

Towards modeling context-specific EMT regulatory networks using temporal single cell RNA-Seq data

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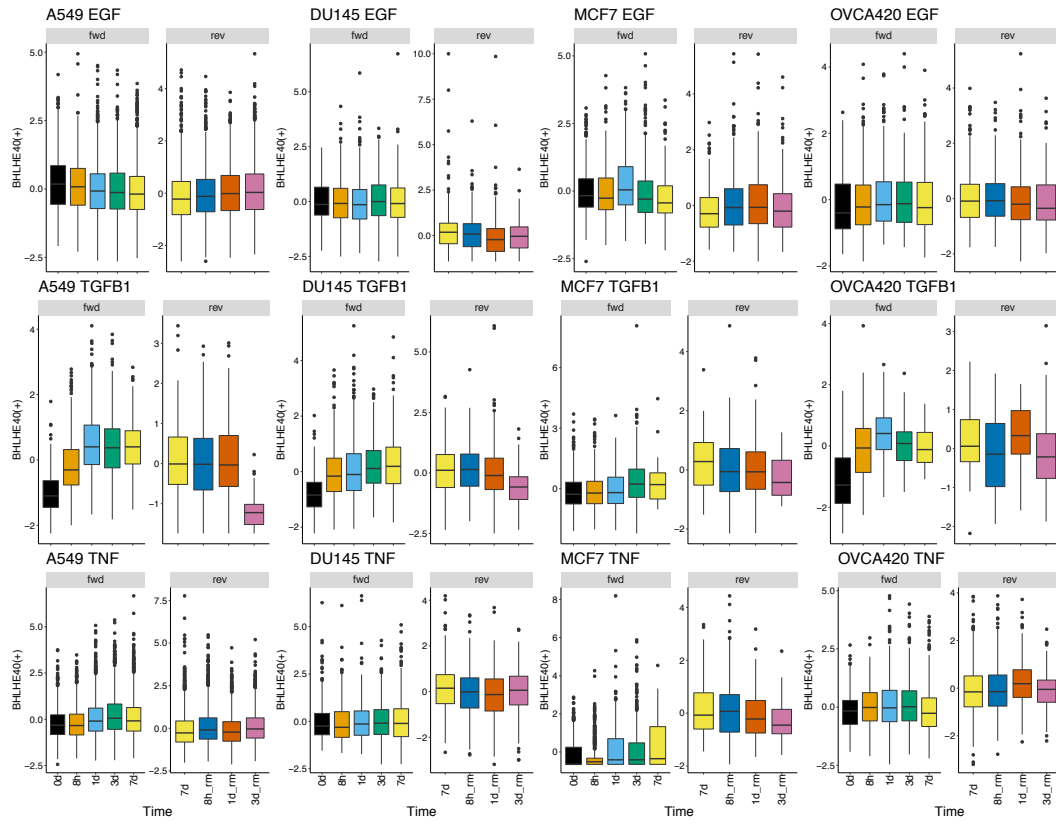
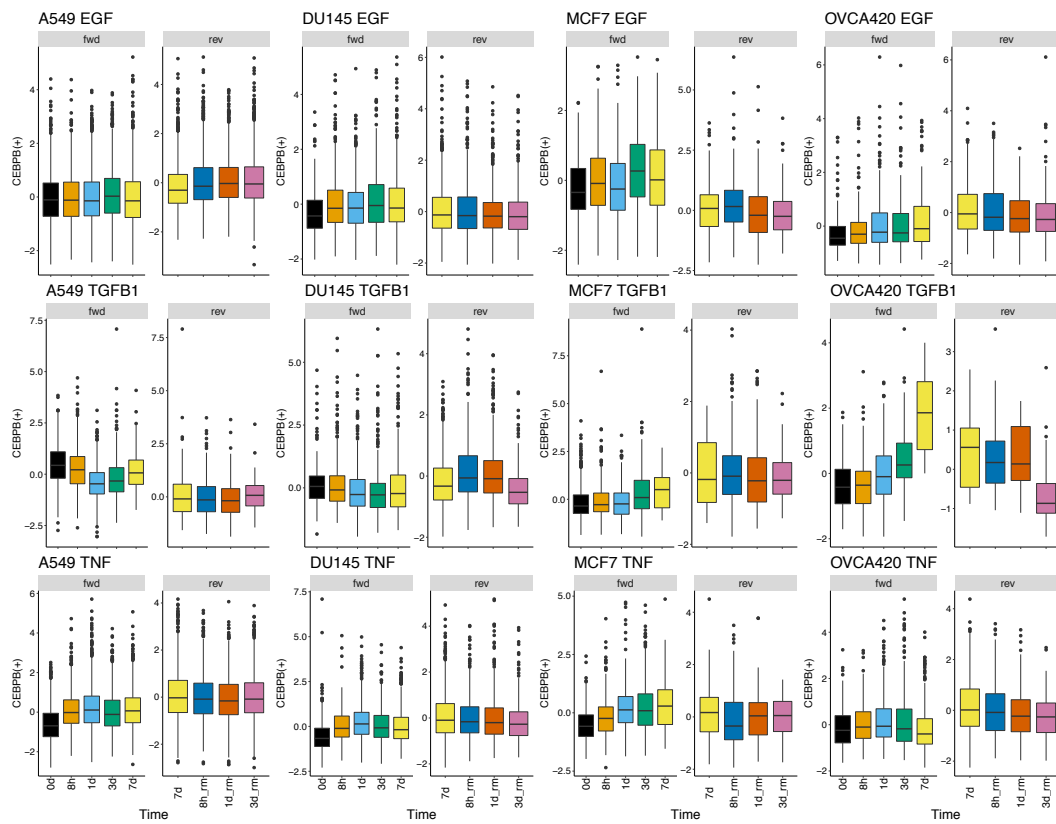
* equal contributions

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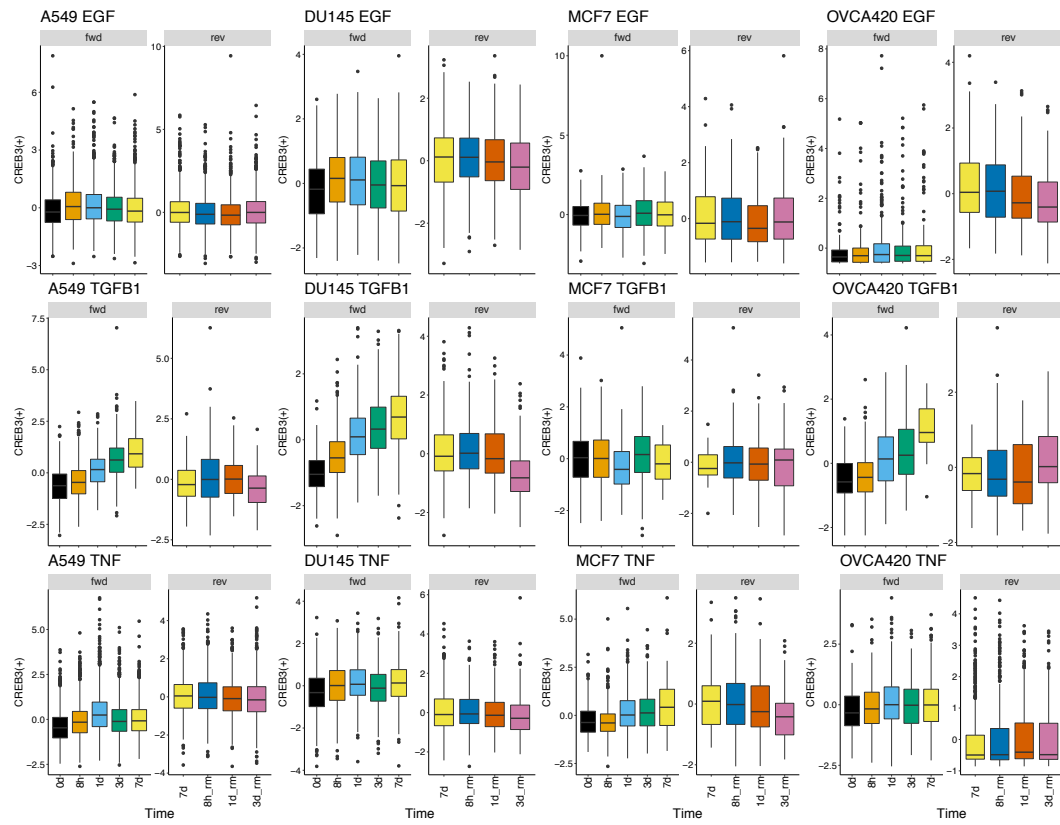
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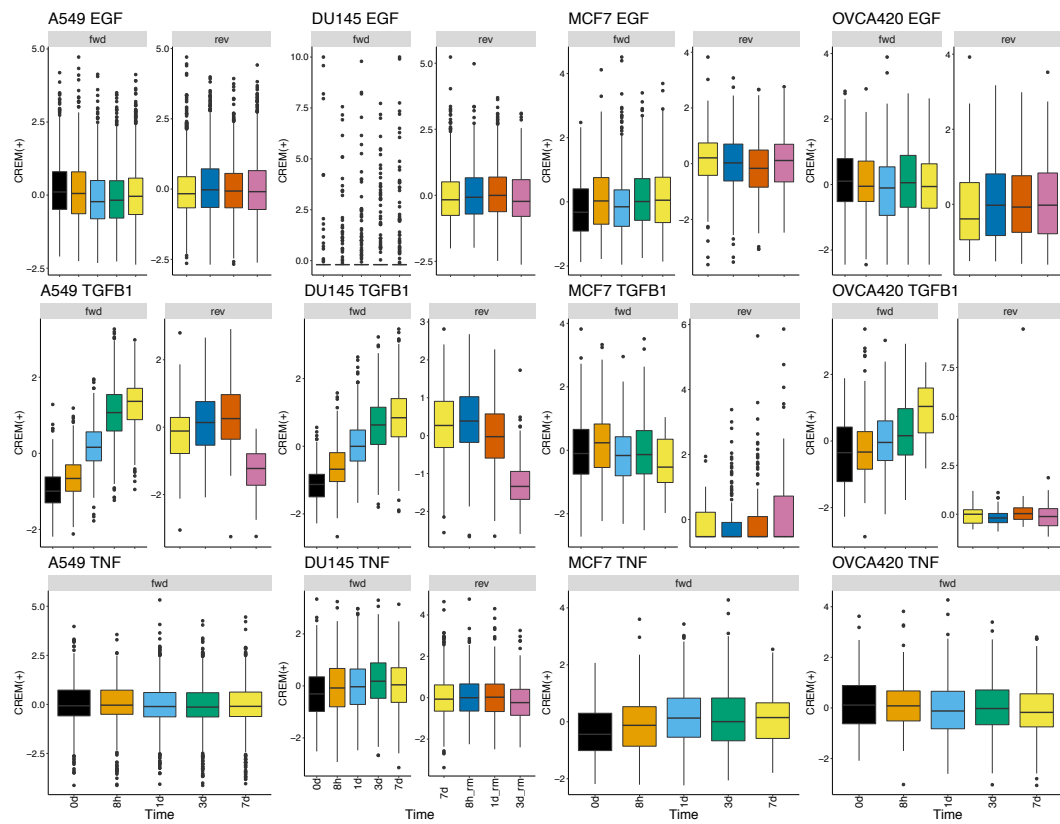
Supporting Information

