



American Society of Hematology  
Helping hematologists conquer blood diseases worldwide

# An Immune Senescence and Exhaustion-Related RNA Profile Predicts Clinical Outcomes in Acute Myeloid Leukemia

Jayakumar Vadakekolathu<sup>1</sup>, Tung On Yau<sup>1</sup>, Heidi Altmann<sup>2</sup>, Sarah E. Church<sup>3</sup>, Hanna Knaus<sup>4</sup>, Mark D. Minden<sup>5</sup>, Jan Davidson-Moncada<sup>6</sup>, Sarah K. Tasian<sup>7</sup>, Martin Bornhäuser<sup>2</sup>, Ivana Gojo<sup>8</sup>, Leo Luznik<sup>8</sup>, Sergio Rutella<sup>1,9</sup>

<sup>1</sup>John van Geest Cancer Research Centre, School of Science and Technology, Nottingham Trent University, Nottingham, UK; <sup>2</sup>Department of Internal Medicine I, University Hospital Carl Gustav Carus, Technische Universität Dresden, Dresden, Germany; <sup>3</sup>NanoString Technologies, Inc., Seattle, WA; <sup>4</sup>Internal Medicine I, Medizinische Universität Wien, Austria; <sup>5</sup>Princess Margaret Cancer Centre, Toronto, Canada; <sup>6</sup>MacroGenics, Inc., Rockville, MD; <sup>7</sup>Division of Oncology and Centre for Childhood Cancer Research, Children's Hospital of Philadelphia and University of Pennsylvania School of Medicine, PA; <sup>8</sup>Department of Oncology, Johns Hopkins University, Baltimore, MD; <sup>9</sup>Centre for Health, Ageing and Understanding Disease (CHAUD), School of Science and Technology, Nottingham Trent University, Nottingham, UK

## Background

- Chemotherapy refractoriness and disease relapse continue to be significant obstacles to therapeutic success in AML
- We have recently identified bone marrow (BM) IFN- $\gamma$ -related transcriptional profiles that stratify patients with AML into an **immune-infiltrated** and an **immune-depleted** subtype, and that refine the accuracy of survival prediction in response to conventional “3+7” chemotherapy beyond that afforded by cytogenetic and molecular prognosticators (Vadakekolathu J, *et al. Sci. Transl. Med.* 2020; 12: eaaz0463)
- CD8<sup>+</sup> T cells in AML exhibit features of **immune exhaustion and senescence (IES)**, including the upregulation of natural killer (NK) cell-associated transcripts, which persist only in chemotherapy non-responders (Knaus HA, *et al. JCI Insight* 2018; 3: e120974)



- Senescent and exhausted T cells with **defective effector functions** for tumor immunity are induced by DNA damage, MAPK and STAT1/STAT3 signaling in the tumor microenvironment
- Senescent T cells highly express Tim-3, CD57 and NK receptors, including KLRG1, and remain **metabolically active**, producing high amounts of TNF- $\alpha$ , IFN- $\gamma$  and suppressive cytokines (Liu X, et al. *J. Clin. Invest.* 2020; 130: 1073-83)
- Exhausted T cells are characterized by the progressive loss of T-cell function, express high levels of **inhibitory receptors** (PD1, CTLA4, TIM3, LAG3), co-stimulatory receptors, T cell factor 1 (TCF1) and GZMB, and have impaired cytokine production and replicative capacity (Ghorani E, et al. *Nat. Cancer* 2020; 1: 546-61. Akbar AN, et al, *Nat. Rev. Immunol.* 2011; 11: 289-95)

- Are senescence and exhaustion intertwined or unrelated molecular programs that compromise immunity?
- Subpopulations of TCF1<sup>+</sup> precursor exhausted T cells serve as a **predictive 'biomarker'** for a favorable clinical outcome of checkpoint therapy in melanoma (Siddiqui I, *et al.* Immunity 2019; 50: 195-211)
  - Microenvironmental Immune Senescence and Exhaustion in Acute Myeloid Leukemia Associate with Response to Flotetuzumab, an Investigational CD123 × CD3 Bispecific DART Molecule (Vadakekolathu J, *et al.* Poster #2878; December 7<sup>th</sup>, ASH 2020)
- The aim of the current study was **to determine whether IES correlate with immune infiltration and with clinical outcomes in treatment-naïve AML**

# Patients and Methods

## Wet-laboratory cohorts

## *In silico* cohorts

	PMCC*	CHOP^	SAL^^		Beat AML Master Trial	TCGA
Nr of patients	290	39	38		267	147
Age (y)	52 (18-81)	10 (0.1-20)	52.5 (23-75)		Adult	Adult
Disease status	Onset	Onset	Onset/CR/Relapse		Onset	Onset

- The wet-laboratory AML cohorts used in this study included a total of 367 BM samples from children and adults with AML treated with curative intent. BMs were collected at time of diagnosis, complete remission (CR) and relapse (PMCC, SAL and CHOP series)
- BM RNAs were profiled on the nCounter platform using the PanCancer Immune Profiling Panel (NanoString Technologies, Seattle, WA)
- Immune signature scores and biological activity scores were calculated as pre-defined linear combinations (weighted averages) of biologically relevant gene sets (Vadakekolathu J, et al. *Sci. Transl. Med.* 2020)

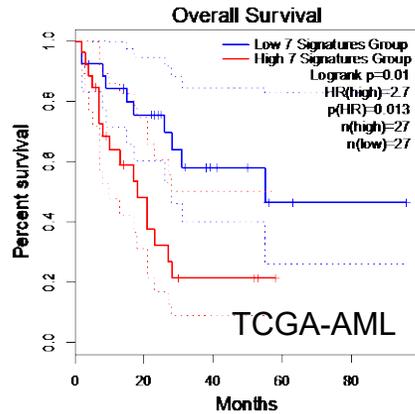
\*PMCC = Princess Margaret Cancer Centre, Toronto, Canada

^CHOP = Children's Hospital of Philadelphia, Philadelphia, PA

^^SAL = Studienallianz Leukämie, Dresden, Germany



# Identification of an Immune Senescence and Exhaustion (IES) Gene Signature



Gene name	Full Name
<i>B3GAT1 (CD57)</i>	Beta-1,3-Glucuronyltransferase 1
<i>KIR2DL1 (CD158a)</i>	Killer Cell Immunoglobulin-like Receptor 2DL1
<i>KLRC1</i>	Killer Cell Lectin Like Receptor C1
<i>KLRC3</i>	Killer Cell Lectin Like Receptor C3
<i>KLRD1 (CD94)</i>	Killer Cell Lectin Like Receptor D1
<i>KLRF1</i>	Killer Cell Lectin Like Receptor F1
<i>KLRG1</i>	Killer Cell Lectin Like Receptor G1

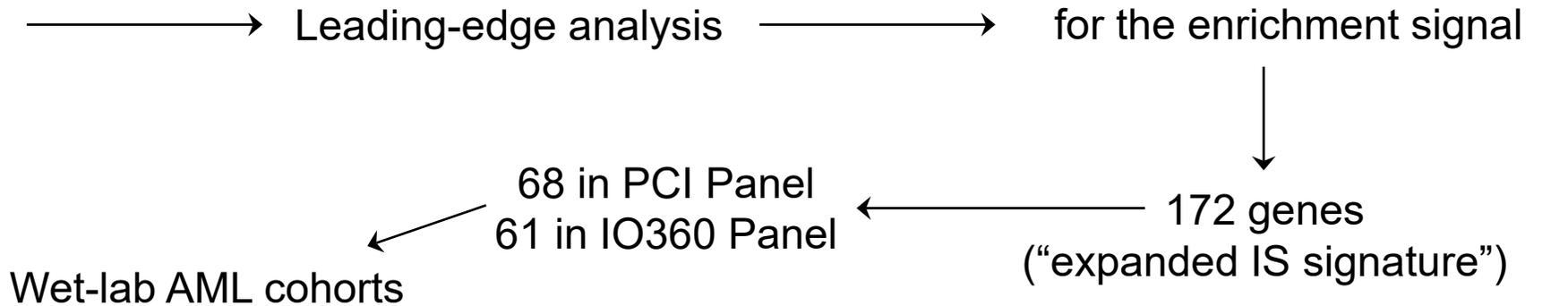
7-gene immune senescence (IS) signature  
(knowledge, prior work)

