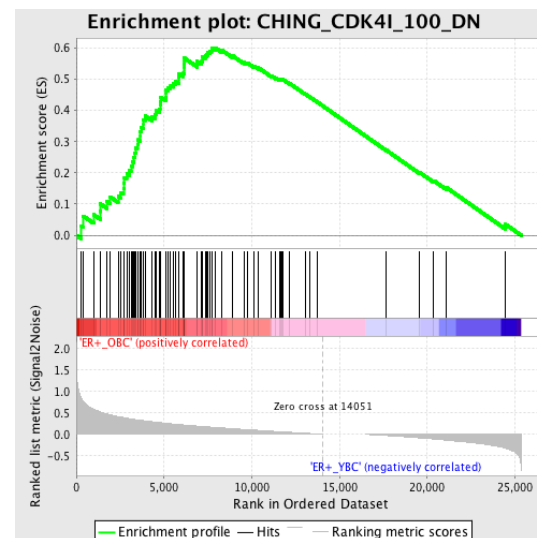
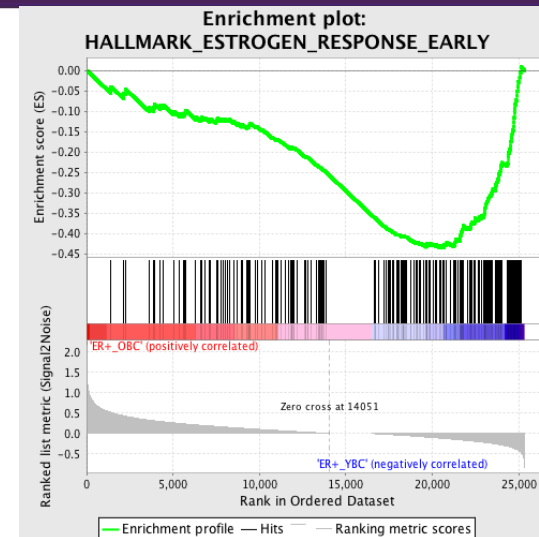
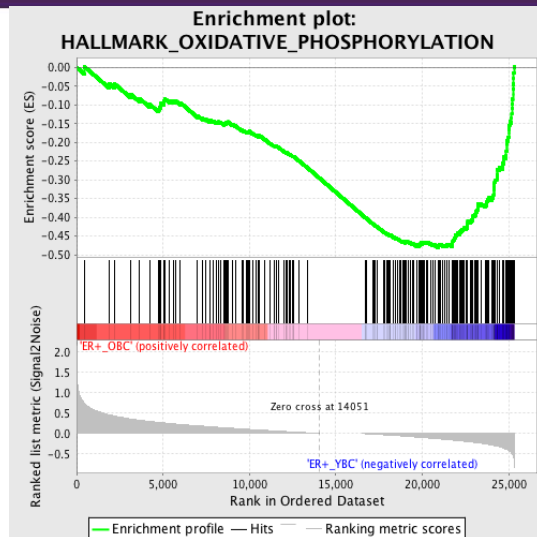
*TP53*, *NF1* protein-altering somatic mutations and *MYC*, *ERBB2* amplifications are enriched in OBC. Loss-of-function (LOF) mutations affecting *BRCA1* or *BRCA2* are enriched in YBC.