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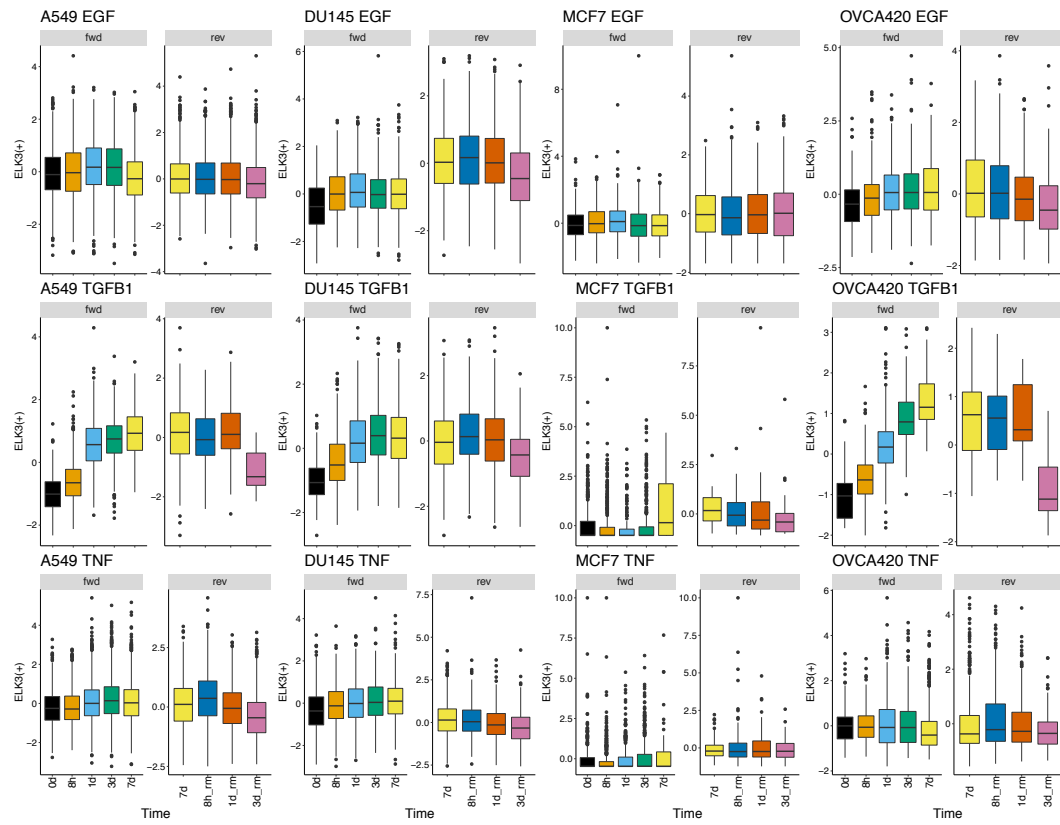
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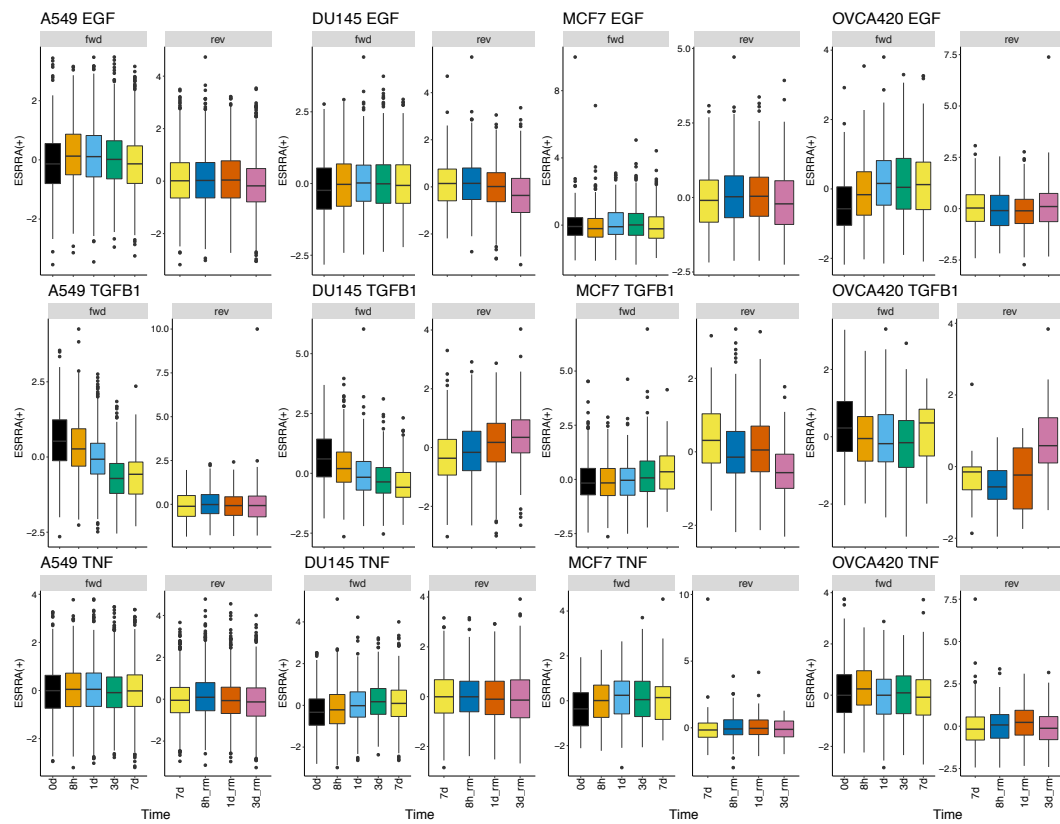
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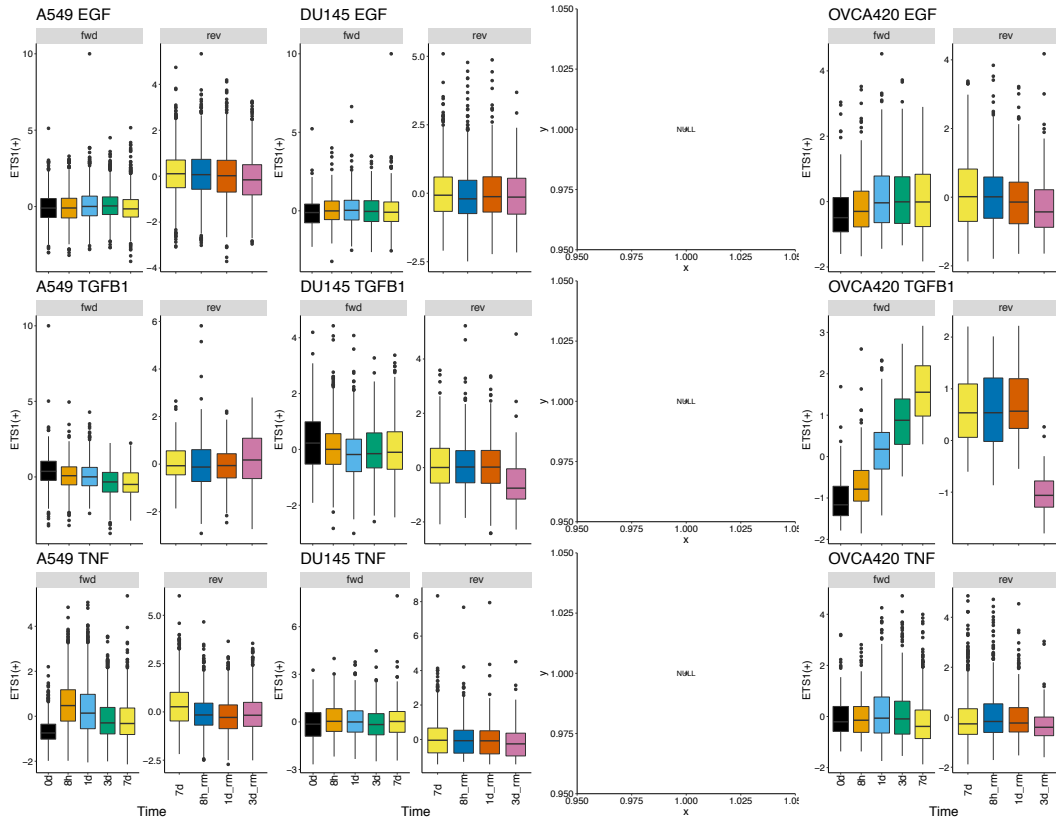
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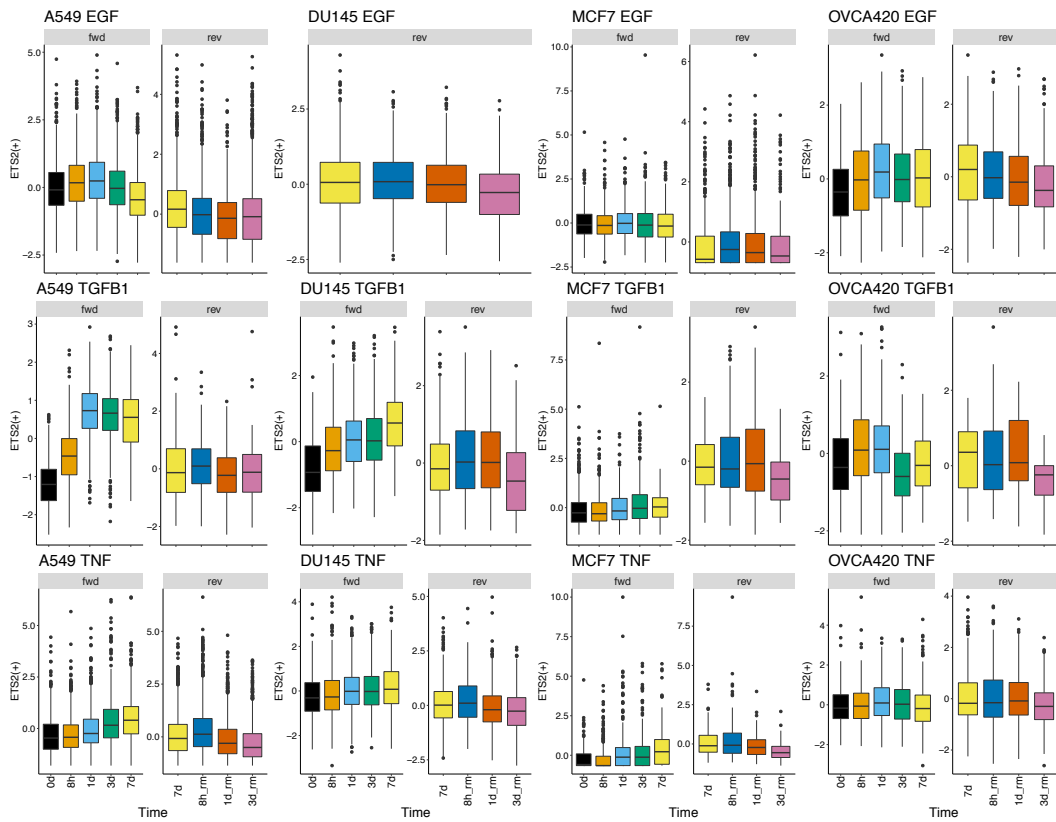
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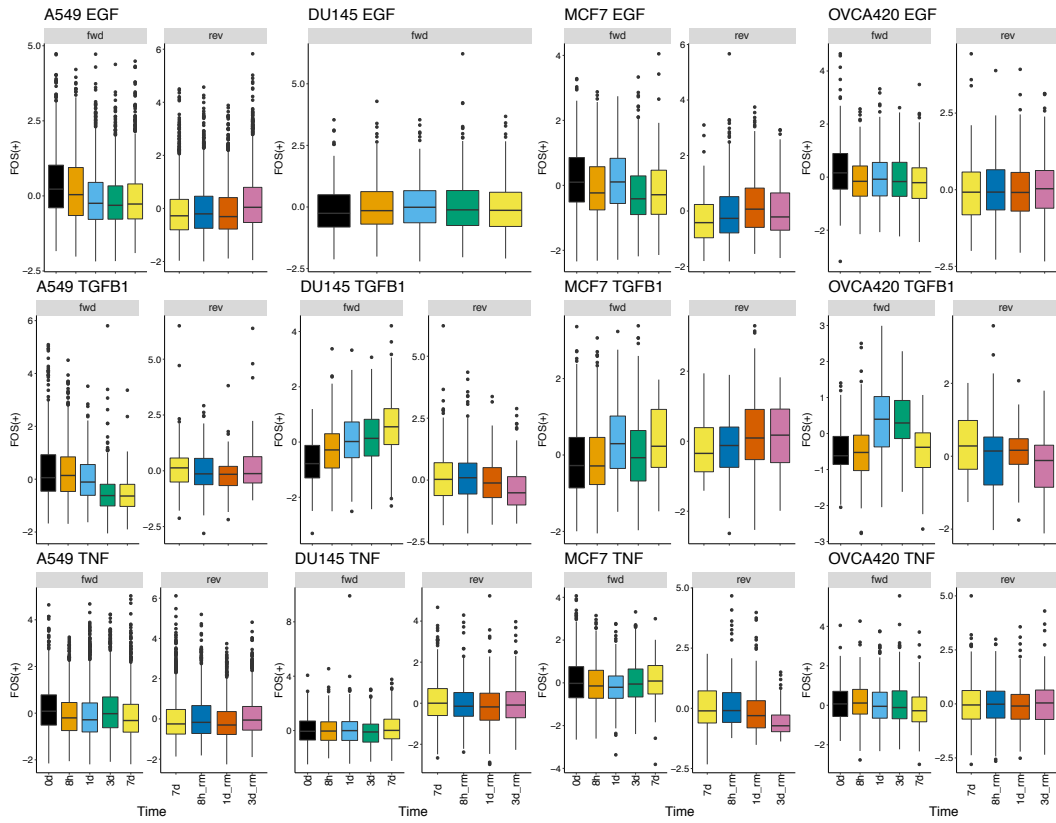
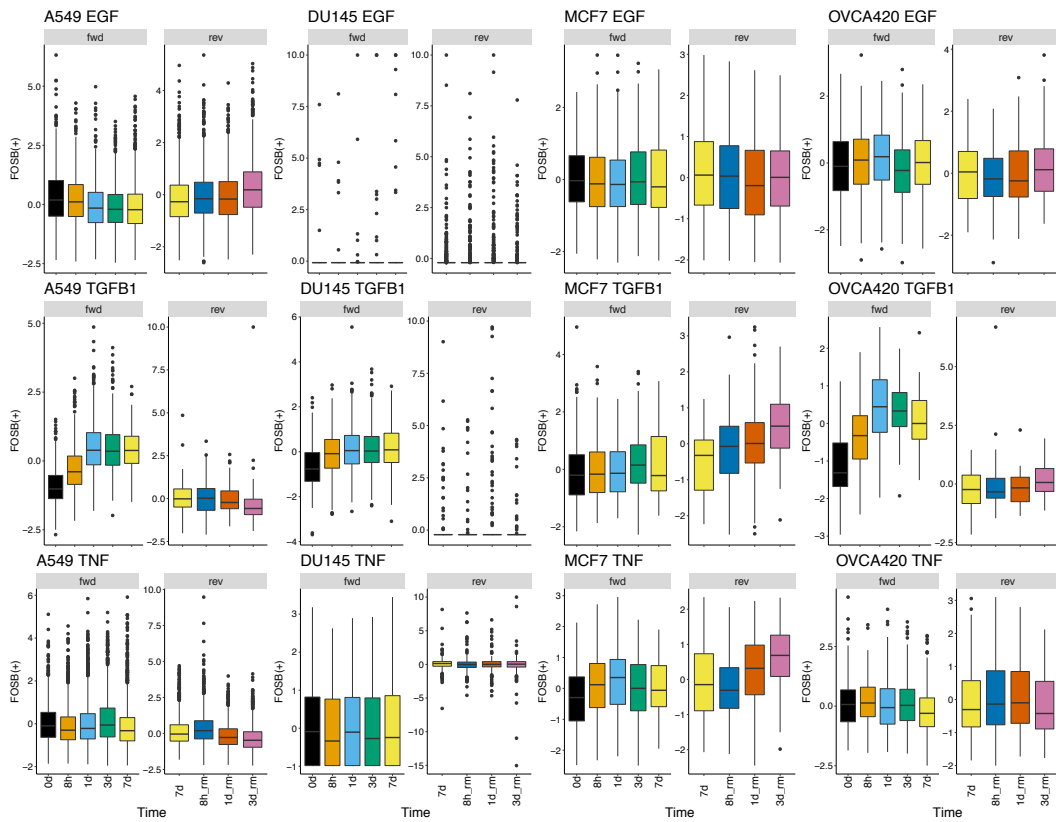


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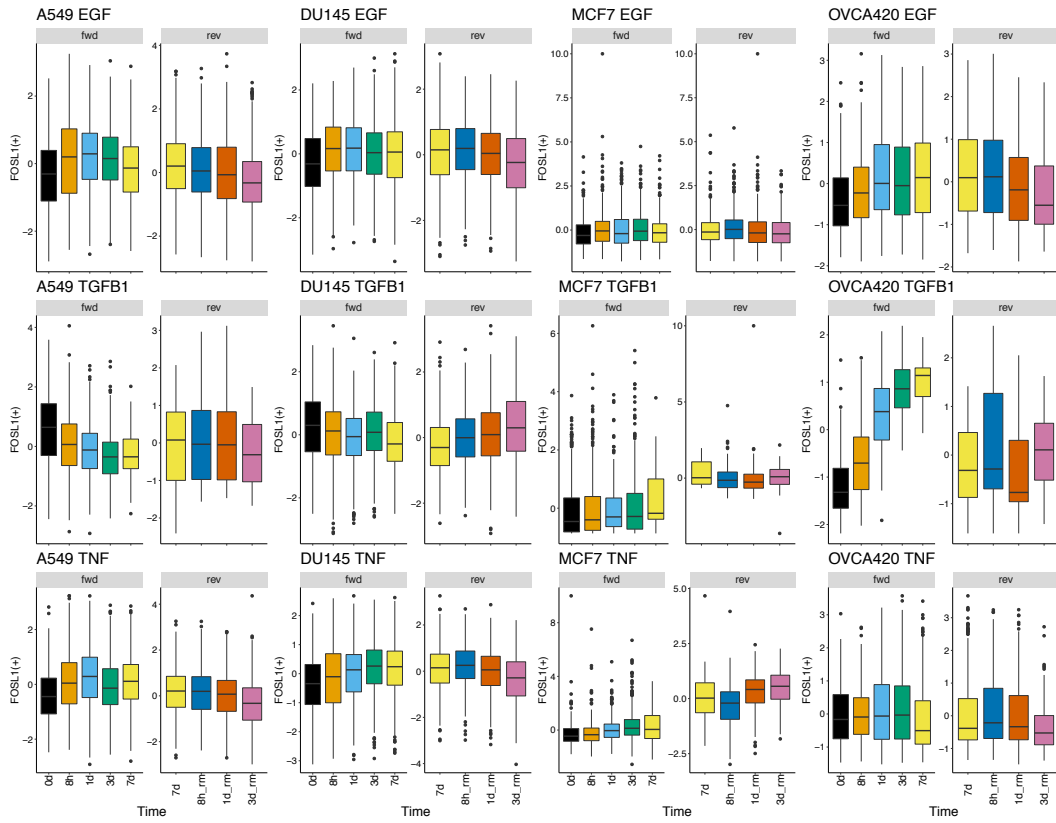