Top and bottom quartiles ← TCGA-AML and Beat-AML

“Immunologic signature” gene sets  
(C7; n=4,872) (MSigDB)



GSEA



# Identification of an Immune Senescence and Exhaustion (IES) Gene Signature

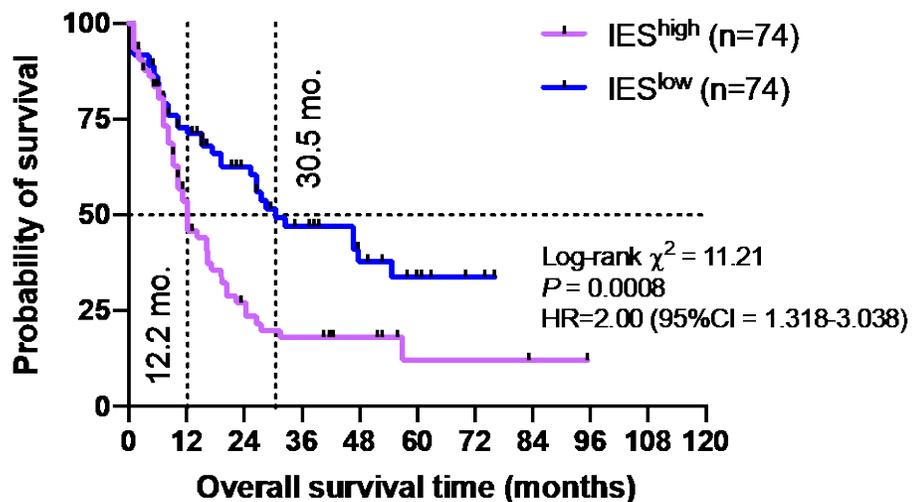
7-gene signature



Expanded, 68-gene IES signature

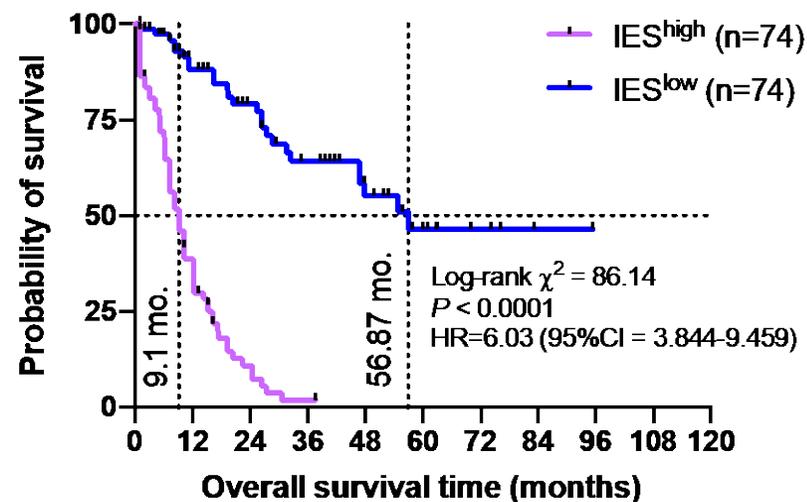
Prognostic Index estimated by  $\beta$  coefficients multiplied by gene expression values  
(Wagner S, et al. Blood Advances 2019)

Prognostic Index estimated by  $\beta$  coefficients multiplied by gene expression values  
(Wagner S, et al. Blood Advances 2019)



N. at risk

<b>IES<sup>high</sup></b>	74	36	16	11	7	3	2	1	1	1	1
<b>IES<sup>low</sup></b>	75	47	31	20	12	6	2	2	1	1	1



N. at risk

<b>IES<sup>high</sup></b>	74	26	6	1	1	1	1	1	1	1	1
<b>IES<sup>low</sup></b>	75	56	41	29	19	9	5	2	1	1	1

# IES Gene Signature

## Senescence genes

ABCB1  
CCL4  
DOCK9  
DPP4  
ETS1  
GZMA  
GZMK  
GZMM  
IFNG  
KLRB1  
KLRC1  
KLRD1  
KLRG1  
KLRK1  
LTB  
PRF1  
SH2D1A  
TNFSF8 (CD153)

## T-cell genes

CD2  
CD5  
CD6  
CD7  
CD8A  
CD8B

## Exhaustion genes

EOMES  
GZMB  
ICOS  
SLAMF6  
TCF7

## Cytokines, chemokines and their receptors

CCL5  
CCR5  
CCR7  
CCR9  
FLT3LG  
IL12RB2  
IL18R1  
IL18RAP  
IL2RB  
IL6ST  
IL7R

## Transcription factors

GATA3  
STAT4  
TBX21

## T/NK-cell trafficking

CXCR3  
CXCR6

## Immune checkpoints

SLAMF3

## TCR signaling

CD247  
CD3E  
CD3G  
ITK  
LCK  
CD3D  
ZAP70

## Type I/II IFN response

IL10RA  
IFIH1  
ISG20

## Inhibitory receptors

CD48  
CTLA4

## Costimulatory receptors

CD27  
CD28  
SLAMF1  
TNFSF14 (CD258)