# What Pathways are Differentially Expressed in HR+ YBC vs. OBC?

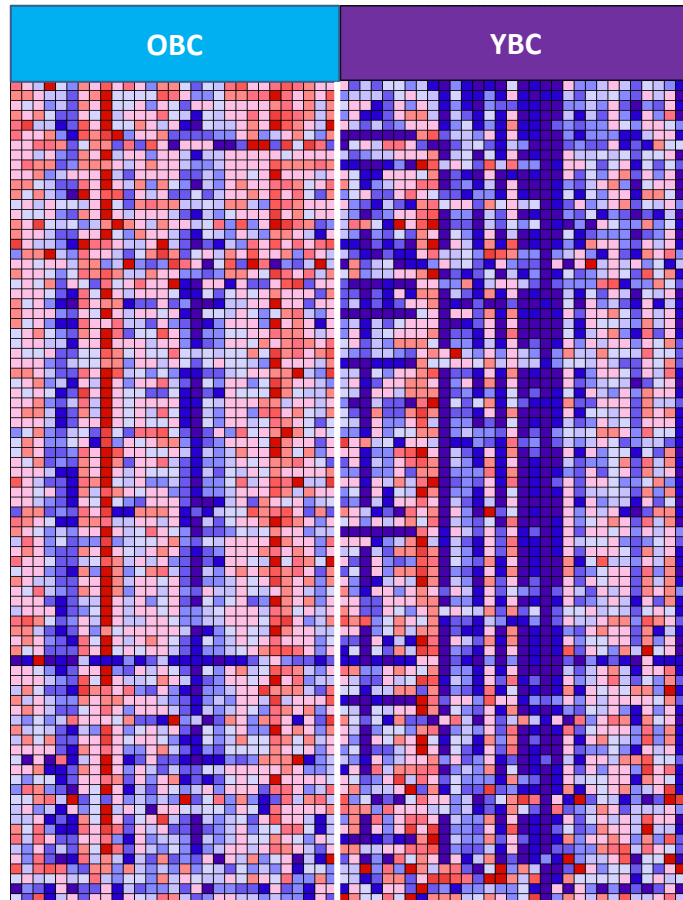
Subtype	Up-regulated	Database	Geneset	# Genes	NES	FDR q-val
HR+	YBC	Hallmark	OXIDATIVE_PHOSPHORYLATION	199	-2.81478	0
HR+	YBC	KEGG	PARKINSONS_DISEASE	113	-2.58741	0
HR+	YBC	REACTOME	RESPIRATORY_ELECTRON_TRANSPORT	65	-2.52911	0
HR+	YBC	Biocarta	PROTEASOME_PATHWAY	28	-2.48144	0
HR+	YBC	KEGG	OXIDATIVE_PHOSPHORYLATION	116	-2.47474	0
HR+	YBC	REACTOME	FORMATION_OF_ATP_BY_CHEMIOSMOTIC_COUPLING	13	-2.32748	0
HR+	YBC	Hallmark	ESTROGEN_RESPONSE_EARLY	200	-2.32048	0
HR+	YBC	REACTOME	TCA_CYCLE_AND_RESPIRATORY_ELECTRON_TRANSPORT	117	-2.21898	0.00328
HR+	YBC	KEGG	DRUG_METABOLISM_CYTOCHROME_P450	72	-2.21243	0.00285
HR+	YBC	Hallmark	ESTROGEN_RESPONSE_LATE	199	-2.13894	0

HR+	OBC	KEGG	LEISHMANIA_INFECTION	70	1.73803	0.03707
HR+	OBC	KEGG	PRIMARY_IMMUNODEFICIENCY	35	1.61149	0.09367
HR+	OBC	KEGG	INTESTINAL_IMMUNE_NETWORK_FOR_IGA_PRODUCTION	46	1.60056	0.08103
HR+	OBC	KEGG	ALLOGRAFT_REJECTION	35	1.58956	0.07455
HR+	OBC	KEGG	NOD_LIKE_RECEPTOR_SIGNALING_PATHWAY	61	1.56616	0.08697
HR+	OBC	KEGG	SYSTEMIC_LUPUS_ERYTHEMATOSUS	134	1.5536	0.09184
HR+	OBC	Hallmark	ALLOGRAFT_REJECTION	200	1.49757	0.06265
HR+	OBC	Hallmark	G2M_CHECKPOINT	200	1.46906	0.05
HR+	OBC	Hallmark	MYC_TARGETS_V2	58	1.4509	0.04217
HR+	OBC	Hallmark	E2F_TARGETS	199	1.41913	0.05067
HR+	OBC	Hallmark	MITOTIC_SPINDLE	199	1.41661	0.04119
HR+	OBC	Hallmark	INFLAMMATORY_RESPONSE	198	1.40403	0.04037