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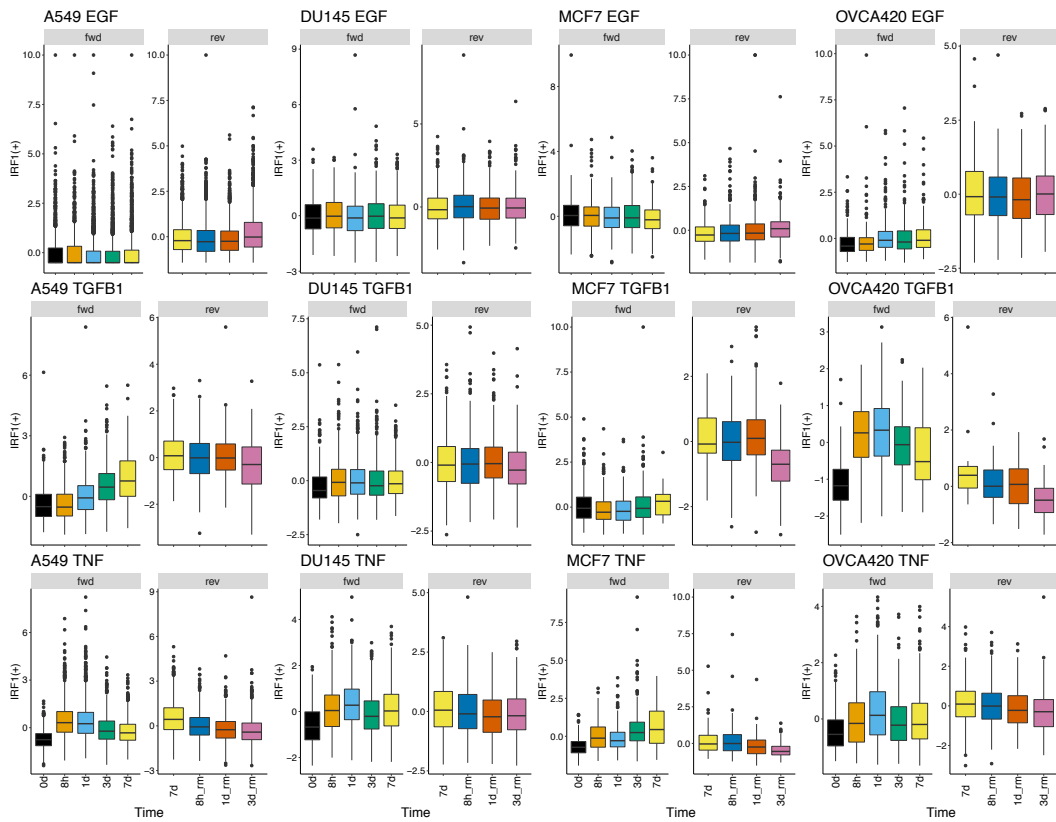


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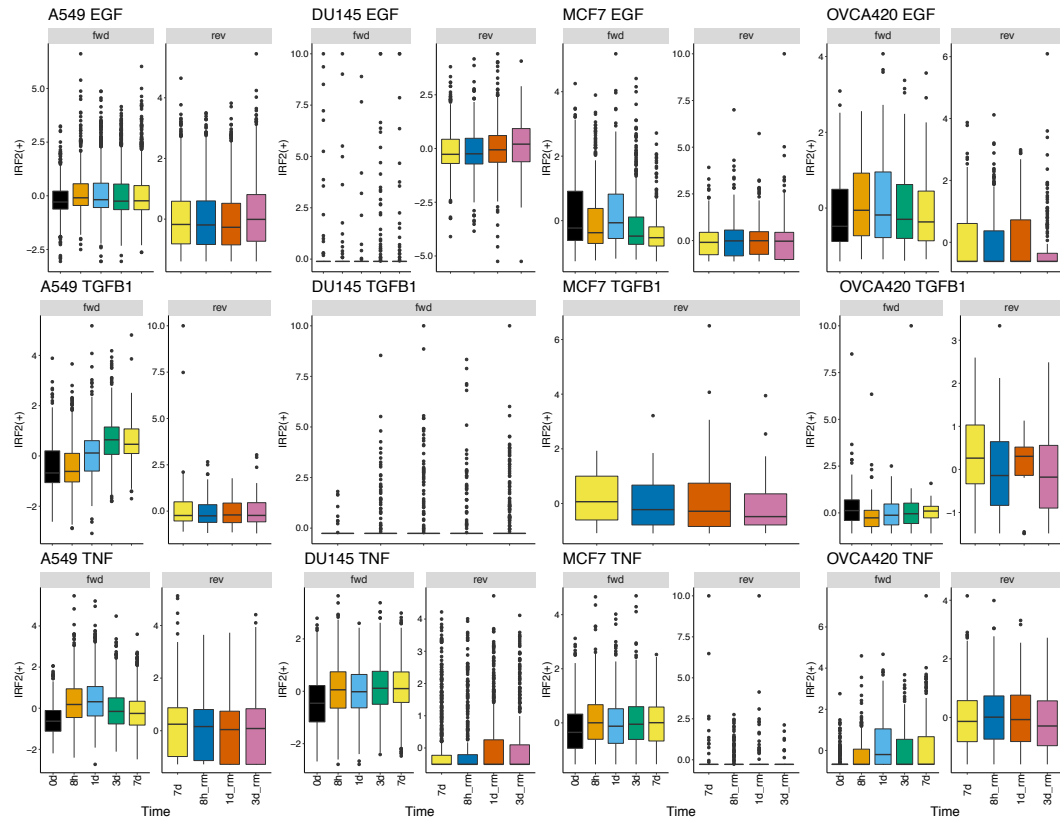
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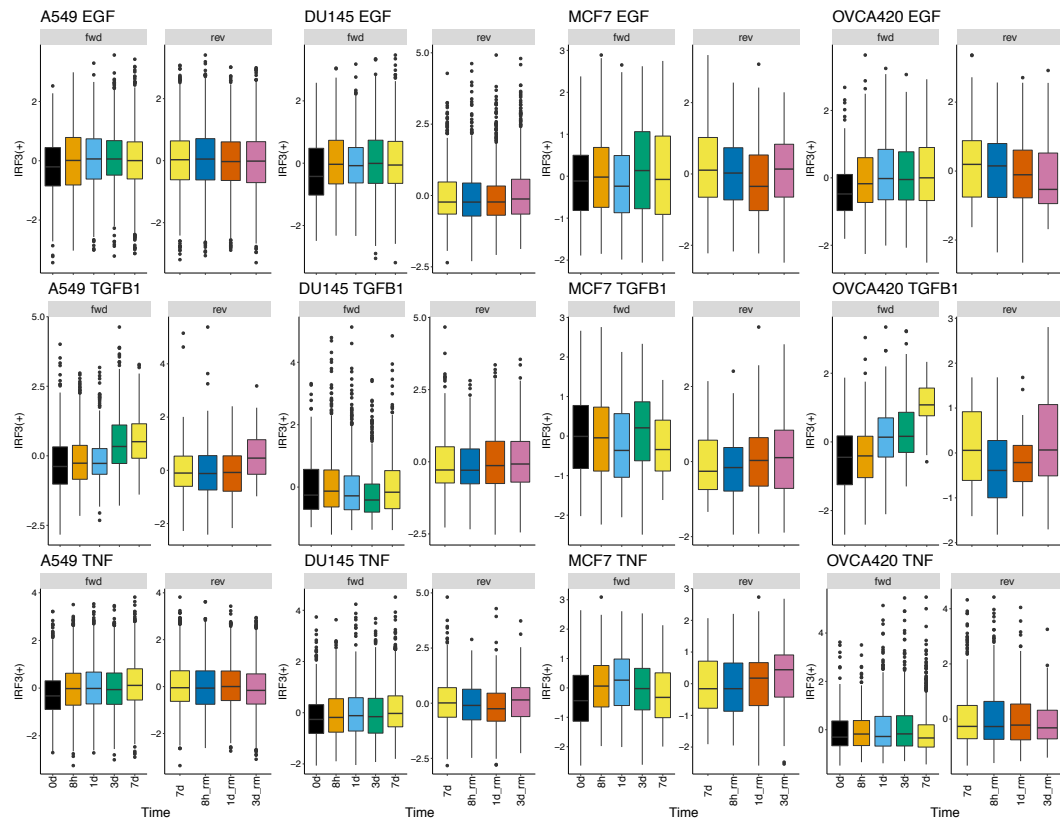
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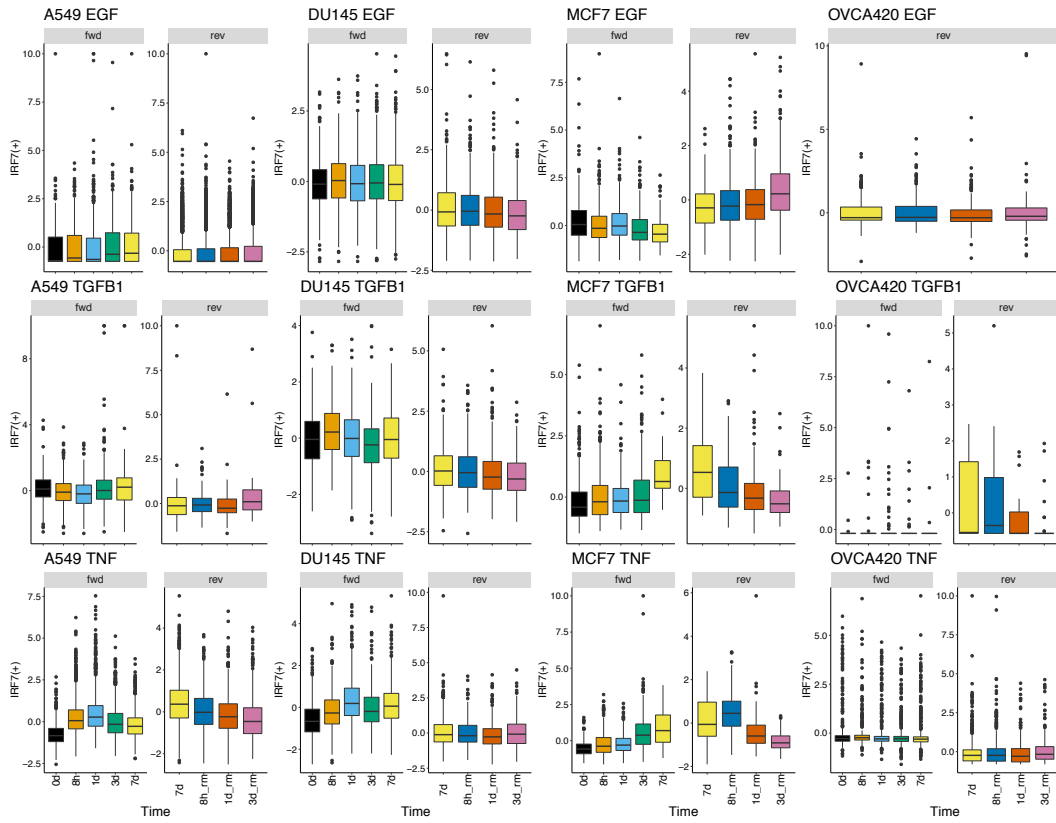
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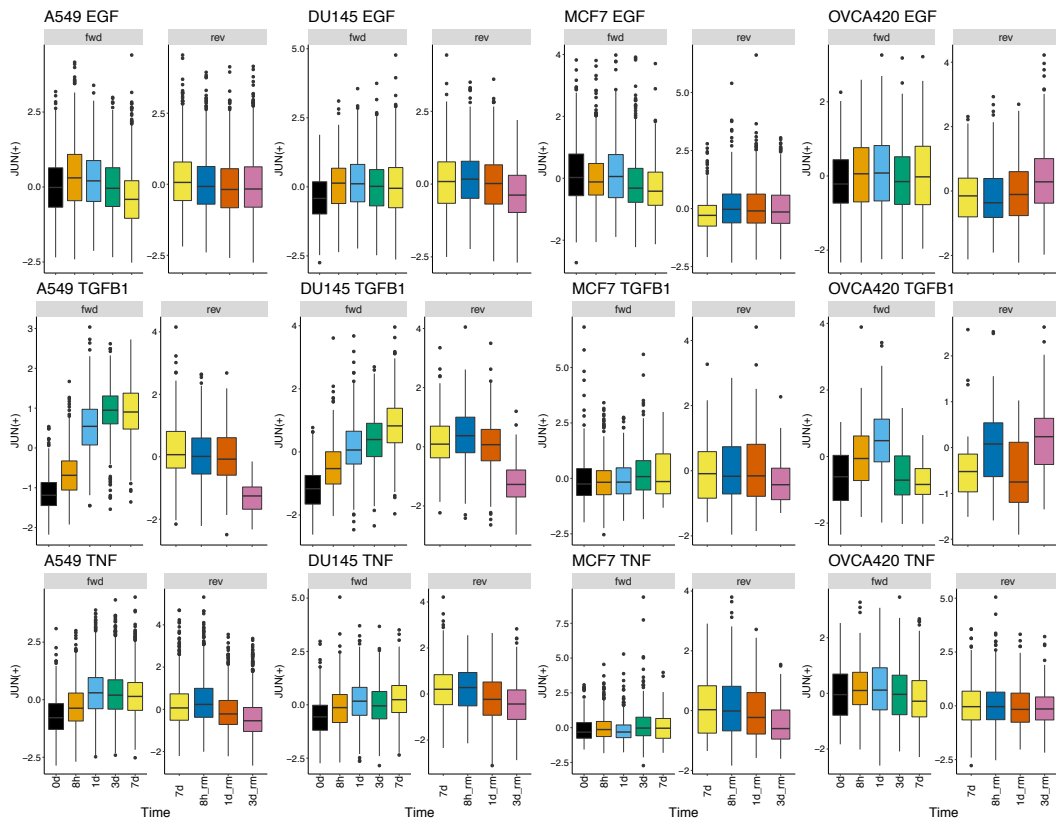
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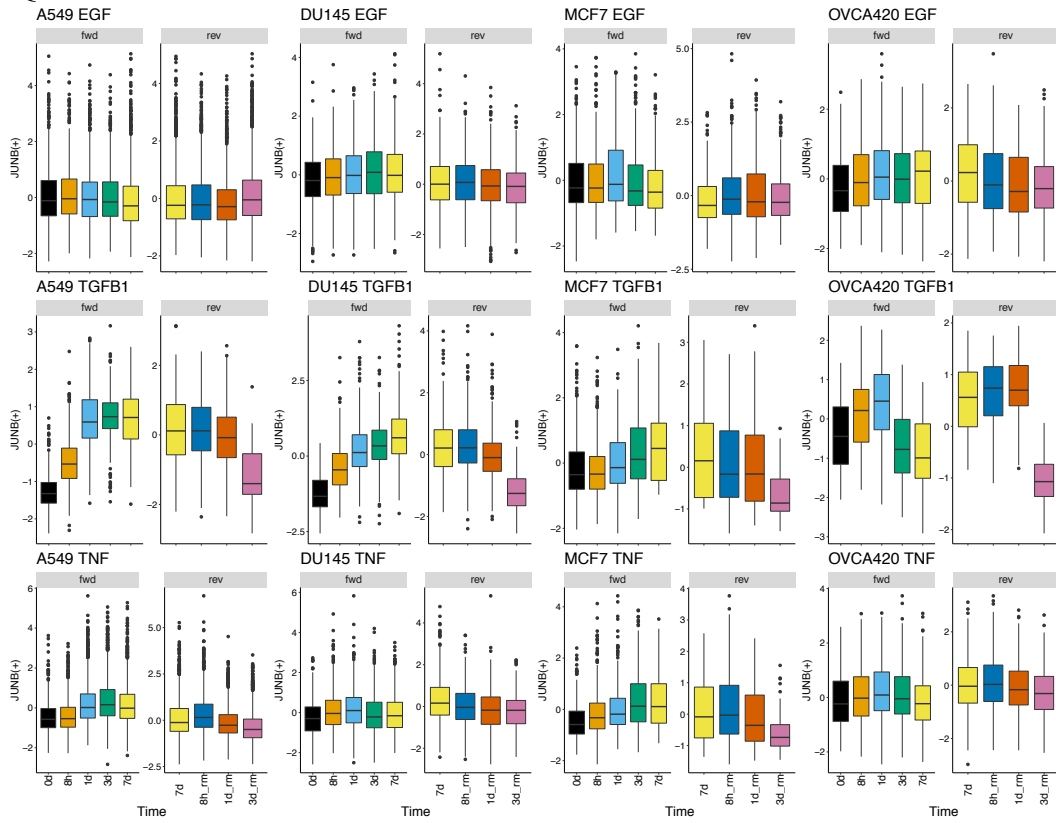
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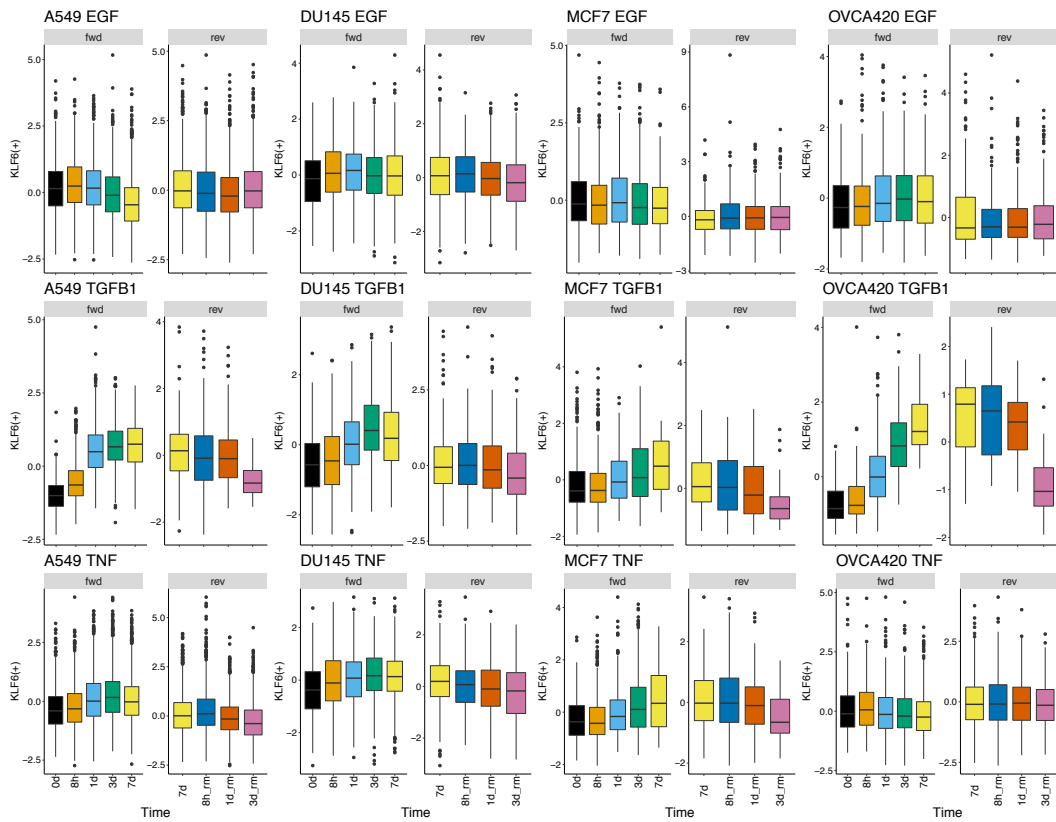
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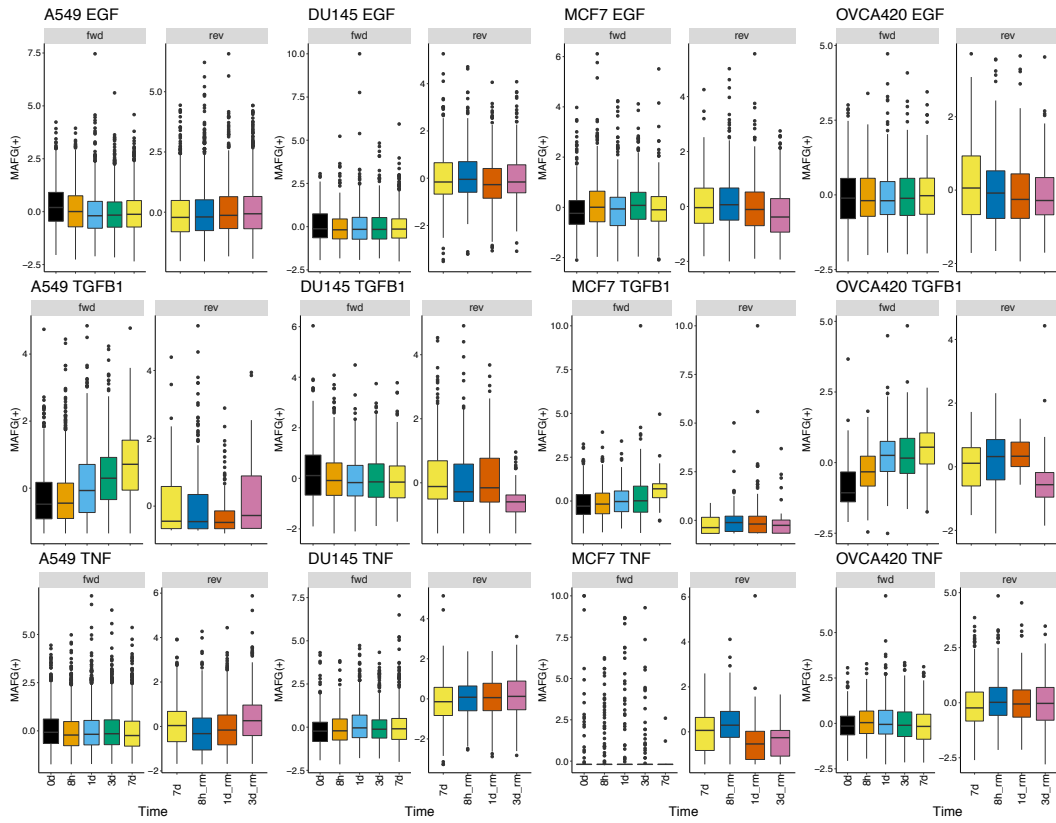
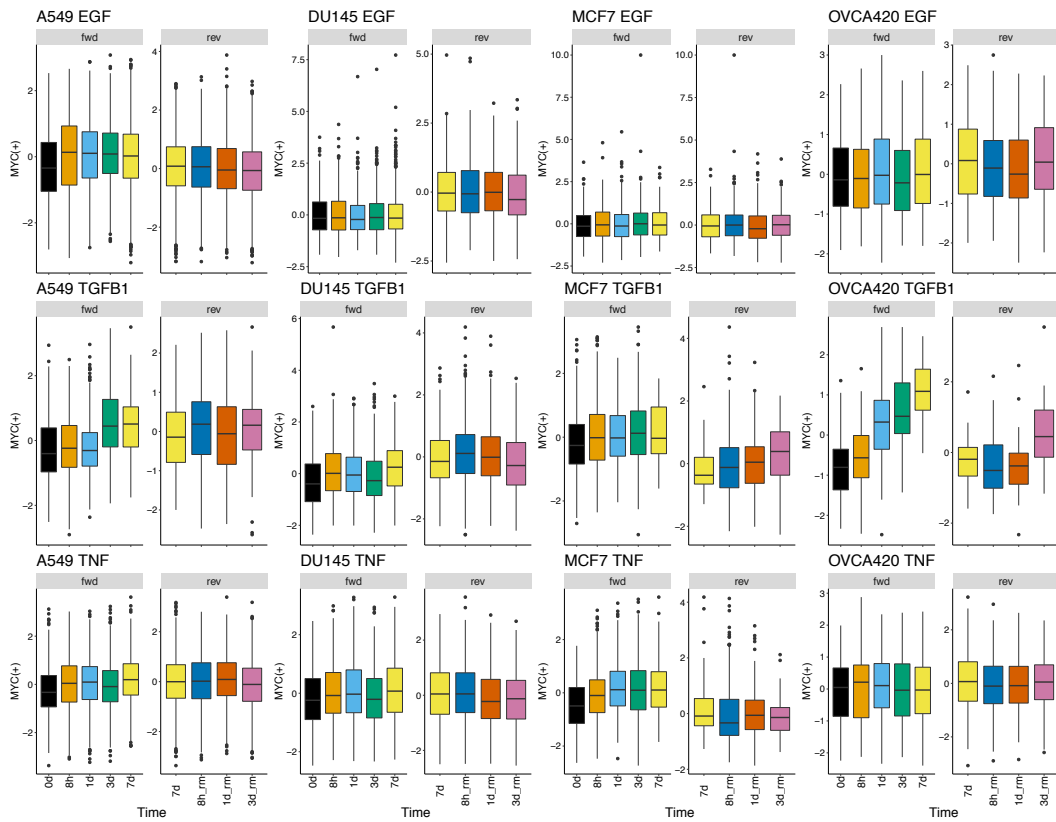