## Surface molecules

CD40L  
HLA-DOB

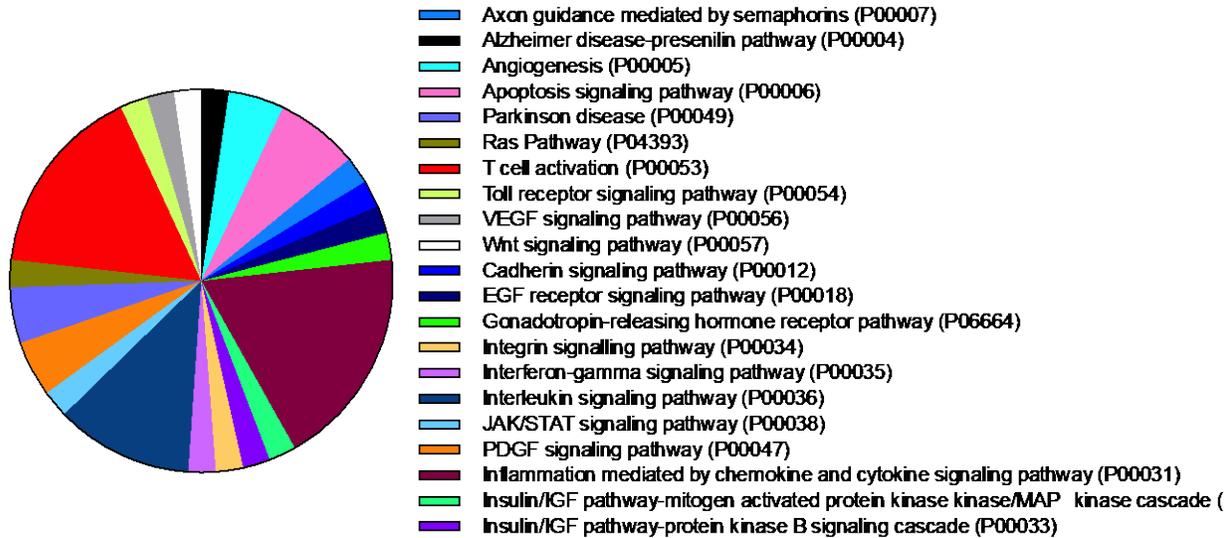
## Unclassifiable

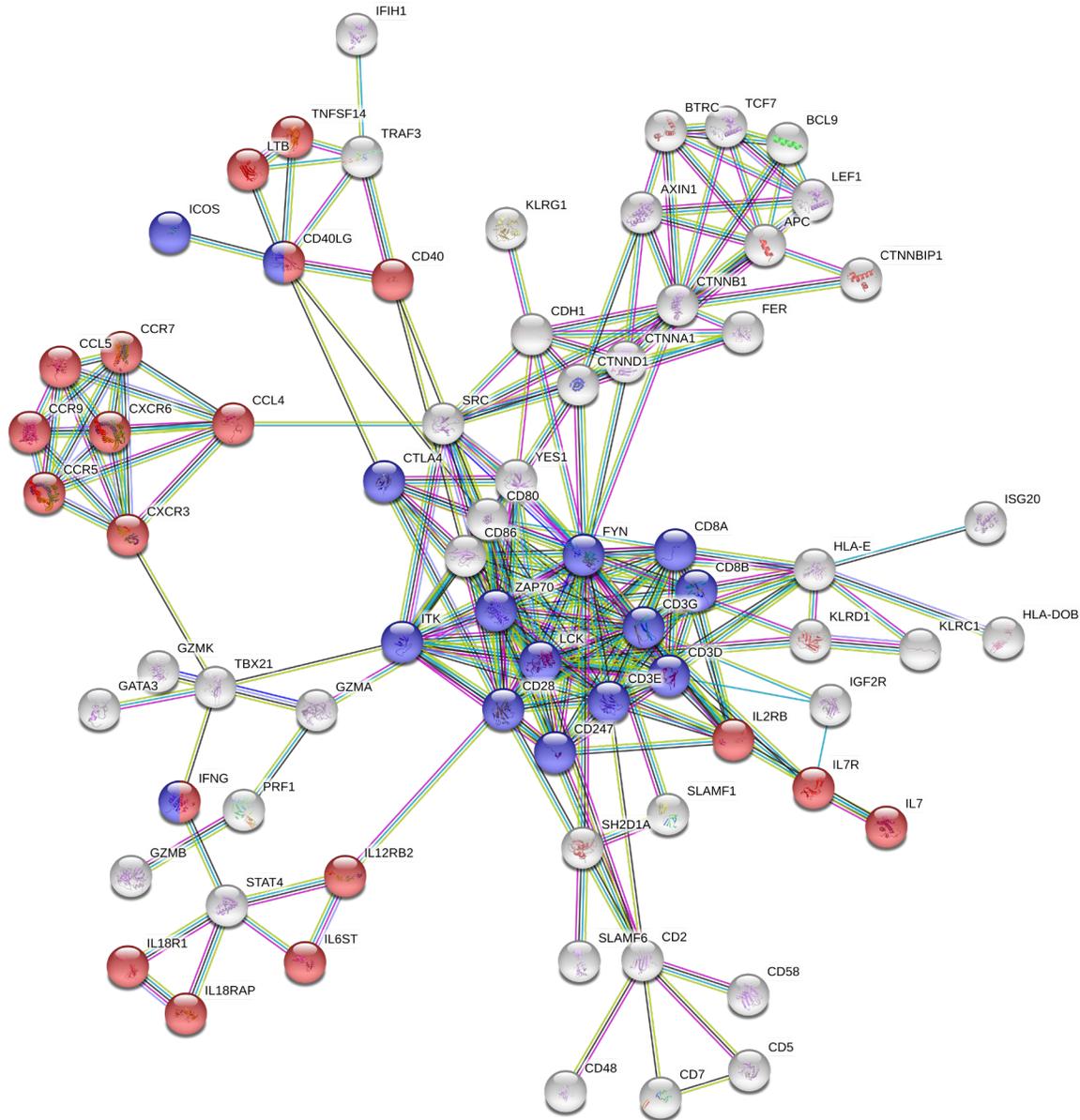
F2RL1  
FYN  
IGF2R

## Metabolic reprogramming

TLR1

Manually annotated (Knaus HA, et al. JCI Insight 2018; Kallies A, et al. Nat. Rev. Immunol. 2020; SeneQuest Portal, Gene-to-Senescence Associations)