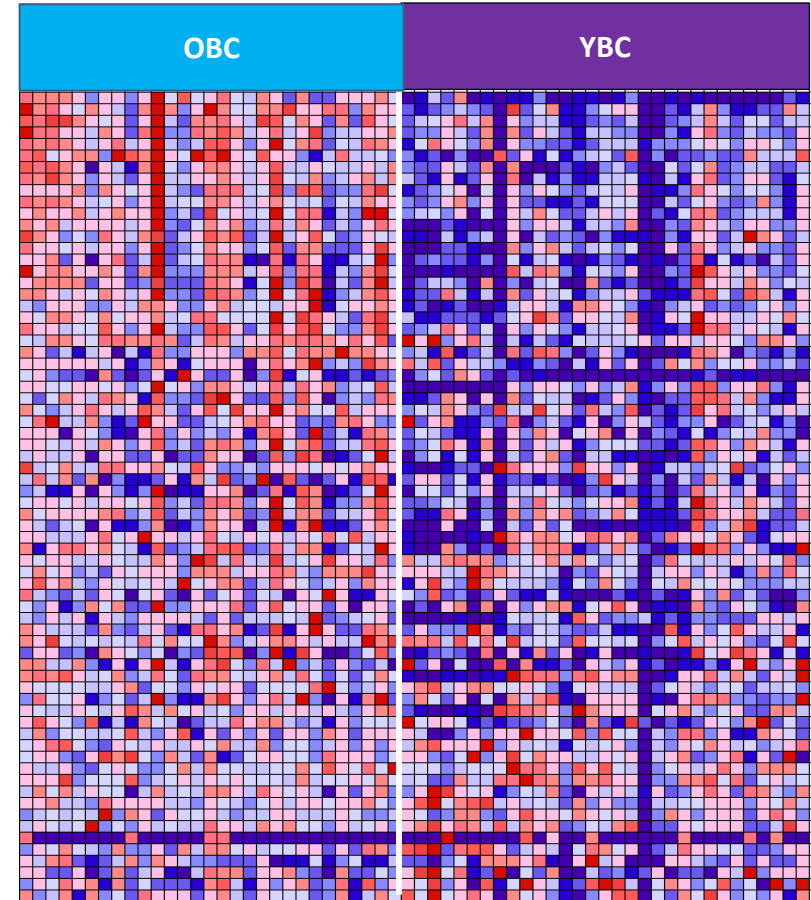
# GSEA Analyses Revealed Differentially Expressed Pathways in YBC vs. OBC



# GSEA Analyses Revealed Differentially Expressed Pathways in YBC vs. OBC



KEGG: LEISHMANIA\_INFECTION

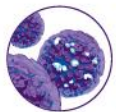


CDK4I\_100\_DN



# Classification of TIL Subtypes based on Immune Cell Expression Signature

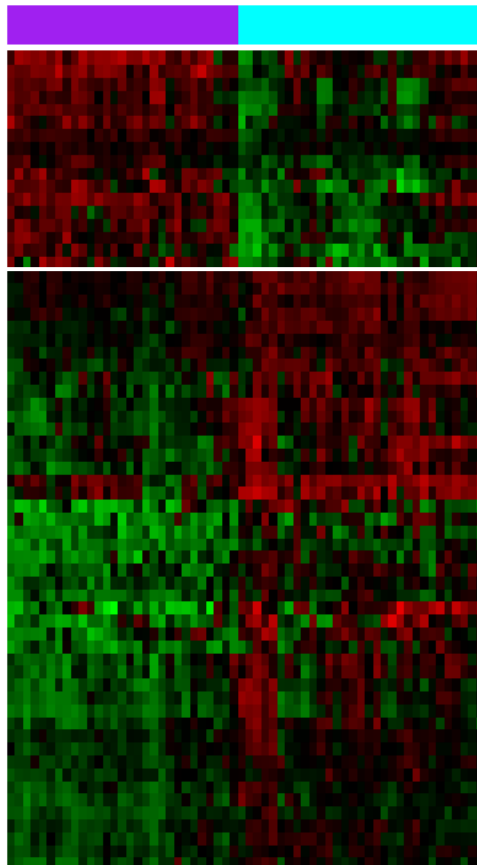
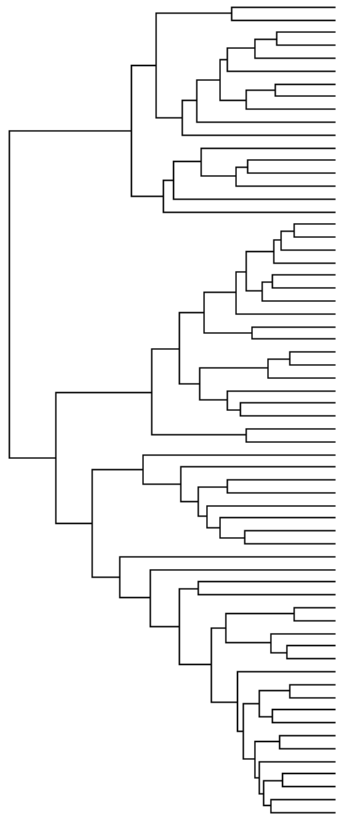
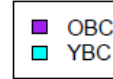
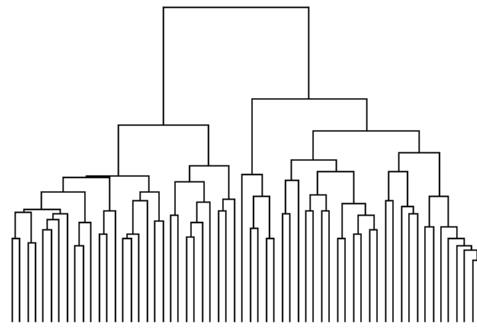
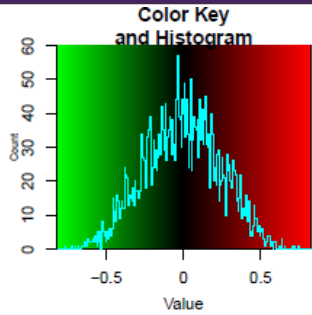
- Tumor infiltrated lymphocytes (TIL) play important roles in tumor suppression and immuno-oncology (IO) therapies such as checkpoint inhibitors ( $\alpha$ PD-L1).
- Using gene expression signatures representing distinct immune cell types [REF], we classified the cohort into four subtypes of varying TIL activities: high, medium, low and quiet.
- OBC tumors are significantly enriched ( $p$ -value: 0.01291) in the TIL-high subtype than YBC tumors, suggesting that OBC tumors are more immunogenic than YBC tumors.
- This is consistent with the observation that OBC exhibits higher burden of protein-altering somatic mutations than YBC samples (40 vs. 26,  $p$ -value: 0.034), presumably giving rise to more neoantigens.