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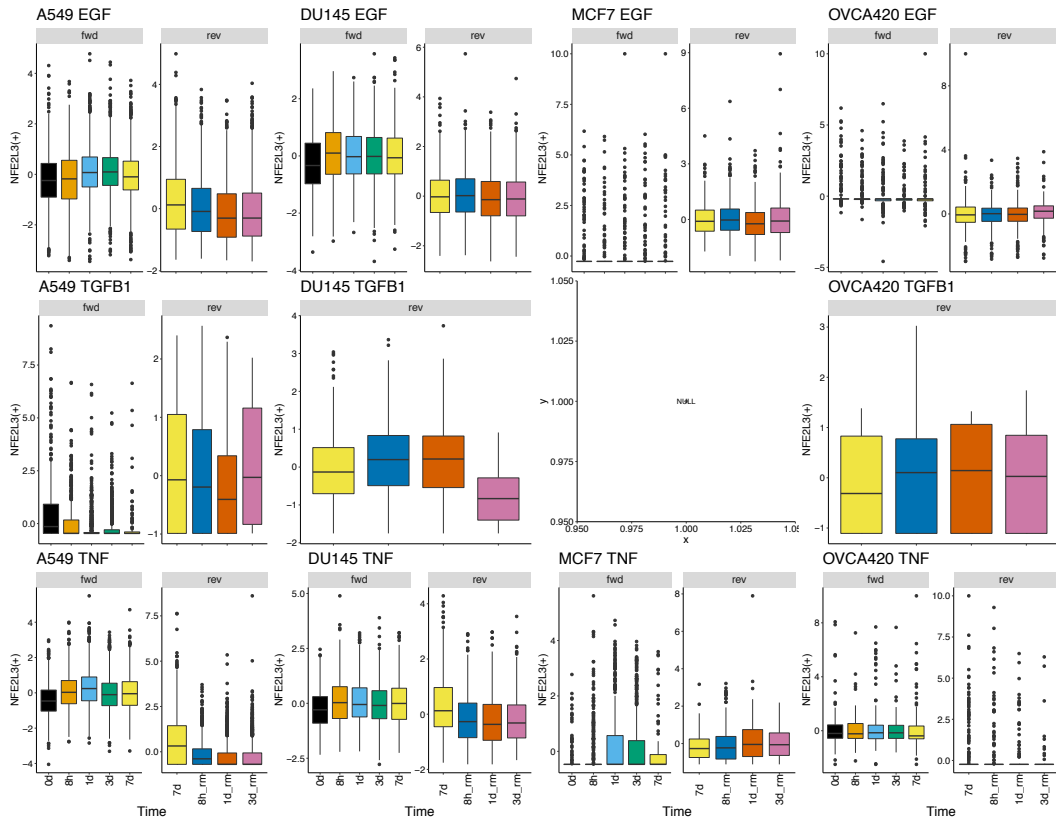


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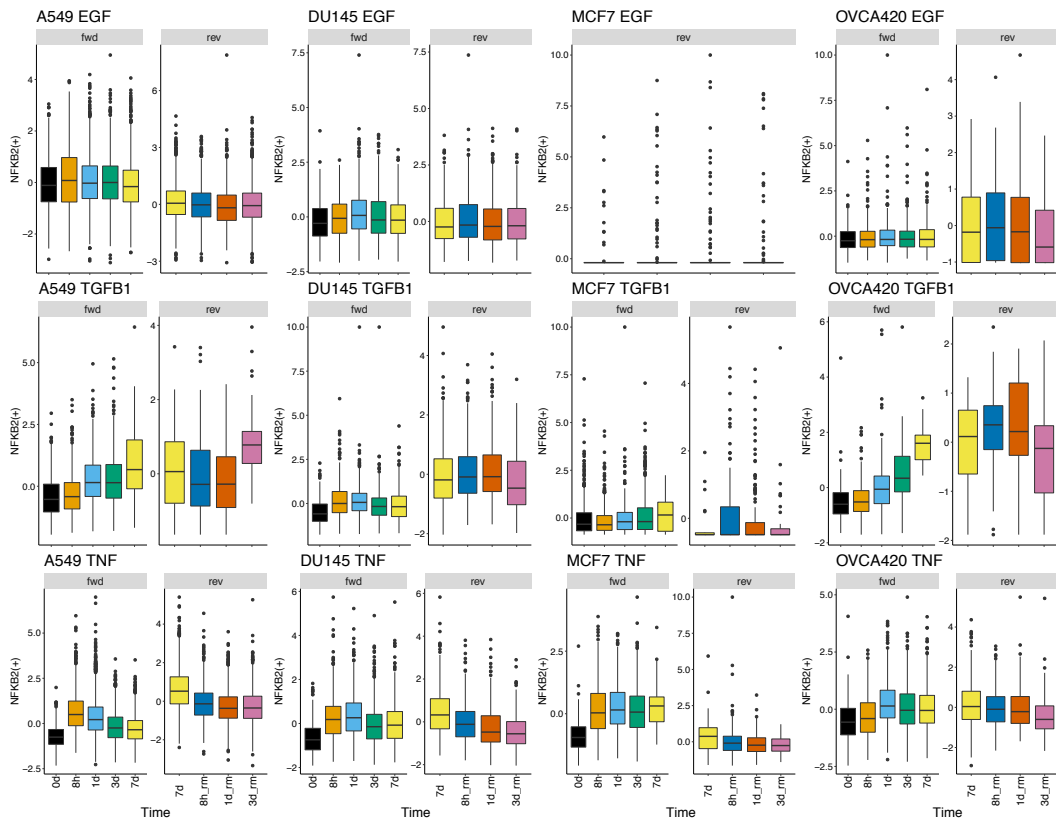