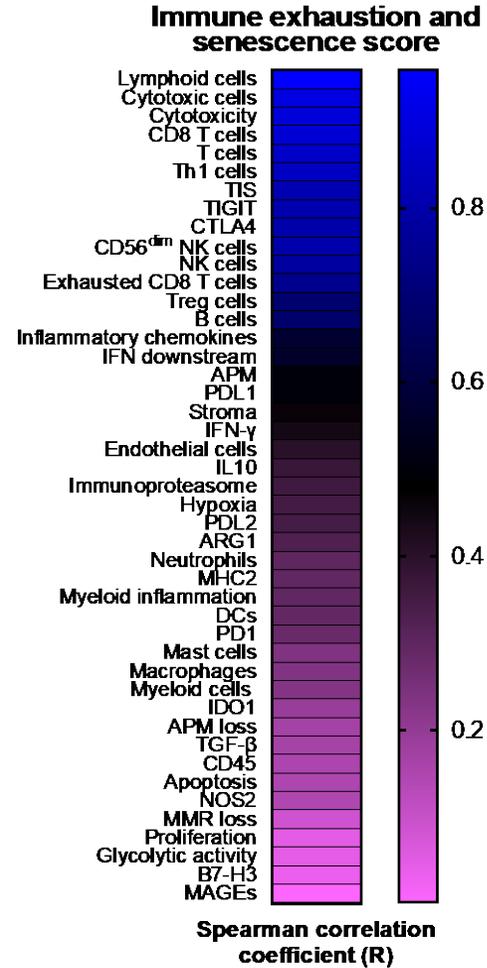




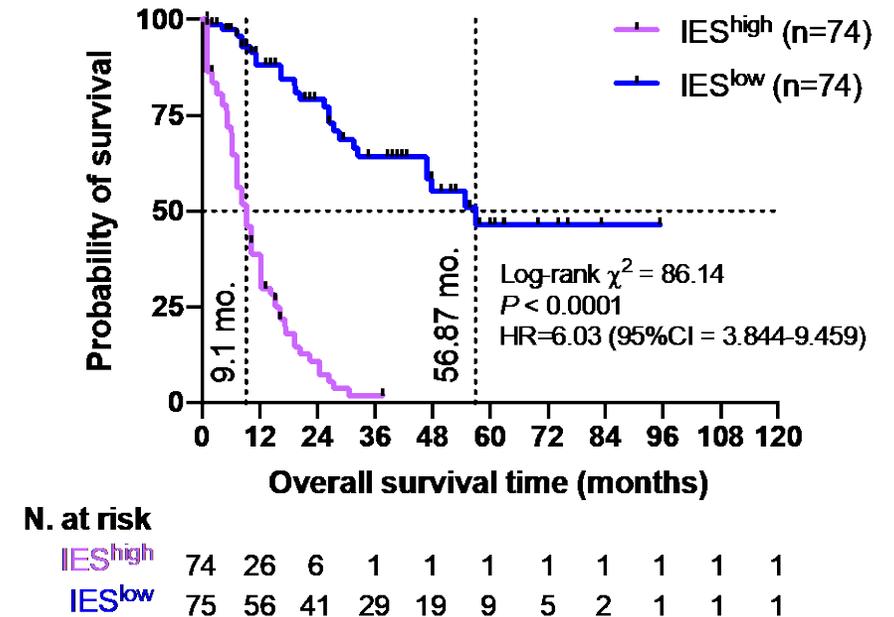
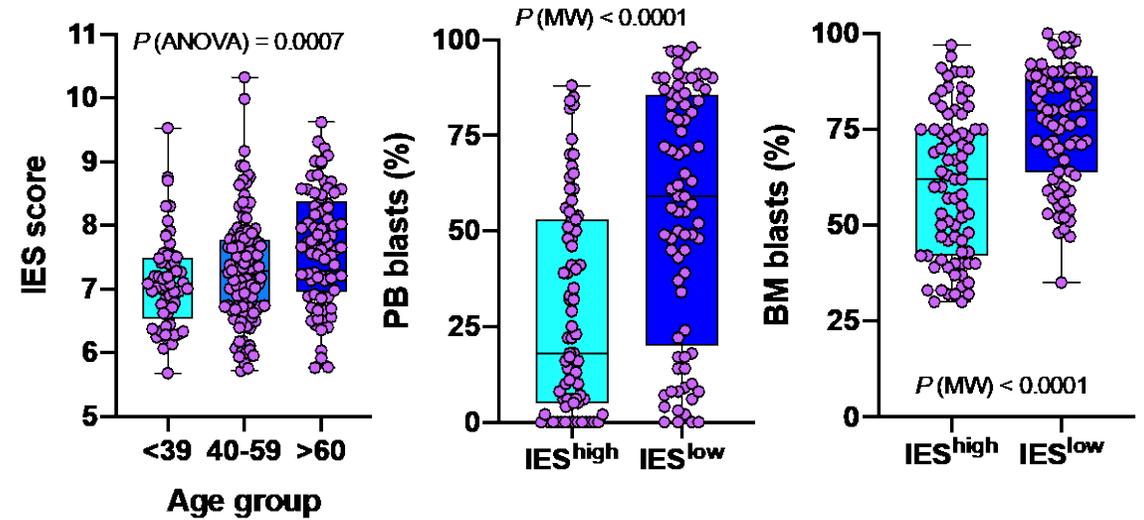
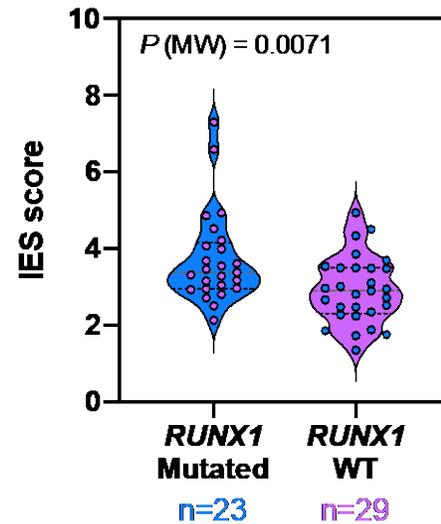
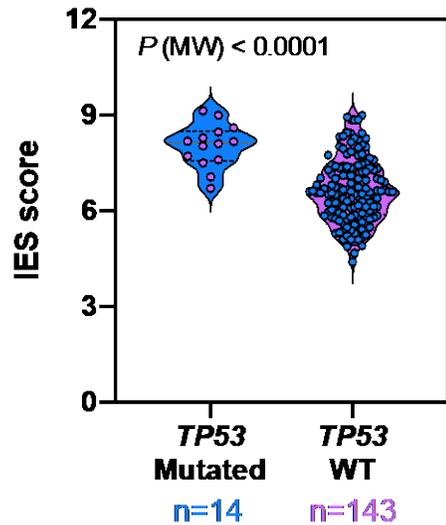
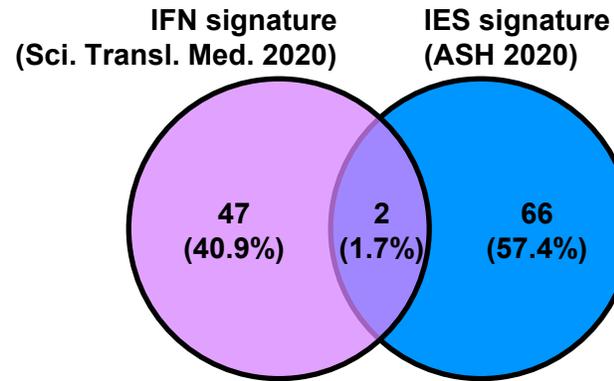
- Cytokine-cytokine receptor interaction
- T cell receptor signaling pathway

# The IES Score Correlates with Immune Infiltration and with AML Prognosis

## A. TCGA cohort



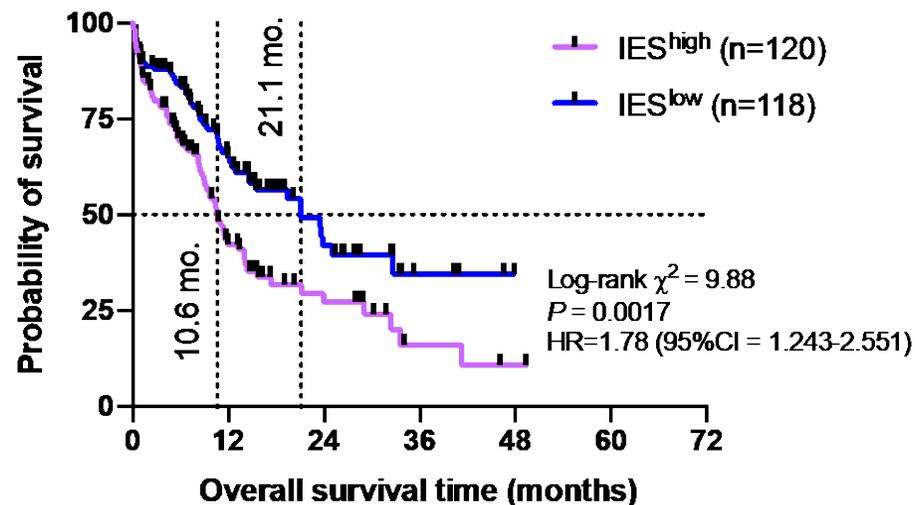
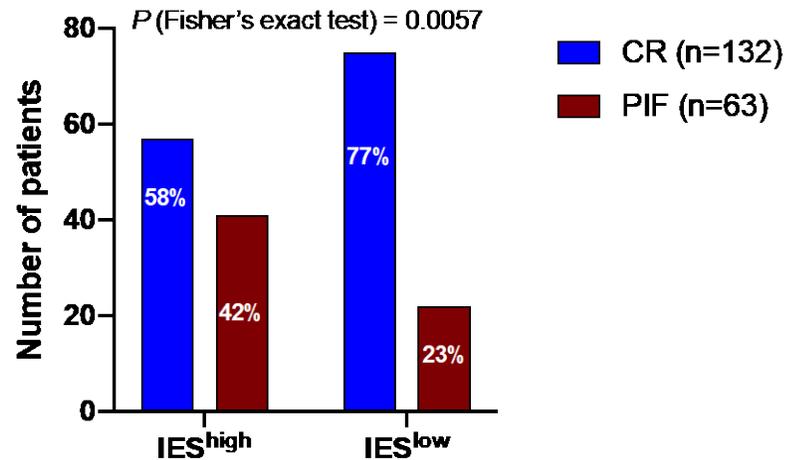
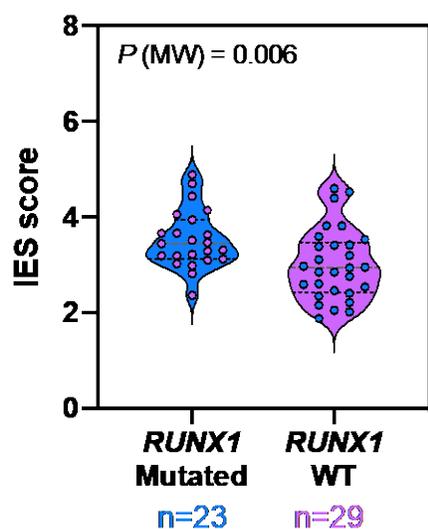
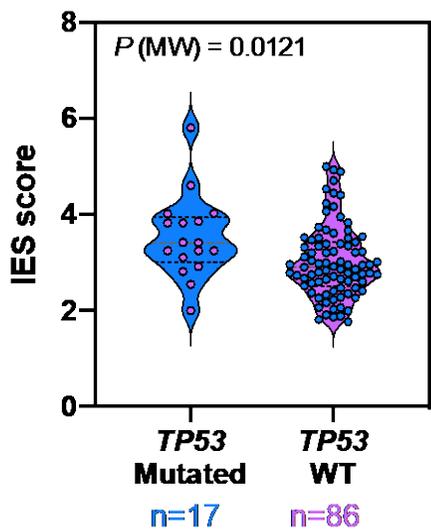
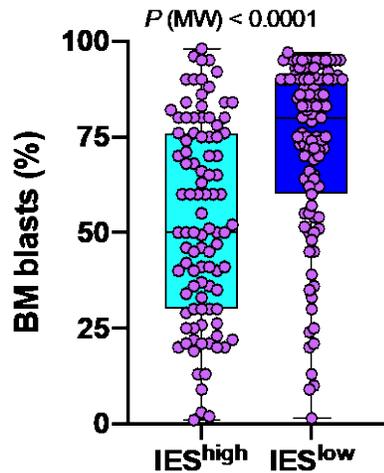
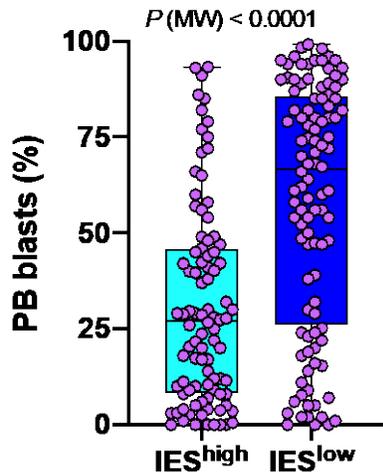
## B. Signature overlap