# “Big” Questions

- What are the molecular drivers of Asian BC?
- What are the differences between YBC and OBC?
- Can we learn something new about Breast Cancer in general?

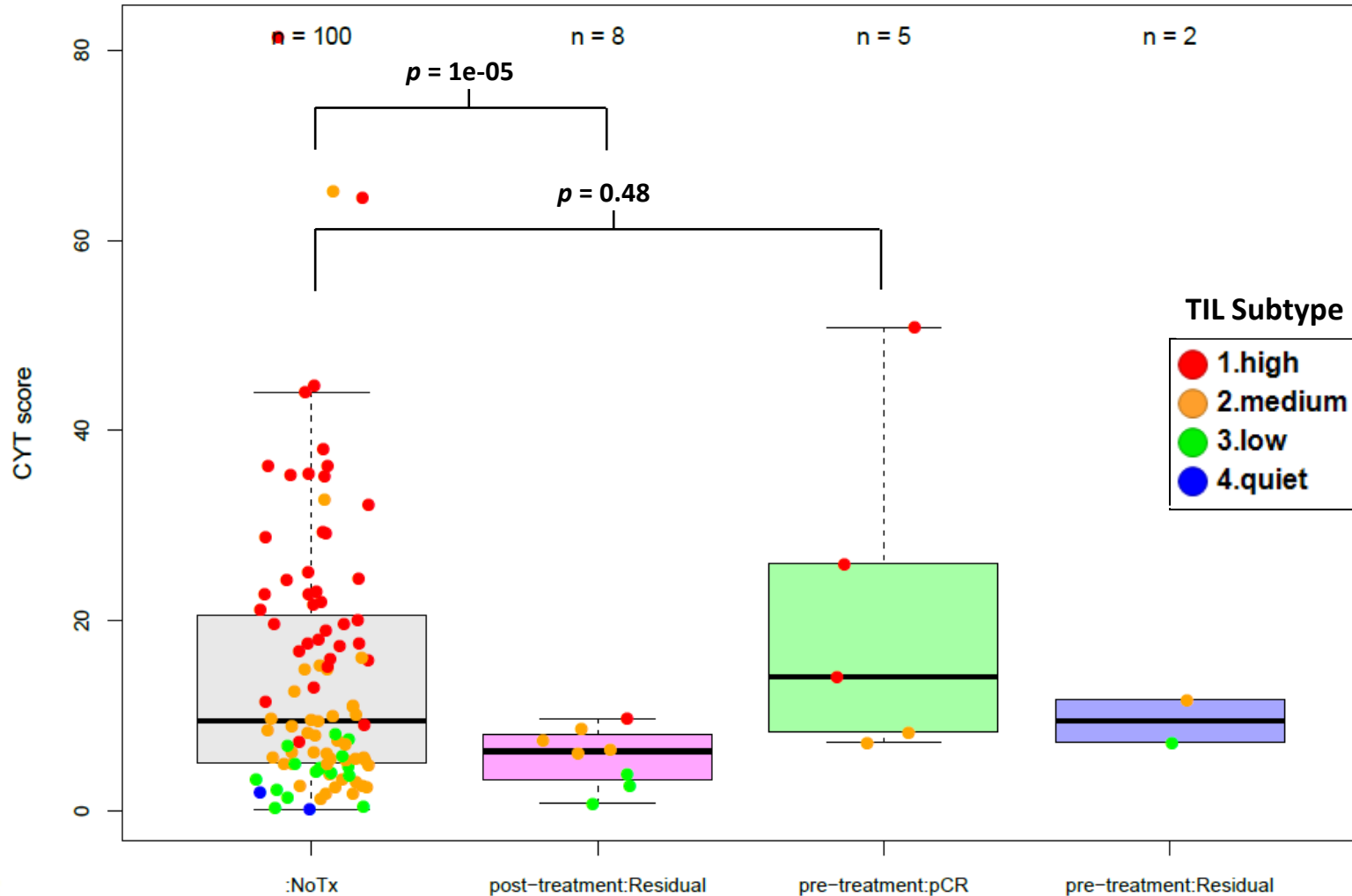
# What Pathways are Differentially Expressed in HR+ YBC vs. OBC?