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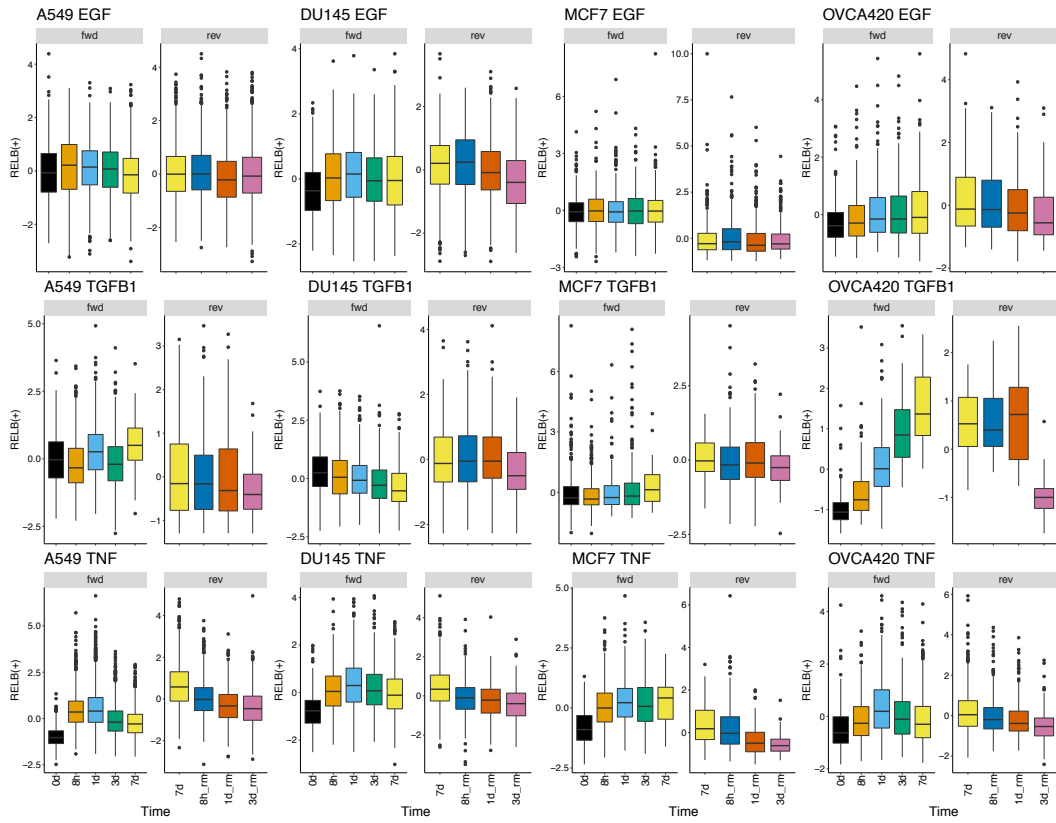
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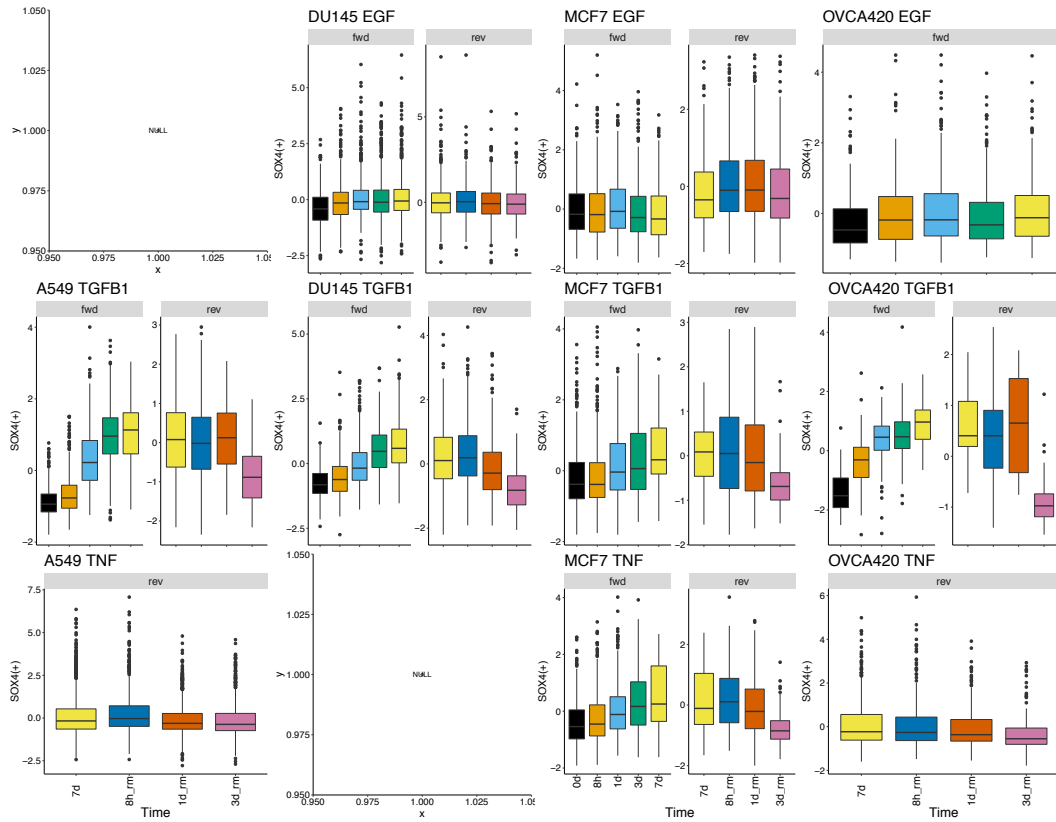
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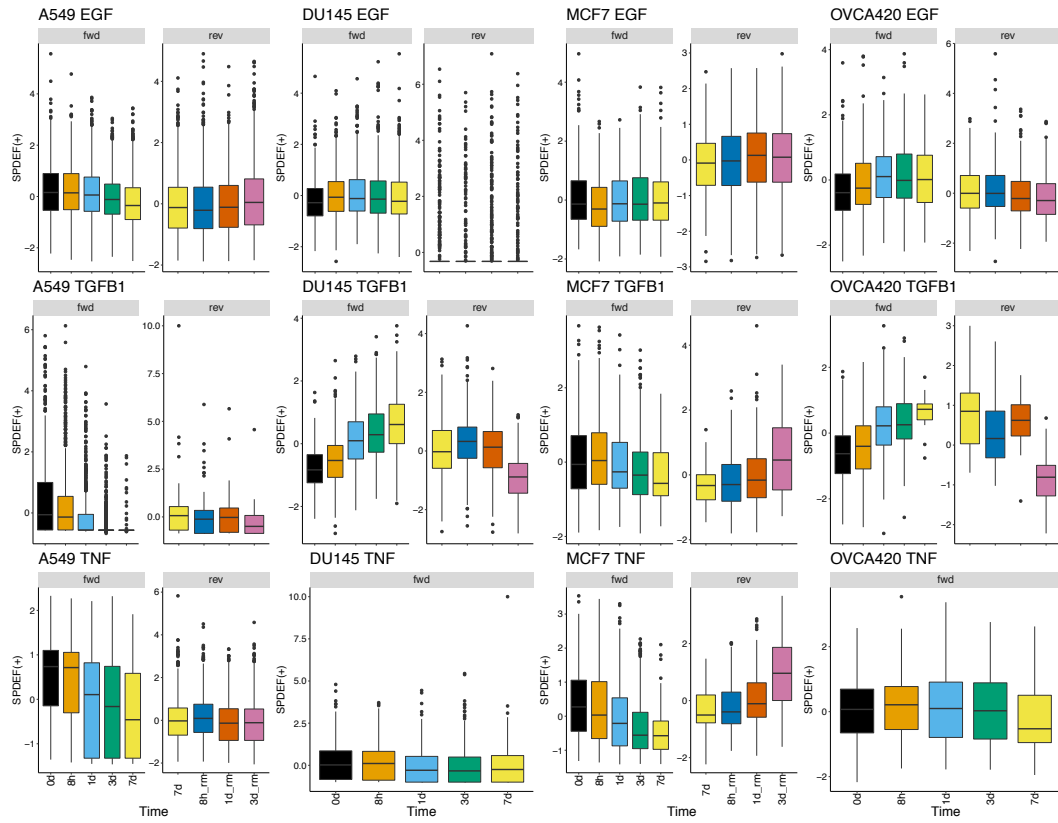
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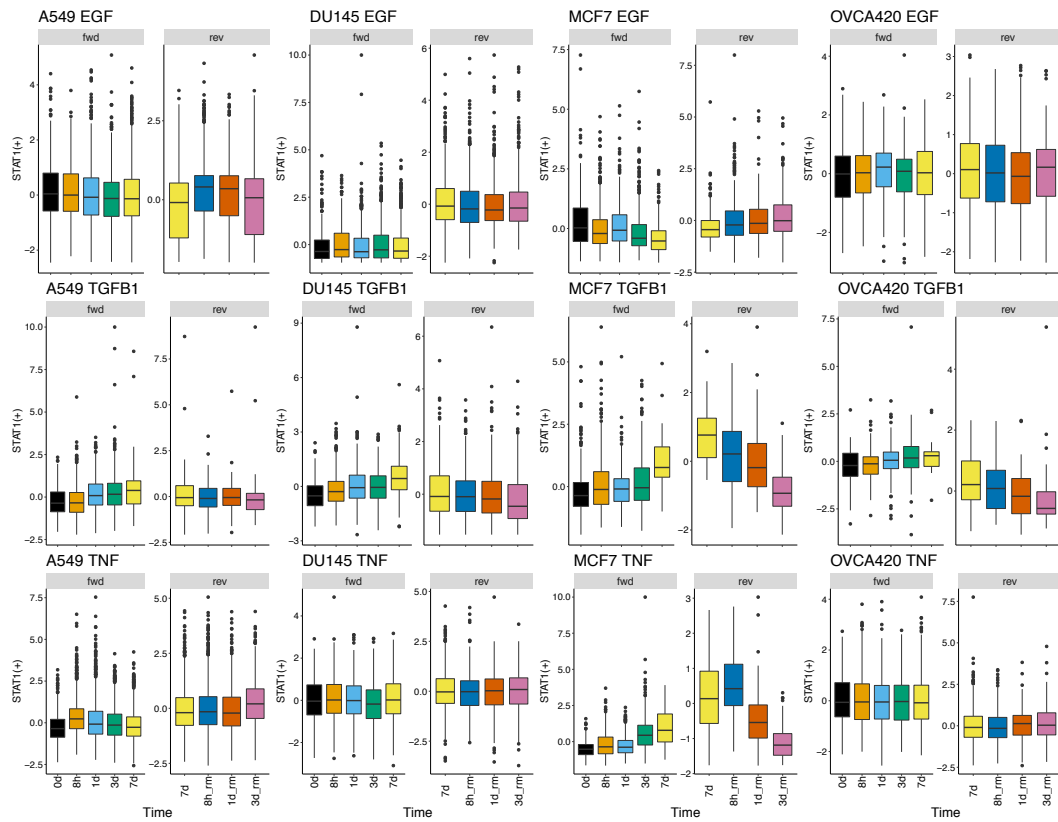
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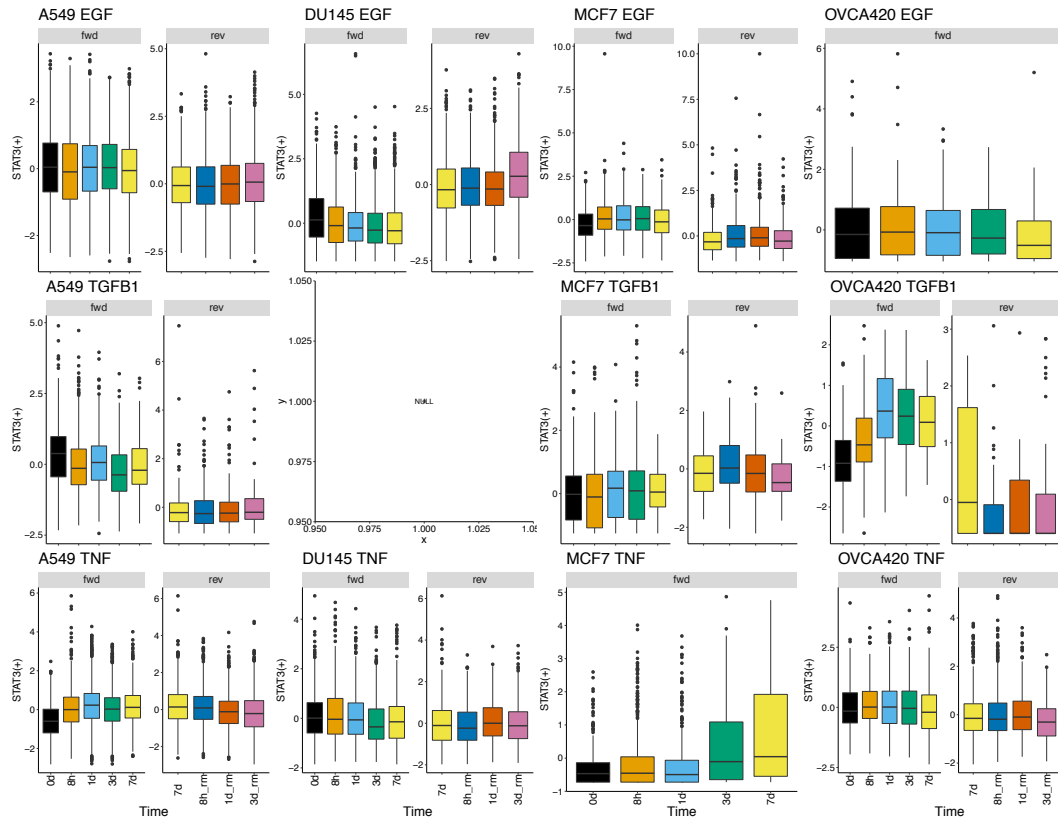
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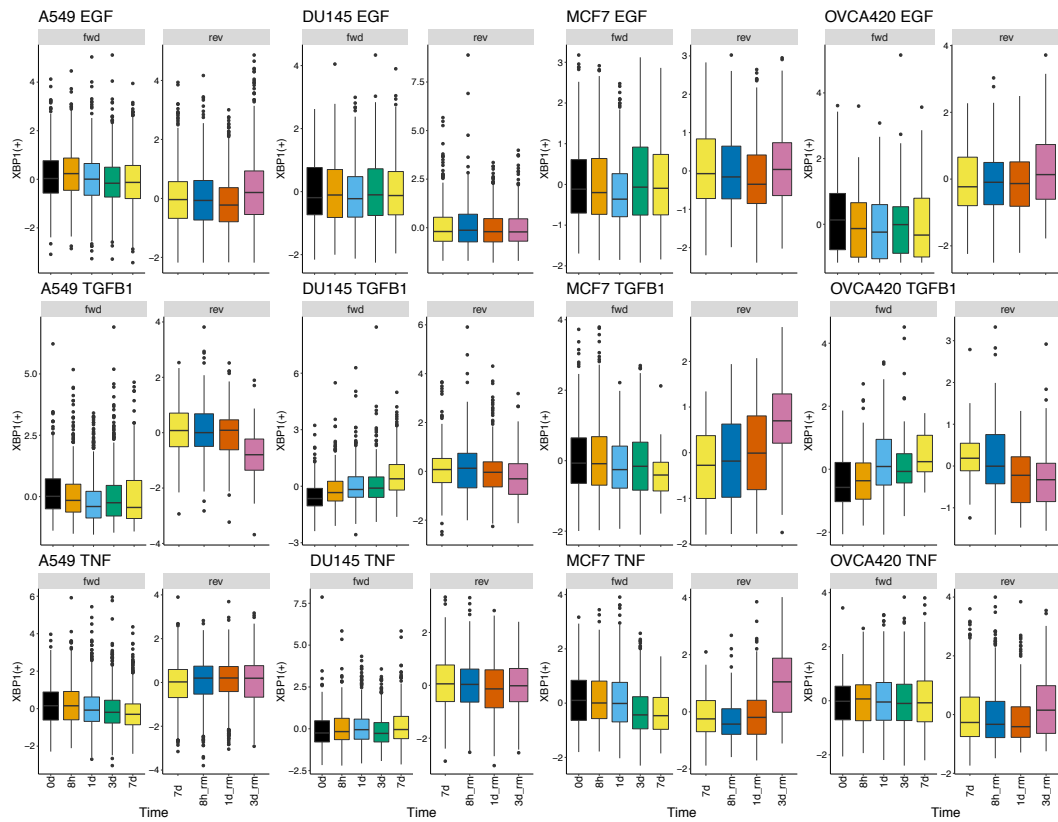


Figure S1A-AB. Activity profiles over time of 28 highly conserved TFs across all experimental conditions. Activity values shown are calculated from SCENIC. Box and whisker plots show the middle 50% of activity values within the box with a line indicating the mean value. Whiskers show the top and bottom quartiles and individual points are statistical outliers. Fwd denotes the timepoints after signal induction and rev denotes the timepoints after signal removal. Each panel shows one gene across all 12 experimental conditions. Missing plots indicate that a TF was not identified as a regulon by SCENIC in that experimental dataset.