*TP53* Abnormalities Correlate with Immune Infiltration  
and Associate with response to Flotetuzumab  
Immunotherapy in Acute Myeloid Leukemia (Lai C, *et*  
*al.* Poster #2001; December 6<sup>th</sup>, ASH 2020)

# Validation Series □ Beat AML Master Trial

## A. Beat AML

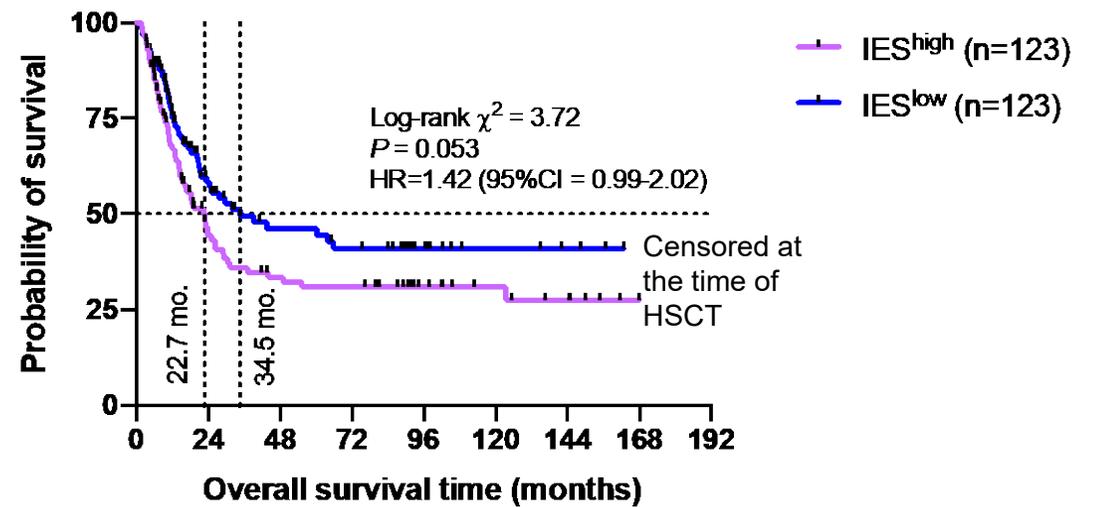
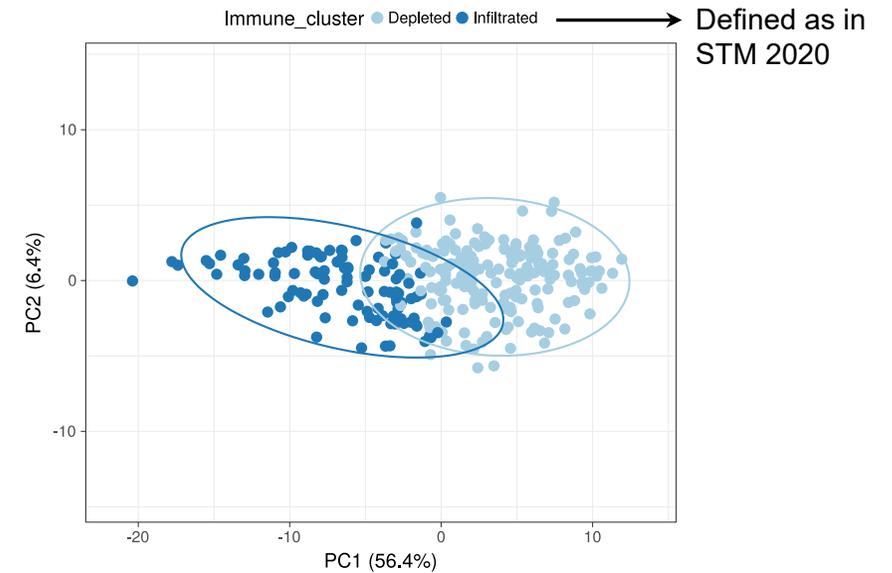
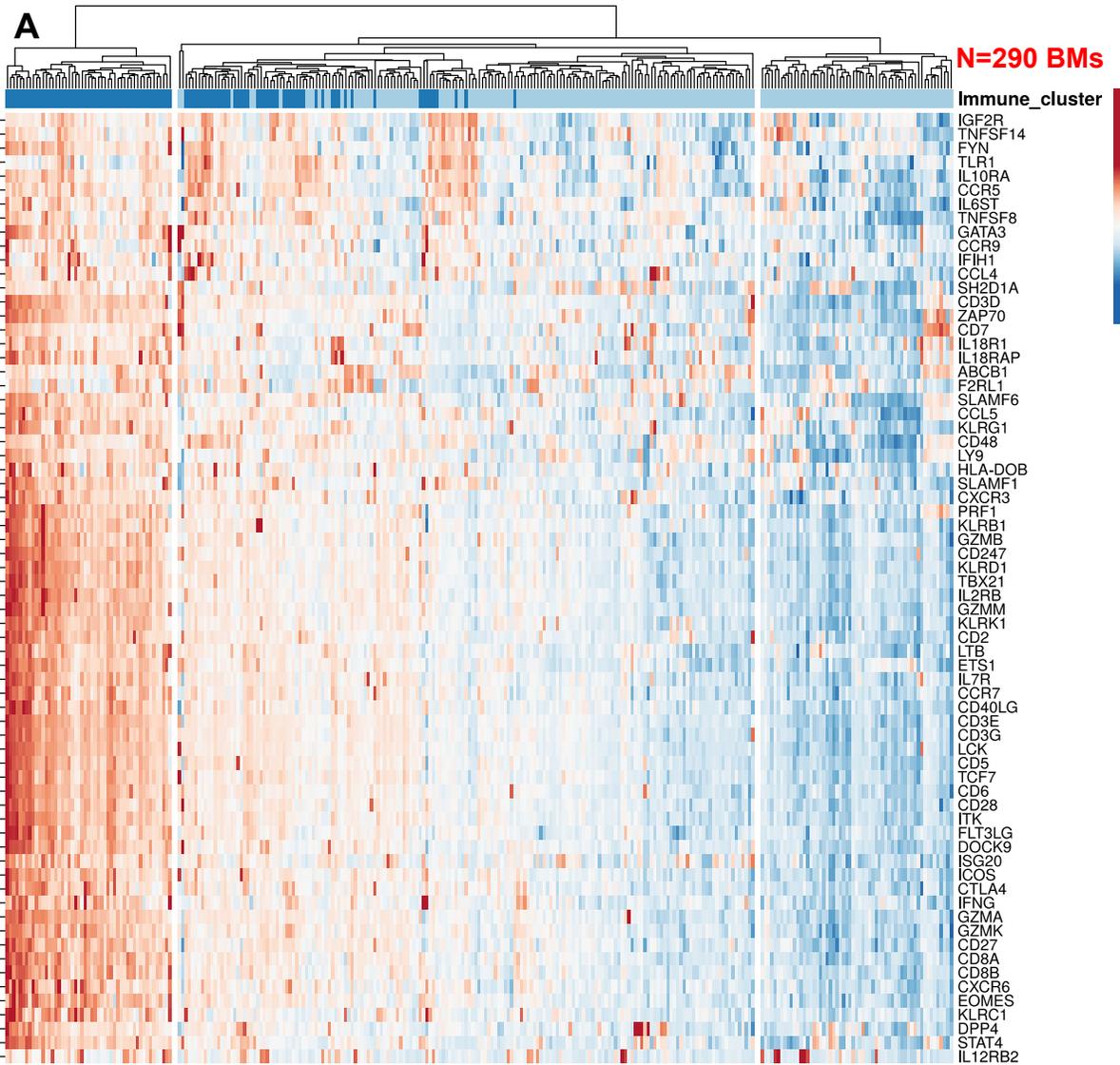