KEGG\_NON\_HOMOLOGOUS\_END\_JOINING  
 MATTIOLI\_MGUS\_VS\_MULTIPLE\_MYELOMA  
 WHITFIELD\_CELL\_CYCLE\_9  
 WHITFIELD\_CELL\_CYCLE\_G1\_S  
 CHANDRAN\_METASTASIS\_UP  
 REACTOME\_DESTABILIZATION\_OF\_MRNA\_BY\_BRF1  
 KRIGE\_RESPONSE\_TO\_TOSEDOSTAT\_5HR\_UP  
 BROWNE\_HCMV\_INFECTION\_4HR\_DN  
 ZWANG\_DOWN\_BY\_2ND\_EGF\_PULSE  
 VANTVEER\_BREAST\_CANCER\_BRCA1\_UP  
 XU\_HGF\_TARGETS\_INDUCED\_BY\_AKT\_1\_4HR\_DN  
 BILD\_CITNFB1\_ONCOGENIC\_SIGNATURE  
 DORSAM\_HOX9\_TARGETS\_DN  
 HOEBEK\_LYMPHOID\_STEM\_CELL\_UP  
 REACTOME\_CD28\_DEPENDENT\_PI3K\_AKT\_SIGNALING  
 SABATES\_COLORECTAL\_ADENOMA\_SIZE\_UP  
 RAMJAIN\_APOPTOSIS\_BY\_TGFB\_VIA\_SMAD4\_DN  
 FLADLOK\_ALZHEIMERS\_DISEASE\_DN  
 KIM\_ALL\_DISORDERS\_CALB1\_CORR\_UP  
 FLECHNER\_BIOPSY\_KIDNEY\_TRANSPLANT\_REJECTED\_VS\_OK\_DN  
 KAAS\_FAILED\_HEART\_ATRIUM\_DN  
 KIM\_BIPOLAR\_DISORDER\_OLIGODENDROCYTE\_DENSITY\_CORR\_UP  
 HALLMARK\_BILE\_ACID\_METABOLISM  
 VALK\_AML\_CLUSTER\_16  
 REACTOME\_DARPP\_32\_EVENTS  
 KEGG\_PROPANOATE\_METABOLISM  
 KEGG\_FATTY\_ACID\_METABOLISM  
 REACTOME\_SYNTHESIS\_OF\_BILE\_ACIDS\_AND\_BILE\_SALTS  
 KEGG\_PRIMARY\_BILE\_ACID\_BIOSYNTHESIS  
 REACTOME\_BILE\_ACID\_AND\_BILE\_SALT\_METABOLISM  
 TURASHVILI\_BREAST\_LOBULAR\_CARCINOMA\_VS\_LOBULAR\_NORMAL\_UP  
 POOLA\_INVASIVE\_BREAST\_CANCER\_DN  
 FLASARL\_NFIC\_TARGETS\_BAGAL\_UP  
 MAGGARWEH\_RESPONSE\_TO\_17BETRADIOL  
 MASRI\_RESISTANCE\_TO\_TAMOXIFEN\_AND\_AROMATASE\_INHIBITORS\_UP  
 BYSTRYKH\_HEMATOPOIESIS\_STEM\_CELL\_IL3RA  
 MATZUK\_STEROIDOGENESIS  
 AZARE\_NEOPLASTIC\_TRANSFORMATION\_BY\_STAT3\_DN  
 DAIRKEE\_CANCER\_PRONE\_RESPONSE\_E2  
 KEGG\_PROXIMAL\_TUBULE\_BICARBONATE\_RECLAMATION  
 KANG\_FLUOROURACIL\_RESISTANCE\_UP  
 GAUSSMANN\_IL11\_AFC\_FUSION\_TARGETS\_D\_UP  
 LEIN\_LOCALIZED\_TO\_PROXIMAL\_DENRITIS  
 SCHAEFFER\_PROSTATE\_DEVELOPMENT\_AND\_CANCER\_BOXES\_DN  
 MONTERO\_THYROID\_CANCER\_POOR\_SURVIVAL\_DN  
 REACTOME\_HORMONE\_SENSITIVE\_LIPASE\_HSL\_MEDIATED\_TRIACYLGLYCEROL\_HY  
 REACTOME\_ADIPONIC\_ACID\_OXIDATION\_ENDPRODUCT\_RECEPTOR\_SIGNALING  
 YANG\_MUC2\_TARGETS\_DUODENUM\_3MO\_DN  
 YANG\_MUC2\_TARGETS\_DUODENUM\_5MO\_DN  
 KEGG\_RETINOL\_METABOLISM  
 KEGG\_DRUG\_METABOLISM\_CYTOCHROME\_P450  
 KEGG\_METABOLISM\_OF\_XENOBIOTICS\_BY\_CYTOCHROME\_P450  
 KEGG\_GLUTATHIONE\_METABOLISM  
 SCHAEFFER\_PROSTATE\_DEVELOPMENT\_48HR\_UP  
 HOSHIDA\_LIVER\_CANCER\_SUBCLASS\_03  
 LEE\_TARGETS\_OF\_PTC1\_AND\_SUFU\_DN  
 REACTOME\_INTEGRATION\_OF\_ENERGY\_METABOLISM  
 CHANG\_LIVER\_CANCER\_SUBCLASS\_PROLIFERATION\_DN  
 LEE\_LIVER\_CANCER\_DENA\_DN  
 LE\_EGR2\_TARGETS\_DN  
 HALLMARK\_XENOBIOTIC\_METABOLISM  
 HALLMARK\_ACIDIPROTESIS  
 KAAS\_HEART\_ATRIUM\_VS\_VENTRICLE\_DN  
 LANDIS\_ERBB2\_BREAST\_PNEOPLASTIC\_DN