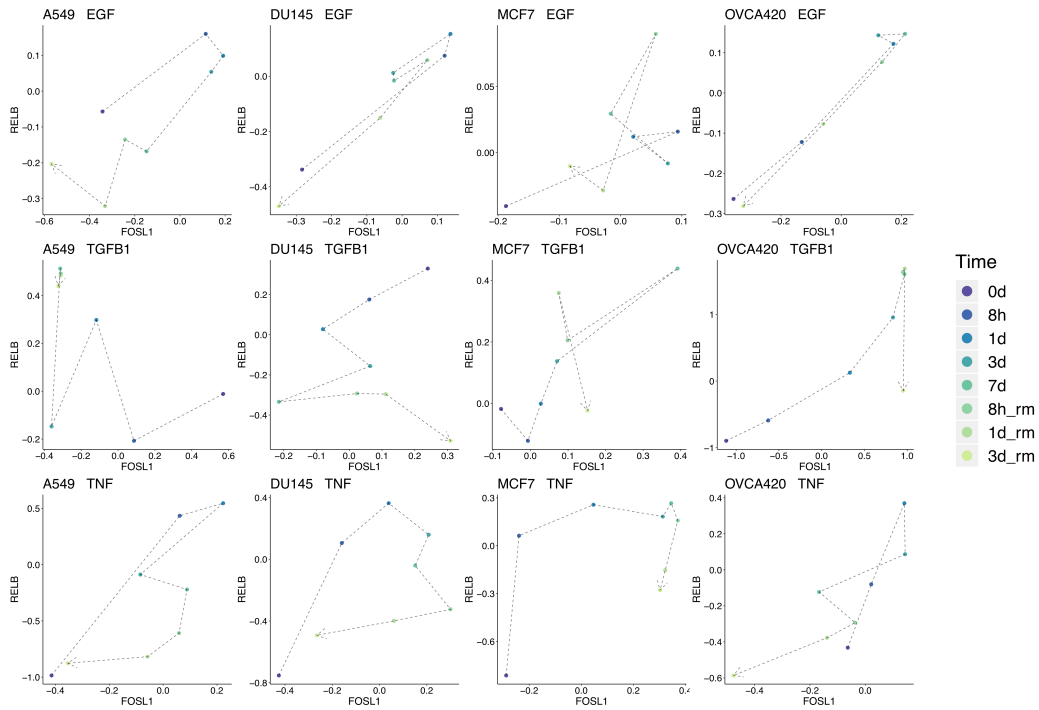


Figure S2. Signal chronology across different conditions for alternate gene pairs. Average TF activity of RELB vs FOSL1 for each timepoint. Data from 7d onward is scaled on a linear model to match the 7d distributions for the forward direction. Point color denotes timepoint and chronology is demonstrated with a dashed arrow.

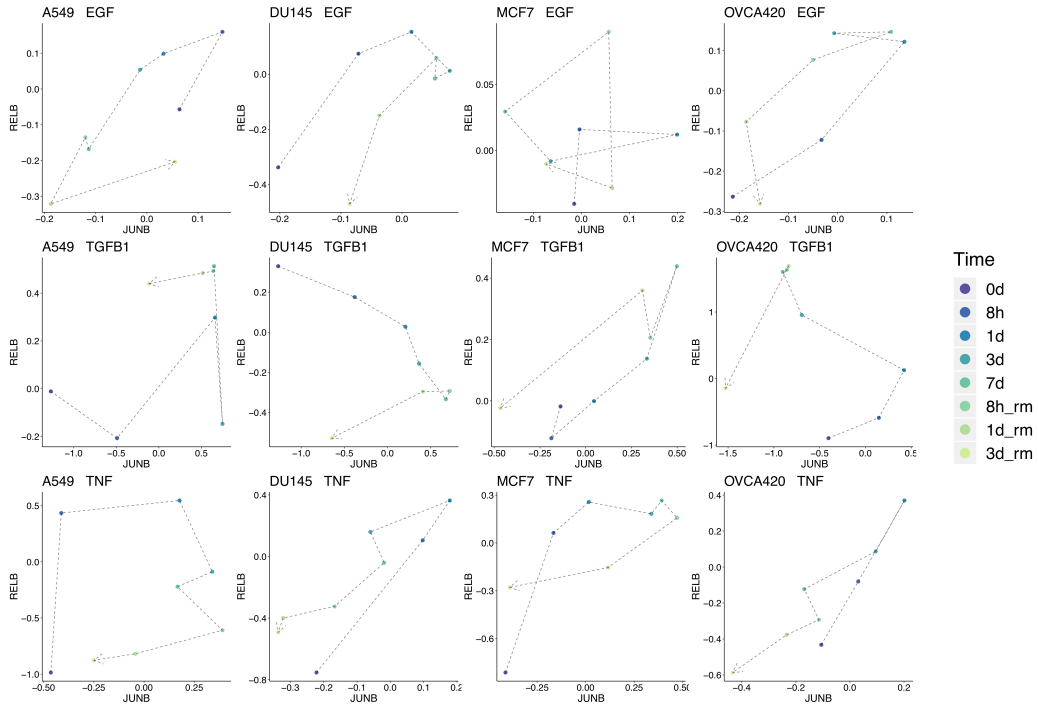
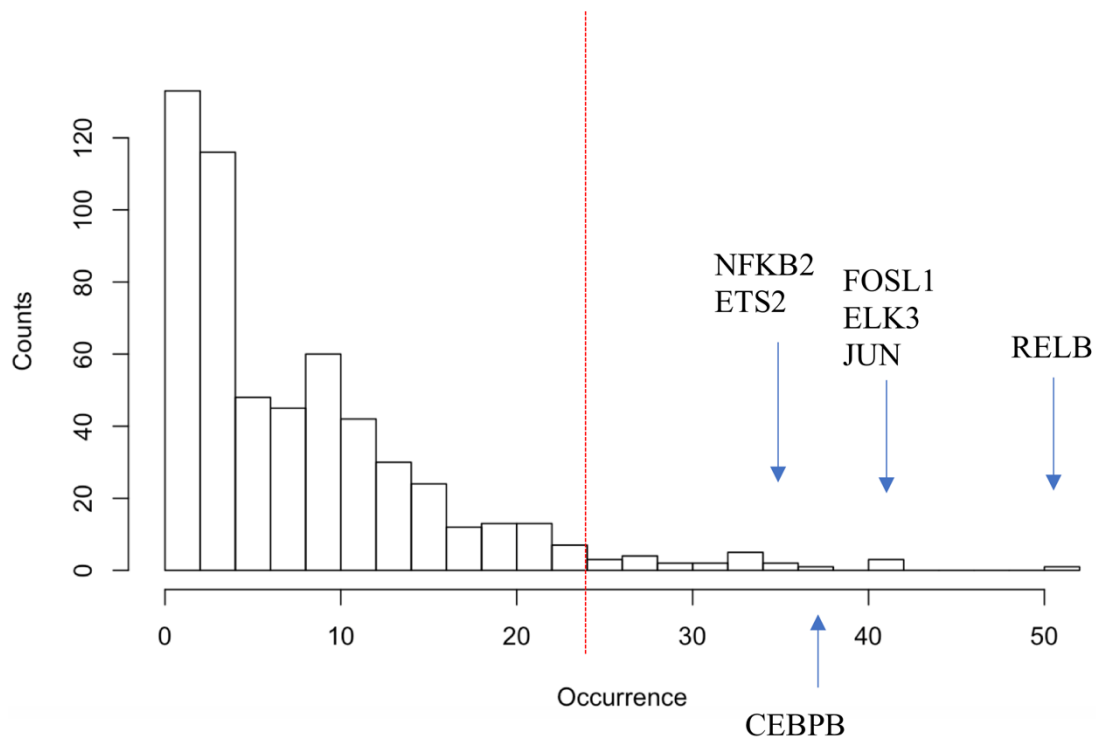


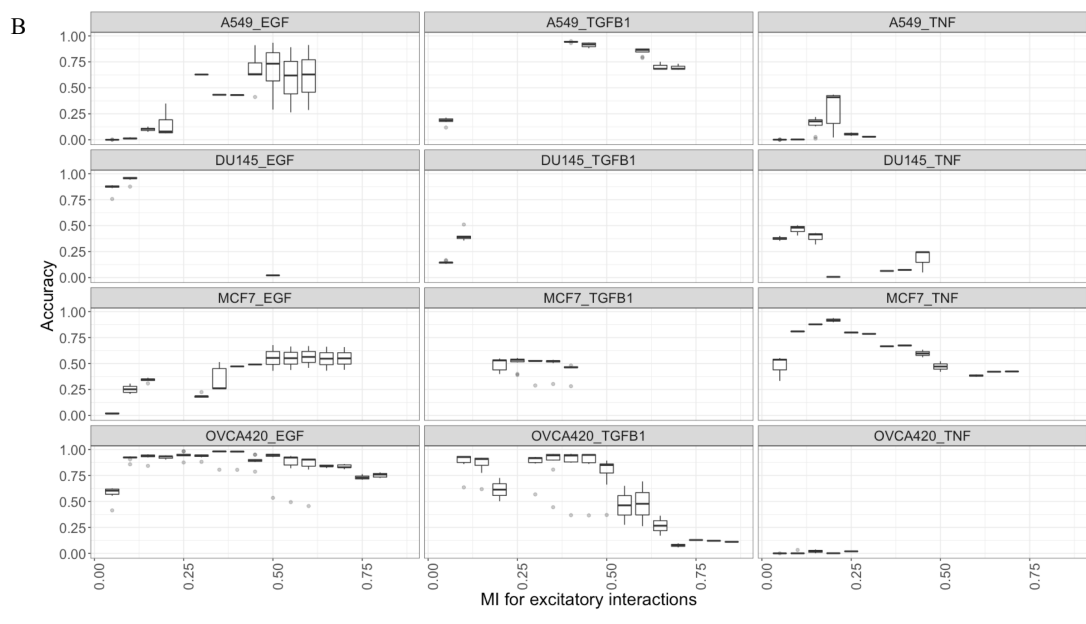
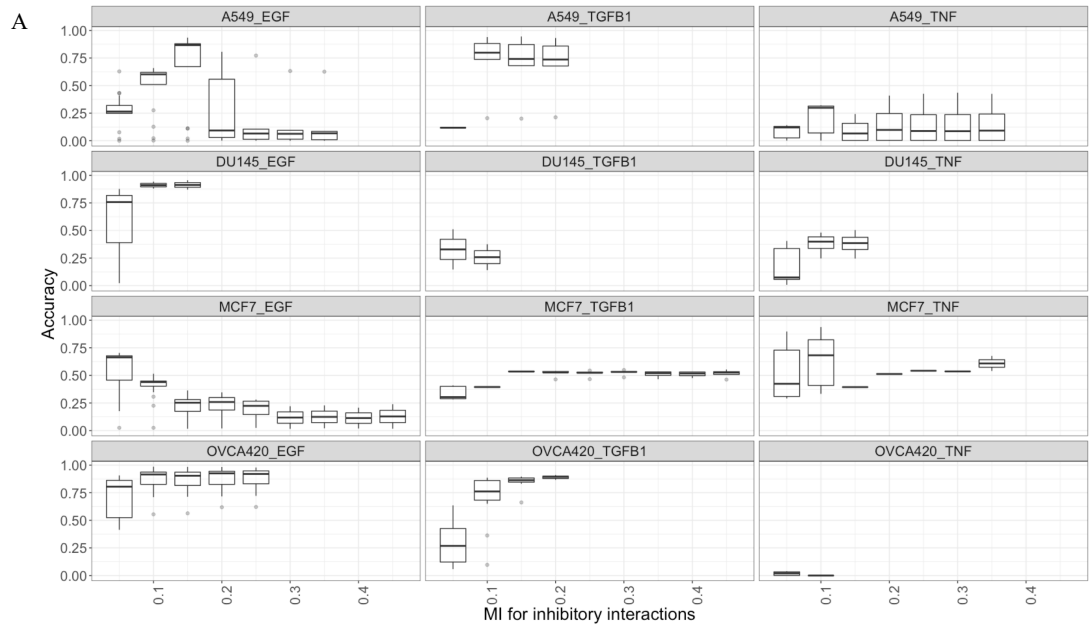
Figure S3. Signal chronology across different conditions for alternate gene pairs. Average TF activity of RELB vs JUNB for each timepoint. Data from 7d onward is scaled on a linear model to match the 7d distributions for the forward direction. Point color denotes timepoint and chronology is demonstrated with a dashed arrow.