N. at risk

	0	12	24	36	48	60	72
IES <sup>high</sup>	120	34	13	4	1	1	1
IES <sup>low</sup>	118	52	18	5	1	1	1

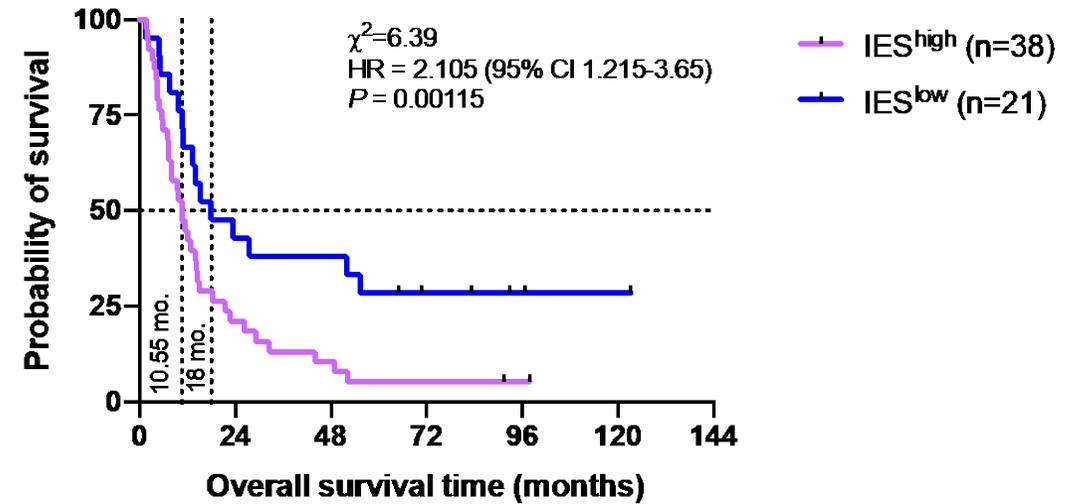
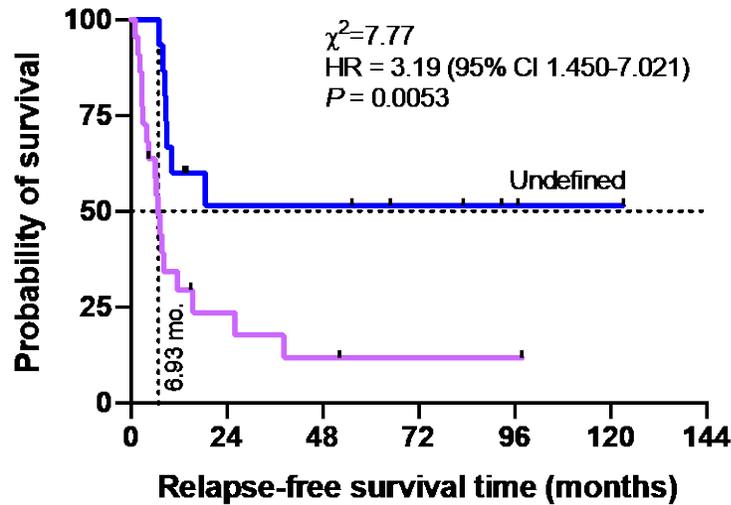