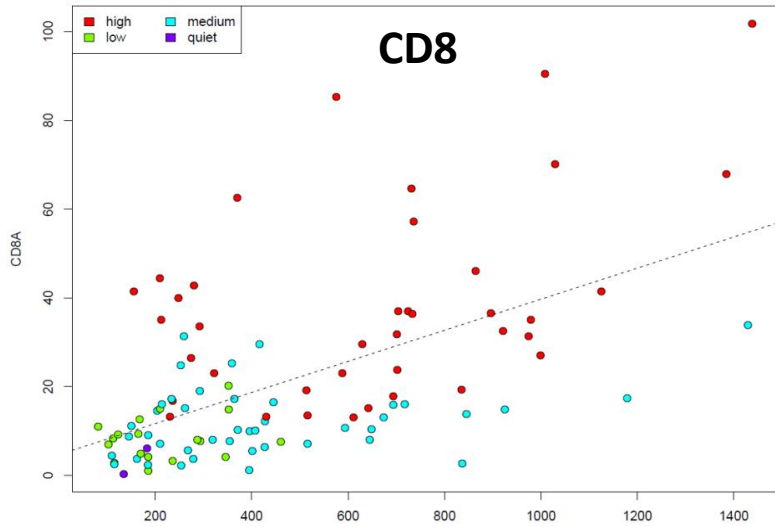
- KEGG\_BILE\_ACID\_METABOLISM
- KEGG\_PROPANOATE\_METABOLISM
- BILE\_ACID\_BILE\_SALT\_METABOLISM
- MASRI RESISTANCE TO TAMOXIFEN AND AROMATASE INHIBITORS UP
- KEGG\_RETINOL\_METABOLISM
- KEGG\_GLUTATHIONE\_METABOLISM
- INTEGRATION\_OF\_ENERGY\_METABOLISM
- KEGG\_XENOBIOTIC\_METABOLISM