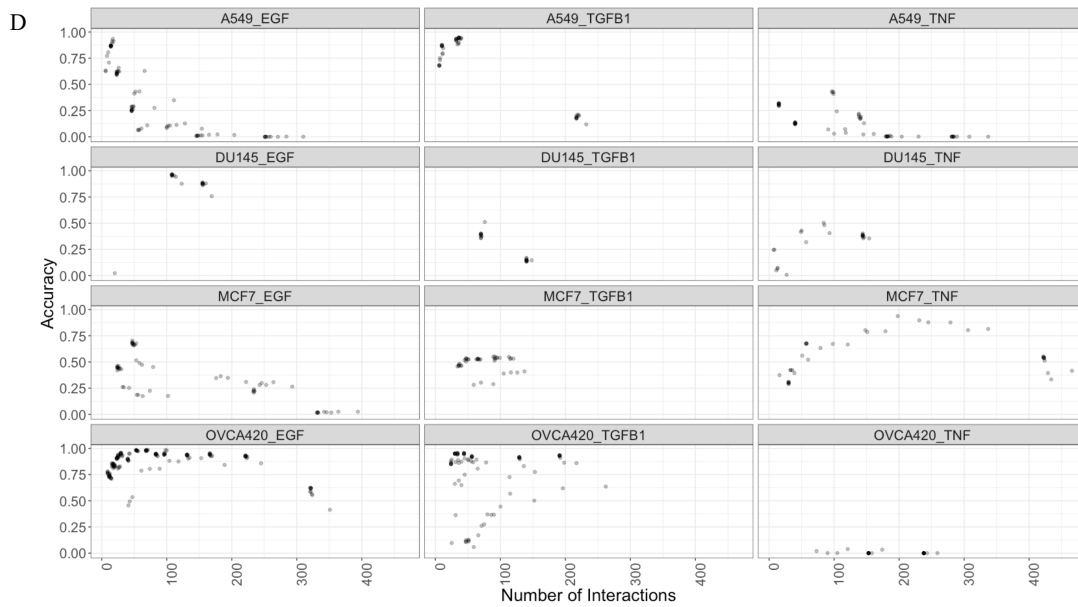
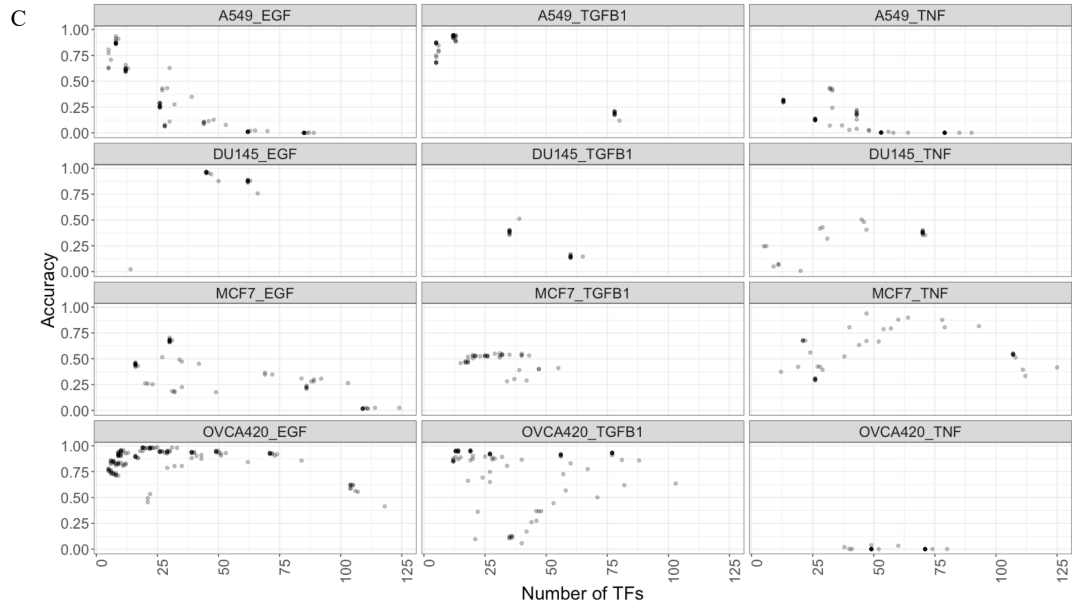


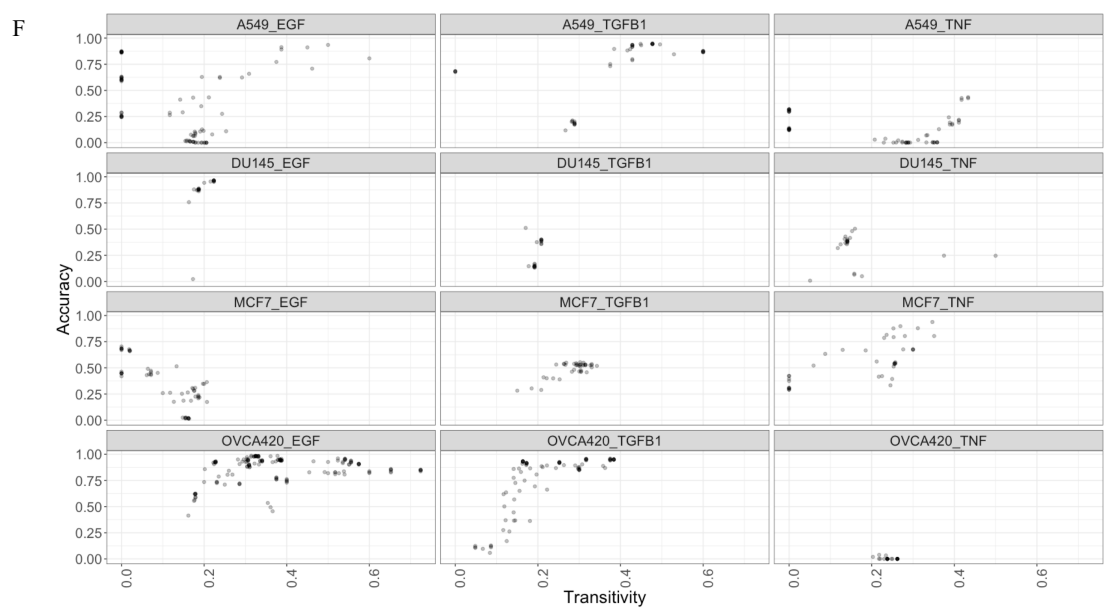
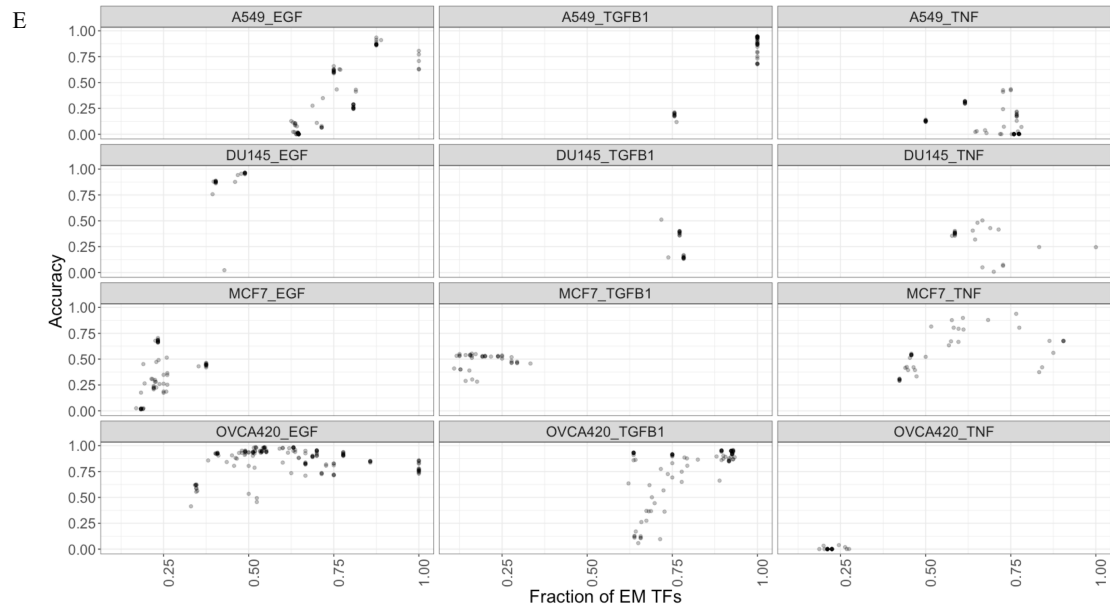
Selected TFs: BHLHE40, CEBPB, CREB3, CREM, ELK3, ESRRA, ETS1, ETS2, **FOS**, **FOSB**, **FOSL1**, IRF1, IRF2, IRF3, IRF7, **JUN**, **JUNB**, KLF6, MAFG, MYC, NFE2L3, **NFKB2**, **RELB**, SOX4, SPDEF, STAT1, STAT3, XBP1

Figure S4. Number of TFs featuring as differentially active TFs (DATF) out of 84 comparisons.

For example, RELB appears as a DATF in 52 comparisons. TFs coming up as DATFs in more than 24 comparisons were selected as common TFs. TF names in red indicate AP-1 and NFKB genes, common downstream targets of the EMT inducing signals.







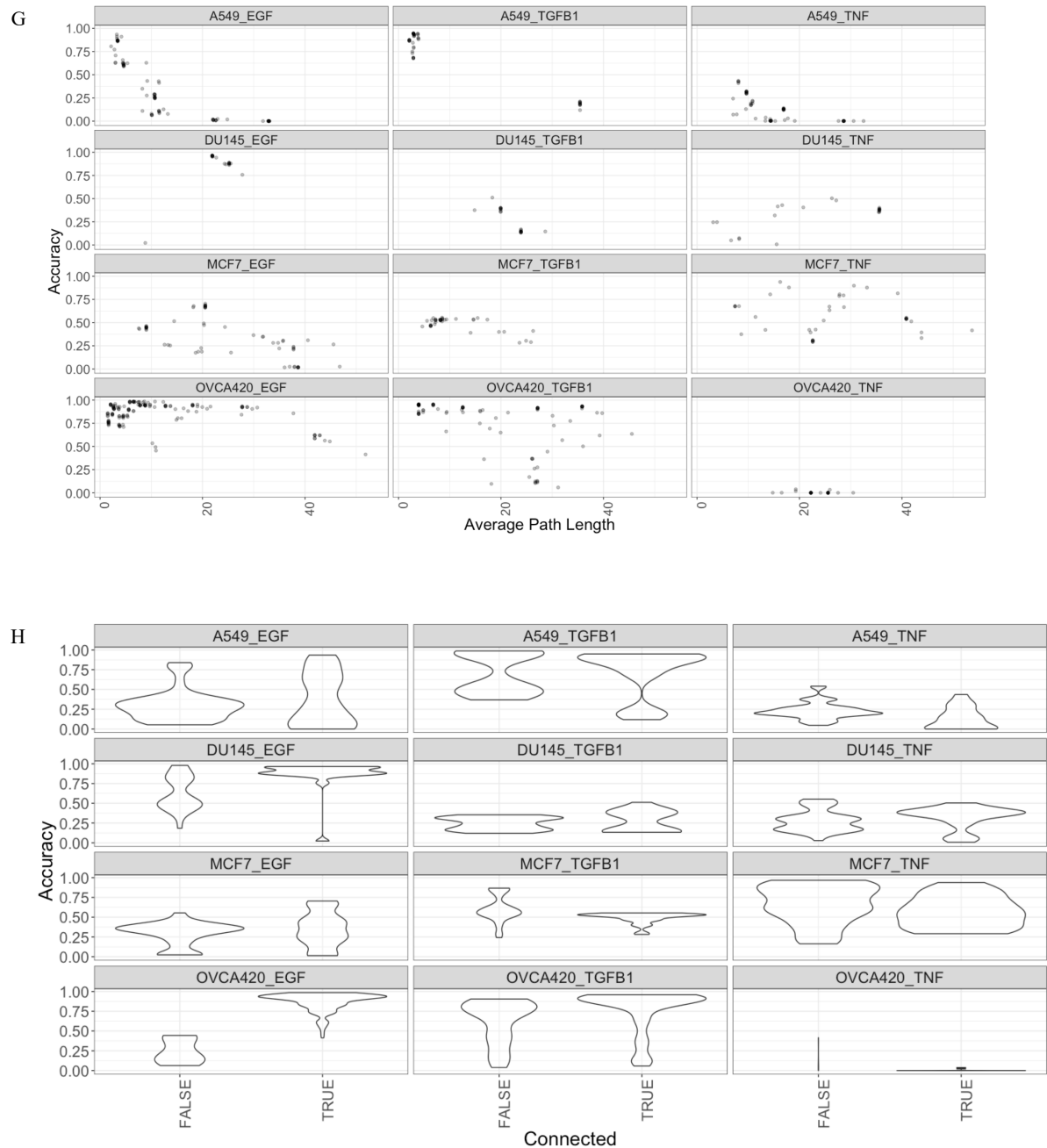
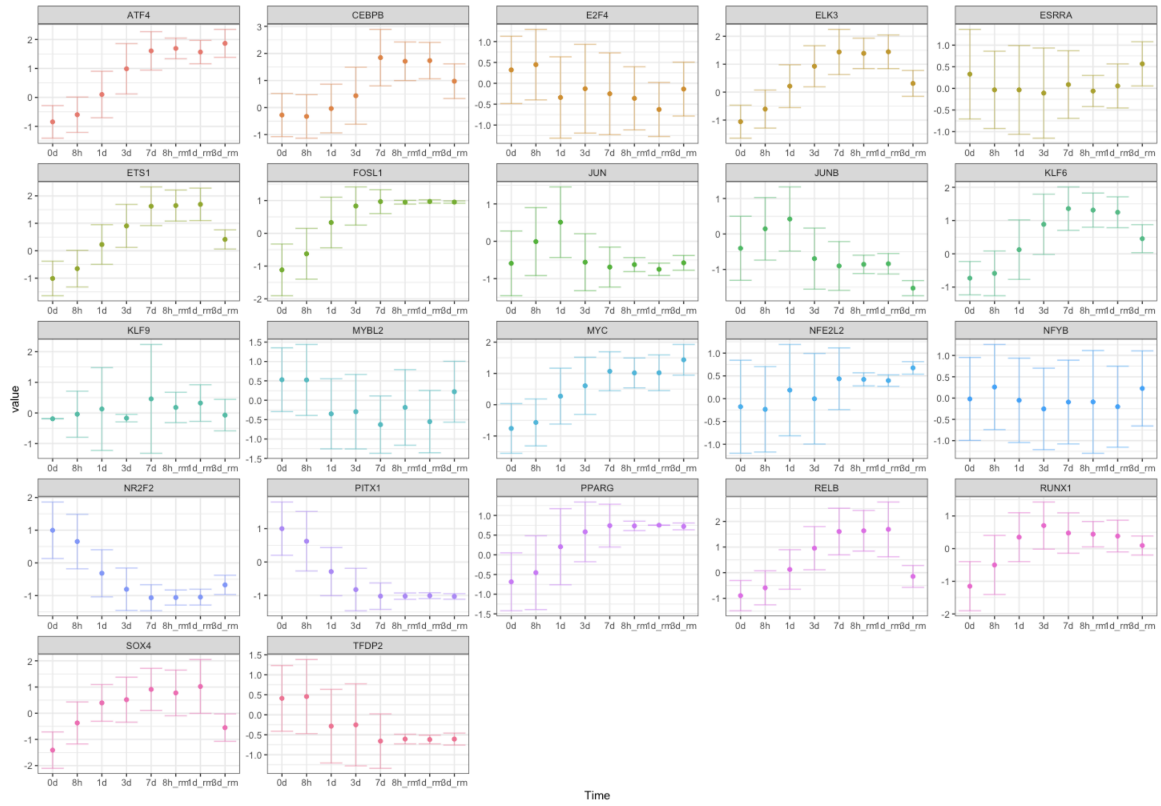


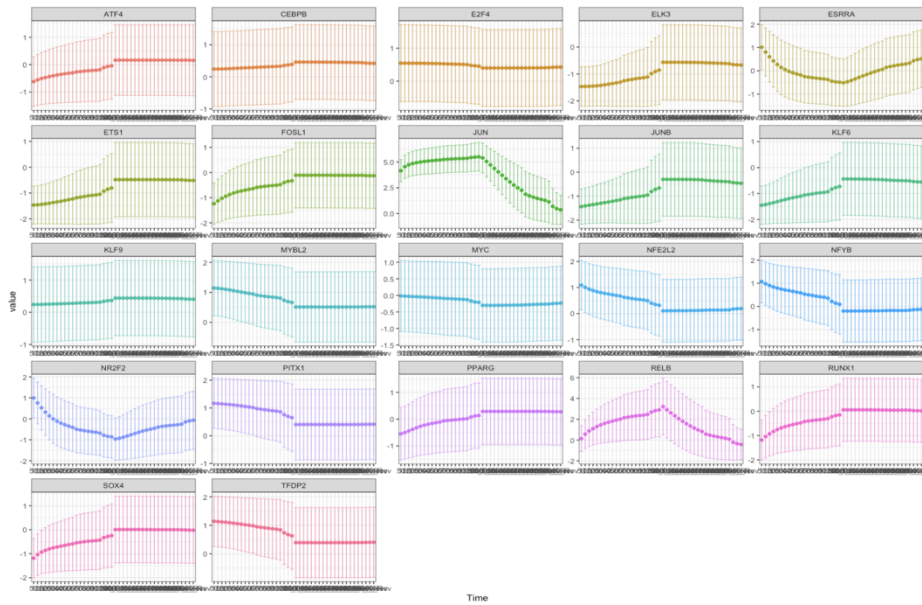
Figure S5. Accuracy dependence on various network properties for each condition. **(A-B)** Box plots showing accuracy of networks for various **(A)** mutual information cutoffs for inhibitory interactions, **(B)** mutual information cutoffs for excitatory interactions. Points showing accuracy (measured as fraction of models that can be classified as E or M) of networks for various **(C)** number of TFs in the network, **(D)** number of interactions in the network, **(E)** TFs assigned as E

or M using experimental data, **(F)** transitivity or clustering coefficient of networks, **(G)** average path length of the networks. **(H)** Violin plots of accuracy values for connected and unconnected networks. Note that only connected networks were used for all analysis in the manuscript.