# The IES Score Correlates with Immune Infiltration □ PMCC Cohort



# The IES Score Predicts Survival in ELN Adverse Risk

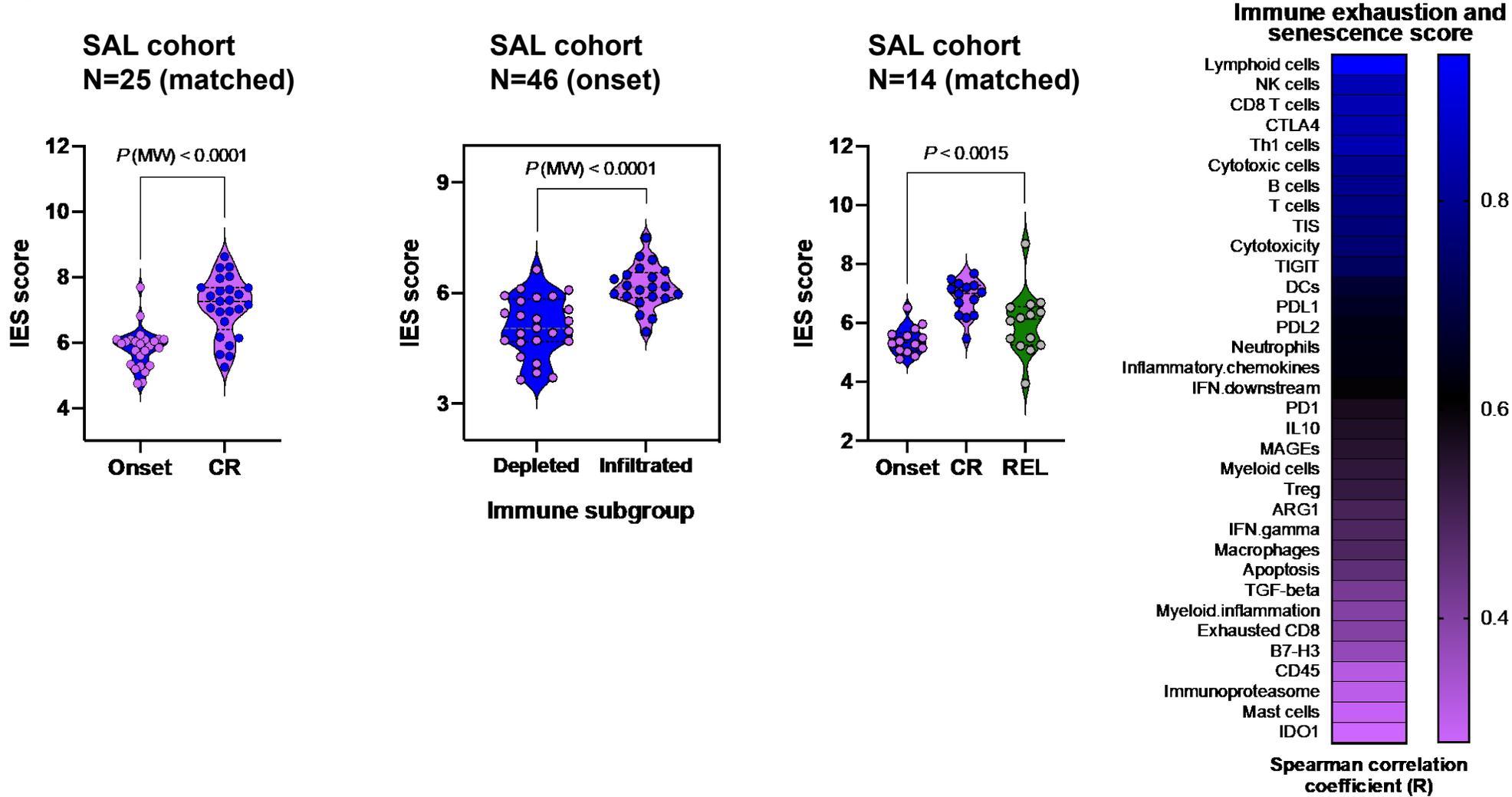
## ELN Adverse Risk



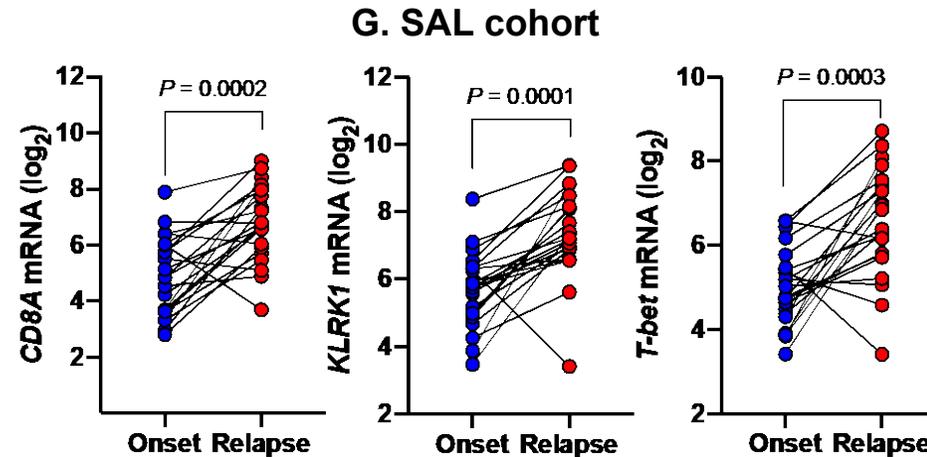
The above findings were validated in independent wet-lab cohorts comprising adults (PMCC series; n=290; SAL series; n=46) and children (CHOP series; n=46) with AML. In the ELN adverse risk subgroup (PMCC cohort), both relapse-free survival (RFS) and OS were significantly shorter in patients with higher than median compared with lower than median IES scores (median RFS time of 6.93 *versus* not reached [log-rank  $P=0.0053$ ], and median OS of 10.5 months *versus* 18 months [log-rank  $P=0.0011$ ], respectively). In contrast, the IES signature score failed to stratify survival in patients with ELN favorable and intermediate risk.

# The IES Score Correlates with Immune Infiltration □ SAL Cohort

A



# The IES Score Increases in Remissional BM Samples



Finally, a pairwise comparison of matched diagnostic, CR and relapse BM samples (SAL series;  $n=22$  patients and CHOP series;  $n=40$  patients) showed significantly higher IES signature scores at time of CR, congruent with chemotherapy-induced acceleration of IES, and at time of post-chemotherapy relapse compared with disease onset (**Fig. 1F**). Notably, *CD8A*, *TBX21*, a Th1 transcription factor, and markers of NK cells and cytotoxic T lymphocytes, including *KLRK1*, *KLRD1*, *KLRC2*, *GNLY*, and granzymes, were among the top ranked immune genes associated with AML relapse (**Fig. 1G**).

## Conclusions

- Patients with immune-infiltrated AML exhibit features of IES, which correlate with adverse-risk molecular lesions (*TP53* and *RUNX1* mutational status), and with chemotherapy refractoriness and shorter survival
- Molecular circuits reflective of IES might also underpin AML relapse after conventional induction chemotherapy
- IES T cells could be functionally rejuvenated by novel immunotherapies being investigated in AML
  - Microenvironmental Immune Senescence and Exhaustion in Acute Myeloid Leukemia Associate with Response to Flotetuzumab, an Investigational CD123 × CD3 Bispecific DART Molecule (Vadakekolathu J, *et al.* Poster #2878; December 7<sup>th</sup>, ASH 2020)



# Acknowledgements

## Co-authors and Collaborators



Nottingham Trent  
University

Stephen Reeder  
Payton Tau  
Jayakumar Vadakekolathu

*PhD Students*  
Jenny Ashforth  
Melissa Courtney



The Princess Margaret  
Hospital Foundation  
University Health Network

Mark D. Minden  
Toronto, Canada



The Children's Hospital  
of Philadelphia®

Tasleema Patel  
Sarah K. Tasian  
Philadelphia, PA



JOHNS HOPKINS  
UNIVERSITY

Ivana Gojo  
Leo Luznik  
Sidney Kimmel Comprehensive  
Cancer Centre  
Baltimore, MD

Universitätsklinikum  
Carl Gustav Carus  
DIE DRESDNER.



Heidi Altmann  
Martin Bornhäuser  
Jörn Meinel  
Marc Schmitz  
SAL Studienallianz Leukämie  
Dresden, Germany

### NANOSTRING

Joseph M. Beechem  
Alessandra Cesano

Michael Bailey  
James Gowen-MacDonald  
Thomas Smith

Sarah E. Church  
Tressa Hood  
Sarah E. Warren  
Seattle, WA

### MACROGENICS

Patrick Kaminker  
Jan K. Davidson-Moncada  
John Muth  
Rockville, MD

## Funding Sources



الصدوق القطري لرعاية البحث العلمي

Qatar National Research Fund

Member of Qatar Foundation

National Priorities Research Programme,  
2016-2020



Nottingham Trent  
University



HIGHER EDUCATION  
FUNDING COUNCIL FOR ENGLAND

Mainstream QR funding, 2017-2019



John and Lucille van Geest Foundation

Please email your questions to [sergio.rutella@ntu.ac.uk](mailto:sergio.rutella@ntu.ac.uk)