# Cytolytic Activity Varies with Chemotherapy Treatment Statuses

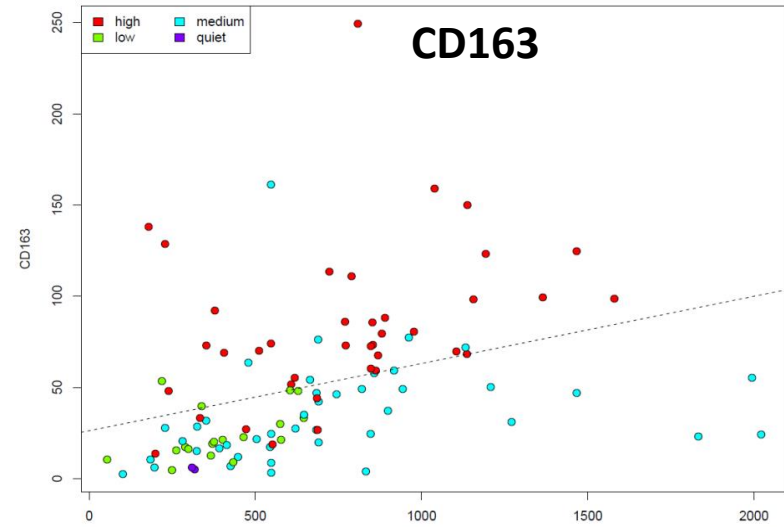


# IHC Cell Density vs. Gene Expression

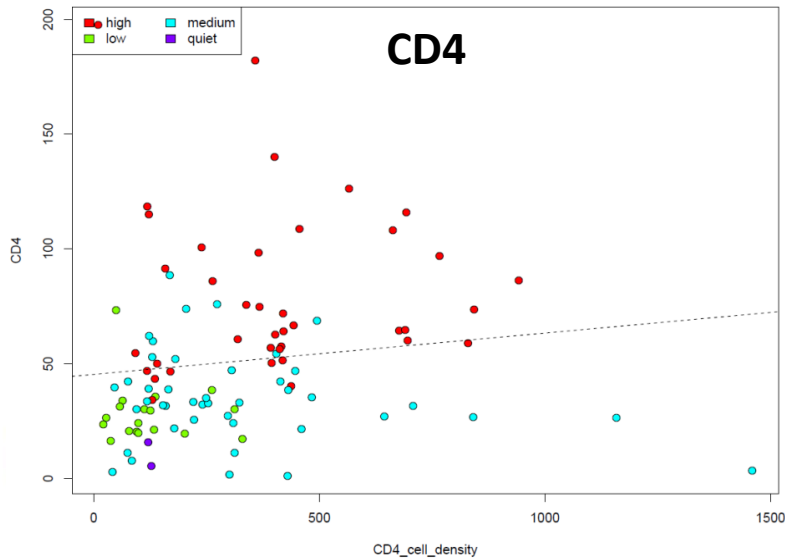
Spearman Corr: 0.538; p: 0



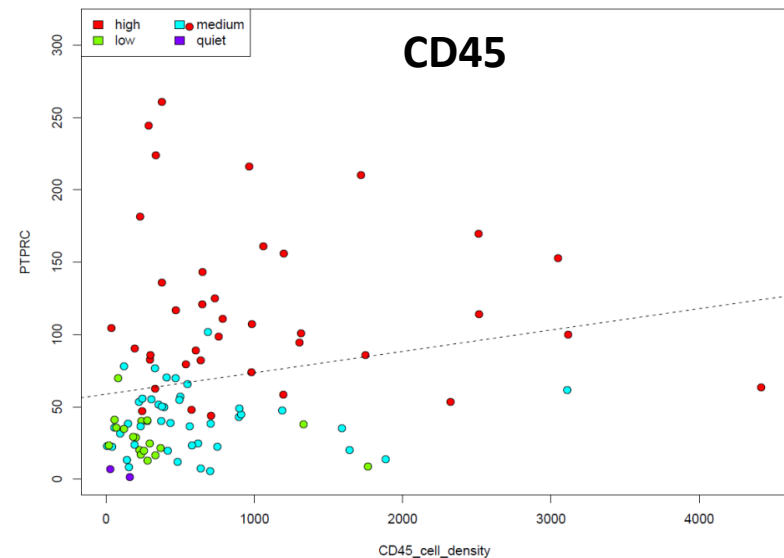
Spearman Corr: 0.537; p: 0



Spearman Corr: 0.309; p: 0.00163

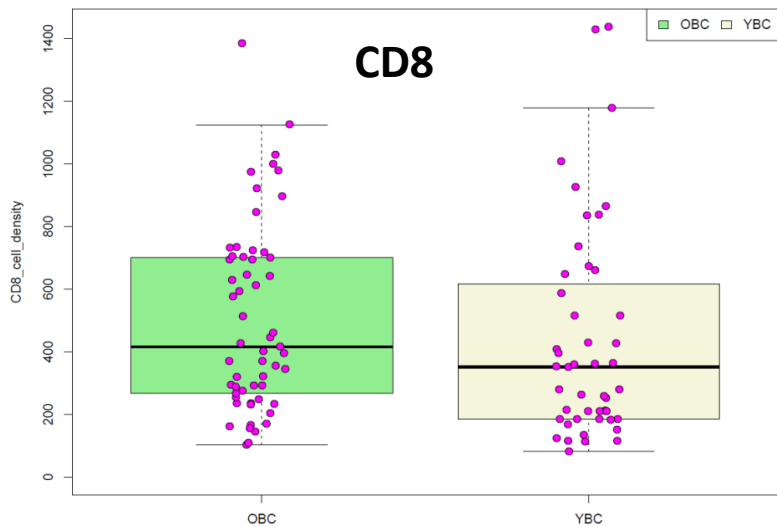