A Average activity over time for OVCA420 TGFB1



B Average activity over time for OVCA420 TGFB1 network in simulations during signal induction and removal.



C Average activity over time for OVCA420 TGFB1 network in simulations during signal induction and inhibition.

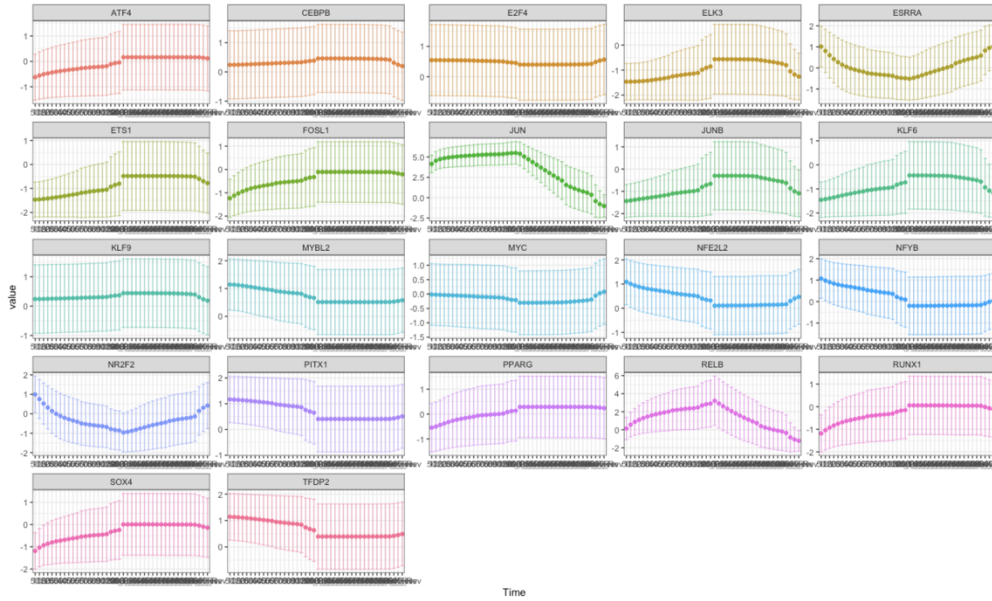


Figure S6. The mean and standard deviation of various TFs in the OVCA420 TGFB1 network at multiple time points in experiments (A) and simulations (B-C). The signal was applied till mid point and then removed (B) or inhibited (C). The expressions appear to increase/decrease suddenly at the mid-point as it corresponds to a large jump in time from $T=50$ to $T=2000$. Signal was removed or inhibited after $T = 2000$.

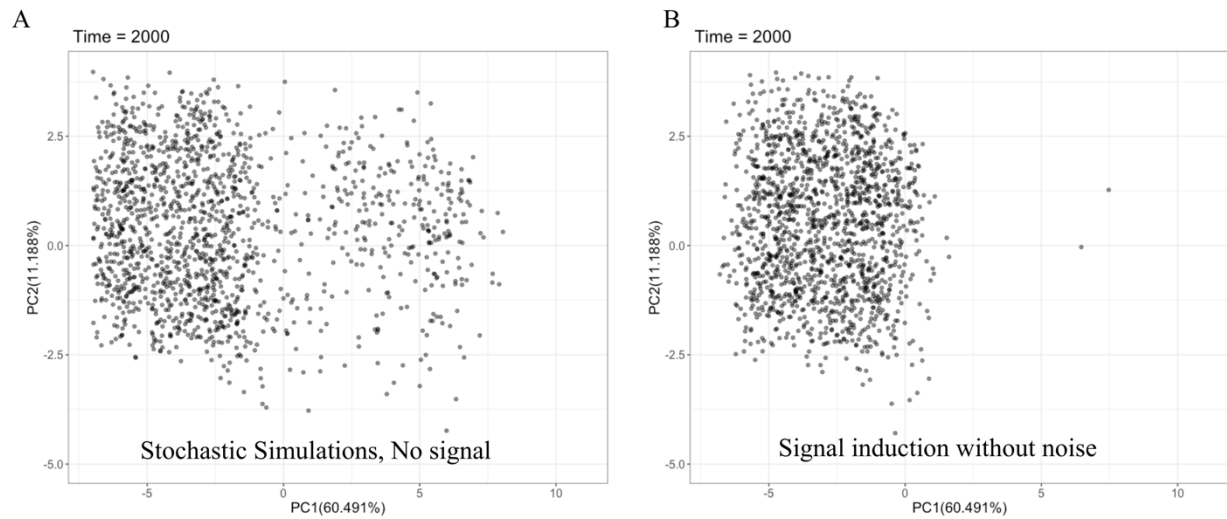


Figure S7. The simulated profiles at T=2000 using only noise (**A**) or only induction (**B**) in E-state models. The simulations indicate that either the noise (0.05 here) or signal induction only is not sufficient to drive state transitions for a substantial number of models. However, much more state transitions can be achieved by adding both noise and signal induction (Figure 7E in main text).

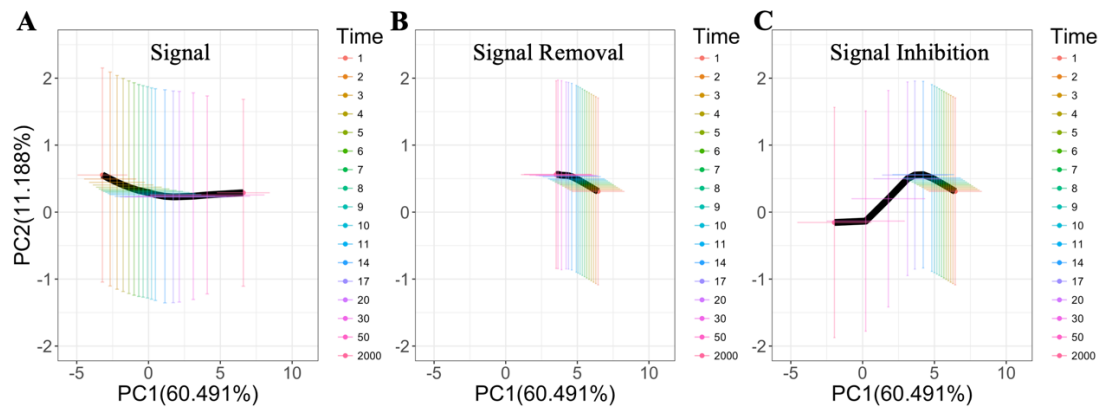


Figure S8. Mean and standard deviation of the simulated profiles of the E-state models that transited to M state during **(A)** signal induction (left), **(B)** removal (middle), and **(C)** inhibition (right) at multiple time points projected on the first two principal components of the simulated data of all models. These models were selected from all of the E models whose PC1 component was larger than 2.5 at the end of signal induction simulations. There are ~42% of E models belonging to this type.

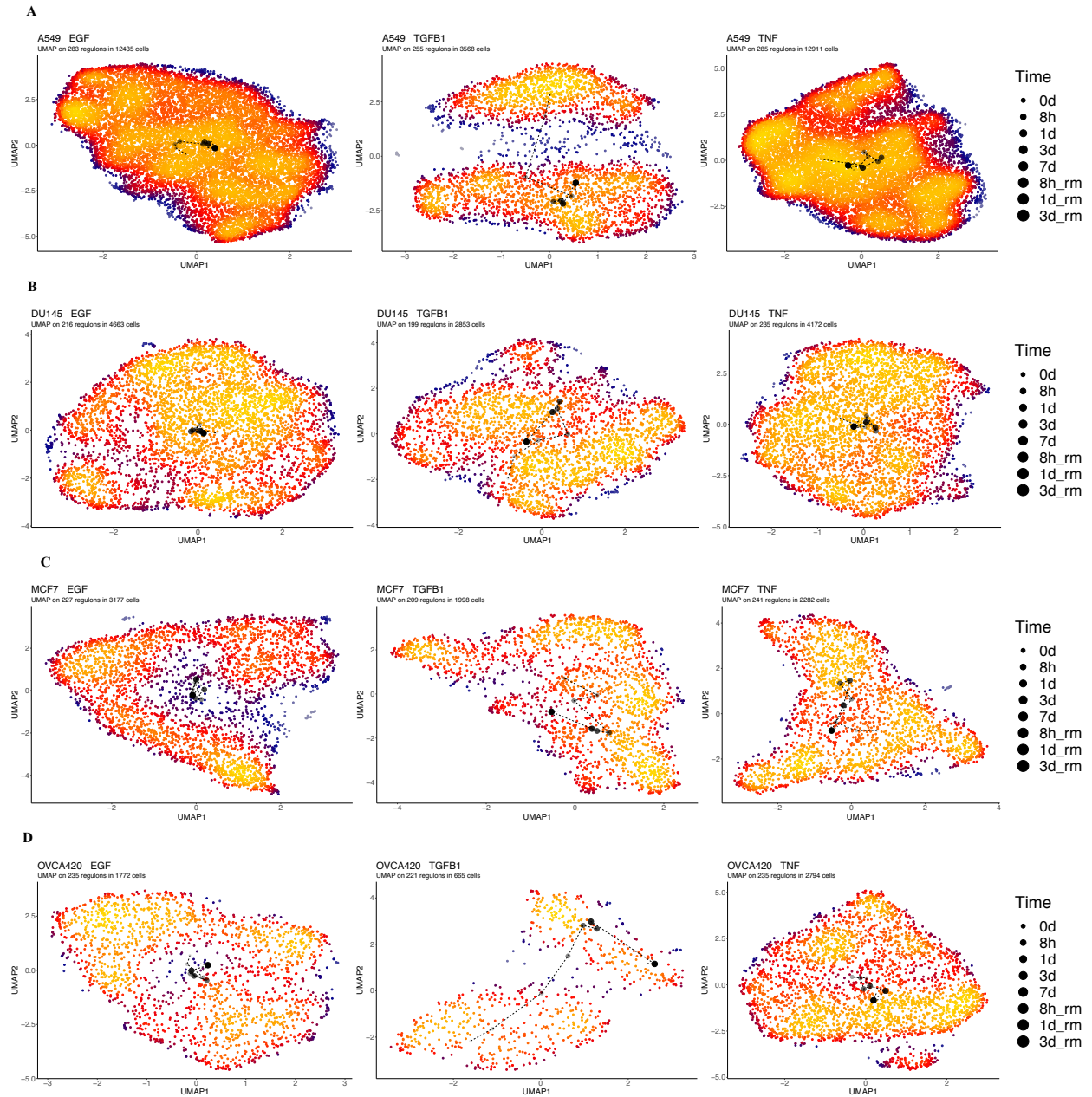


Figure S9. UMAP projections of regulon activity in (A) A549, (B) DU145, (C) MCF7, and (D) OVCA420 cells. Overlaid black points show centroids for each timepoint. Timepoint is also indicated by point size and transparency, and centroids for each timepoint are connected with a dashed line.

Table S1. Shared TFs in the core GRC, their phenotypic state assignments, and references.

Gene	State	Evidence (SI Reference Number)
BHLHE40	M?	1,31,40
CEBPB	M	2,19
CREB3	M	39
CREM		7,16
ELK3	M	5
ESRRA		37
ETS1	M	17
ETS2	M	3
FOS	E	22
FOSB	M	23,24
FOSL1	M	15
IRF1	M?	13,43,44
IRF2		
IRF3	E	42
IRF7	M	43
JUN		32
JUNB		32
KLF6	M	10
MAFG	E?	12
MYC	M	6
NFE2L3	M	45
NFKB	M	11,18,27
RELB	M	20
SOX4	M	38
SPDEF	E	35
STAT1		
STAT3	M	21
XBP1	M	34

Table S2. Literature-based core network interactions and supporting evidence.

Source	Target	Interaction Type*	Description	SI Reference Number
Sig	NFKB	1	TGFB/TNF/EGR activates NFKB	30, 36, 41
Sig	AP1	1	TGFB/TNF/EGR activates JUN/FOS	4,30,41
NFKB	AP1	1	NFKB activates FOS	8
AP1	AP1	2	JunB inhibits FOS	32
NFKB	NFKB	2	NFKB IKB form negative feedback loop	14,28
NFKB	SNAIL	1	NKFB signaling stablize SNAIL	41
SNAIL	SNAIL	2	SNAIL binds its own promoter and controls its expression	26
AP1	SNAIL	1	AP1 induces SNAIL expression	20
SNAIL	ZEB	1	SNAIL indirectly activates ZEB	25
ZEB	ZEB	1	ZEB indirectly activates ZEB expression	9,29
SNAIL	CDH1	2	SNAIL suppresses CDH1	33
ZEB	CDH1	2	SNAIL suppresses CDH1	33

*Interaction type 1 denotes activation and type 2 denotes inhibition.

Table S3. Properties of the networks shown in Fig. 6.

CellLine	A549			DU145			MCF7			OVCA420		
Signal	EGF	TGFB1	TNF	EGF	TGFB1	TNF	EGF	TGFB1	TNF	EGF	TGFB1	TNF
MiPositive	0.3	0.4	0.2	0.1	0.1	0.1	0.65	0.2	0.15	0.25	0.4	0.15
MiNegative	0.05	0.1	0.2	0.15	0.05	0.1	0.05	0.25	0.1	0.15	0.1	0.05
Accuracy	0.6285	0.9395	0.4095	0.955	0.5115	0.481	0.6625	0.529	0.8785	0.9845	0.877	0.0385
Nodes	30	13	33	46	39	46	30	40	60	31	29	49
Interactions	66	40	99	111	76	85	49	115	245	98	55	121
PositiveInteractions	18	36	96	109	70	83	2	111	233	96	34	101
EModels	977	1645	817	1769	983	948	800	1037	1730	1808	1407	8
MModels	280	234	2	141	40	14	525	21	27	161	347	69
Mgenes	12	12	22	22	24	29	2	5	35	16	16	4
Egenes	11	1	2	0	4	1	5	0	6	1	7	8
Transitivity	0.19466	0.49565	0.41758	0.21552	0.17045	0.15254	0.02013	0.26678	0.31181	0.37755	0.21145	0.21809
MeanDistance	9.03103	3.75000	8.08617	22.00000	18.31242	27.17343	20.52069	14.63397	17.95000	10.72258	15.96675	19.27806

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