American Society of Hematology

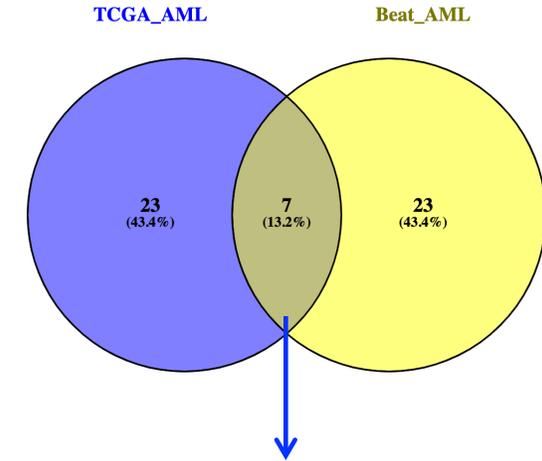
# Shared genes associated with survival

## Beat AML (ranked by $\chi^2$ )

ENO2	20.070838252656436
MCOLN2	14.803805819848602
RASA3	14.003750260434753
ETS1	14.003750260434753
SH3BP5	12.470310438224876
KCNA3	12.470310438224876
NCKAP1	10.336828946454615
STAT4	10.336828946454615
KLF12	10.336828946454615
SESN3	9.670115980276409
BACH2	9.025626779637474
DLG3	8.403361344537815
FYN	8.403361344537815
CD72	8.403361344537815
SLC9A9	7.803319674977429
INPP4B	7.225501770956317
LRIG1	7.225501770956317
WLS	6.6699076324744775
PTCH1	6.6699076324744775
TIAM1	6.6699076324744775
ISG20	6.6699076324744775
C1orf21	6.6699076324744775
GBP1	6.136537259531912
ARNTL	6.136537259531912
ARL4C	6.136537259531912
SYNE1	5.625390652128621
IL12RB2	5.625390652128621
TGFBR3	5.136467810264602
KLRD1	5.136467810264602
DOCK9	5.136467810264602

## TCGA (ranked by $\chi^2$ )

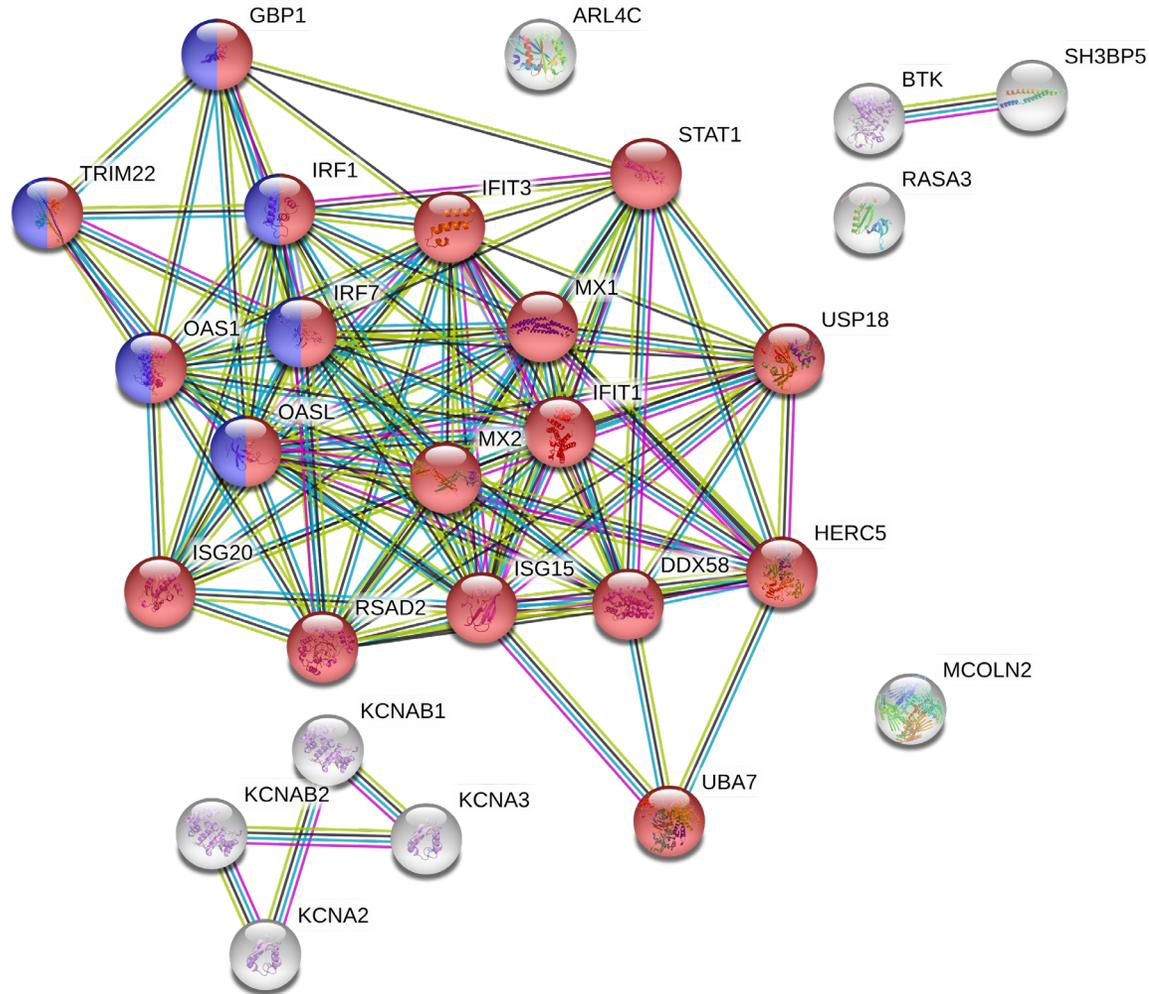
HOPX	6.05901447115447
MCOLN2	6.05901447115447
HS3ST3B1	5.439109698189653
KLRG1	4.155618137008221
USP18	4.155618137008221
MDFIC	3.1266217951199358
CD7	3.0854720706073646
DTX1	3.0854720706073646
EVL	2.610034484315928
CXCR3	2.610034484315928
HLA-DOB	2.610034484315928
RASA3	2.610034484315928
SH3BP5	2.610034484315928
ST8SIA1	2.208919631221047
LAX1	2.174353862630487
TRAT1	1.809703996180595
ABLIM1	1.7784302055510408
ARL4C	1.7784302055510408
GZMB	1.7784302055510408
GBP1	1.7784302055510408
LTB	1.7784302055510408
IGF2R	1.7784302055510408
TNFSF14	1.7784302055510408
CCR9	1.4222635130775894
CHN1	1.4222635130775894
CCL5	1.4222635130775894
IL18RAP	1.4222635130775894
ISG20	1.4222635130775894
KCNA3	1.4222635130775894
NCALD	1.4222635130775894



**MCOLN2**  
**RASA3**  
**SH3BP5**  
**ARL4C**  
**GBP1**  
**ISG20**  
**KCNA3**

# Shared genes associated with survival – pathway analysis

## Network interaction analysis



### Reactome Pathways

*Pathway description*

HSA-913531

**Interferon signaling**

HSA-909733

Interferon alpha/beta signaling

HSA-1169410

Antiviral mechanism by IFN-stimulated genes

HSA-1169408

ISG15 antiviral mechanism

HSA-168256

Immune System

HSA-877300

**Interferon gamma signaling**

*count in gene set*

18 of 189

12 of 66

11 of 77

9 of 69

20 of 1925

6 of 86

*FDR*

6.17e-28

6.11e-21

2.73e-18

1.56e-14

6.65e-14

4.01e-08

### Molecular Function (GO)

*GO-term description*

GO:0005261

Cation channel activity

*count in gene set*

6 of 316

*FDR*

0.00093

GO:0005249

Voltage-gated potassium channel activity

4 of 95

0.0011

GO:0046873

Metal ion transmembrane transporter activity

6 of 458

0.0016

GO:0022839

Ion gated channel activity

5 of 329

0.0018

GO:0003725

Double-stranded RNA binding

3 of 70

0.0023