Spearman Corr: 0.349; p: 0.00036

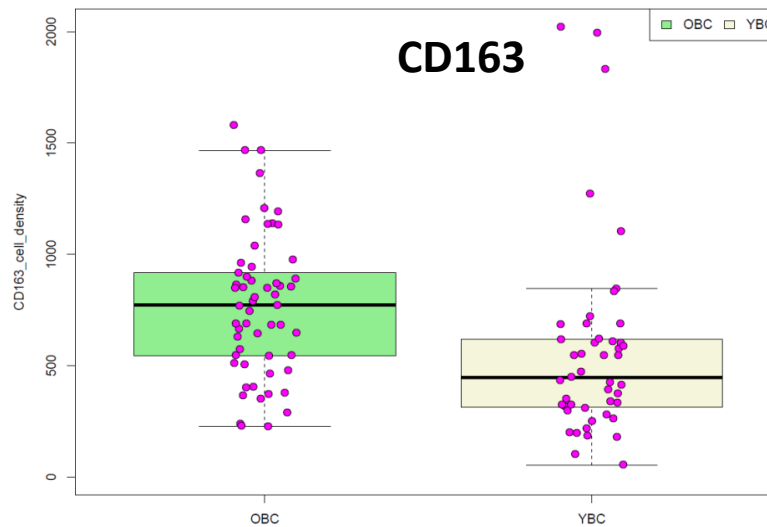


# Comparing IHC Cell Densities in YBC vs. OBC

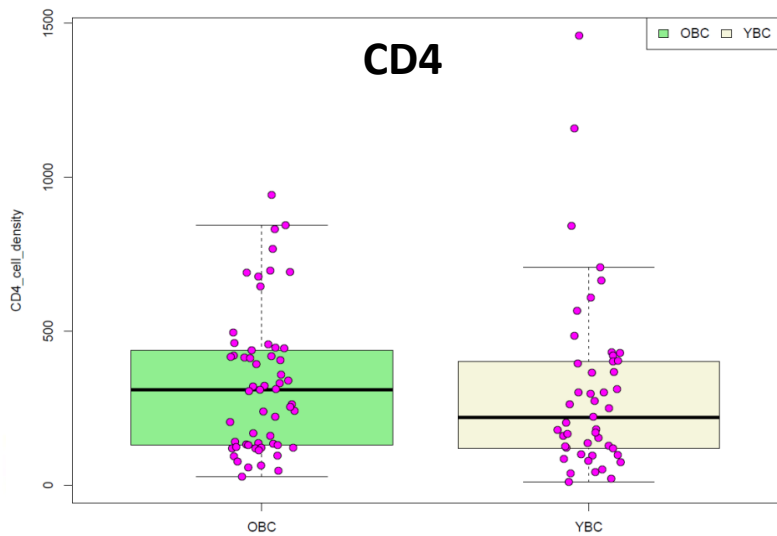
T test: P=0.303929



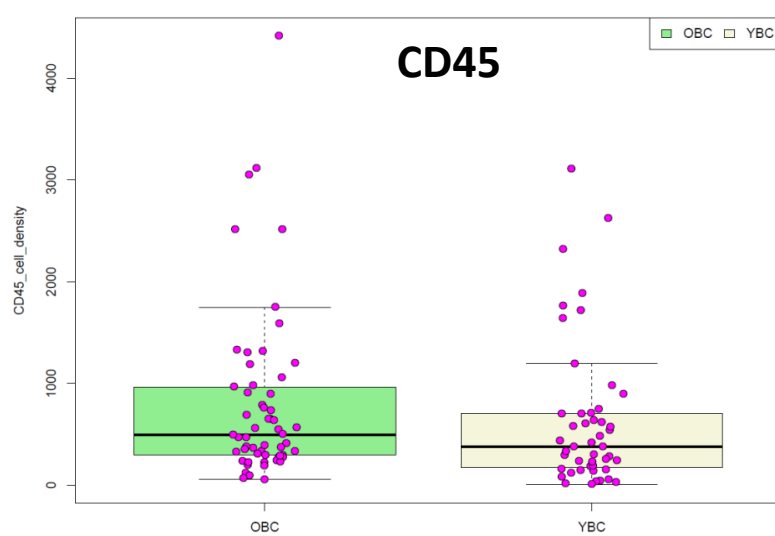
T test: P=0.009938



T test: P=0.685674



T test: P=0.313851



# TIL Score Higher in HR+ OBC vs. YBC

