

Angiogenesis signatures in cancer gene expression data



Dan Rhodes, PhD

May 2009

Agenda

- Background
- Angiogenesis Signatures
- Tumor populations
- Q & A

Background

- **Angiogenesis**
 - The normal process of forming new blood vessels, such as during development
- **Tumor Angiogenesis**
 - The process of establishing blood supply to a tumor
- **Angiogenesis inhibitors**
 - VEGF (Avastin) - Metastatic colon, breast ca., NSCLC, relapsed glioblastoma
 - VEGFRs (Sutent) - Metastatic RCC, GIST
 - Does clinical benefit vary by angiogenic activity?

Angiogenesis pathway

- Tumor secretes pro-angiogenic factors
- Receptors on endothelium signal
- Stimulates blood vessel growth and recruitment to tumor

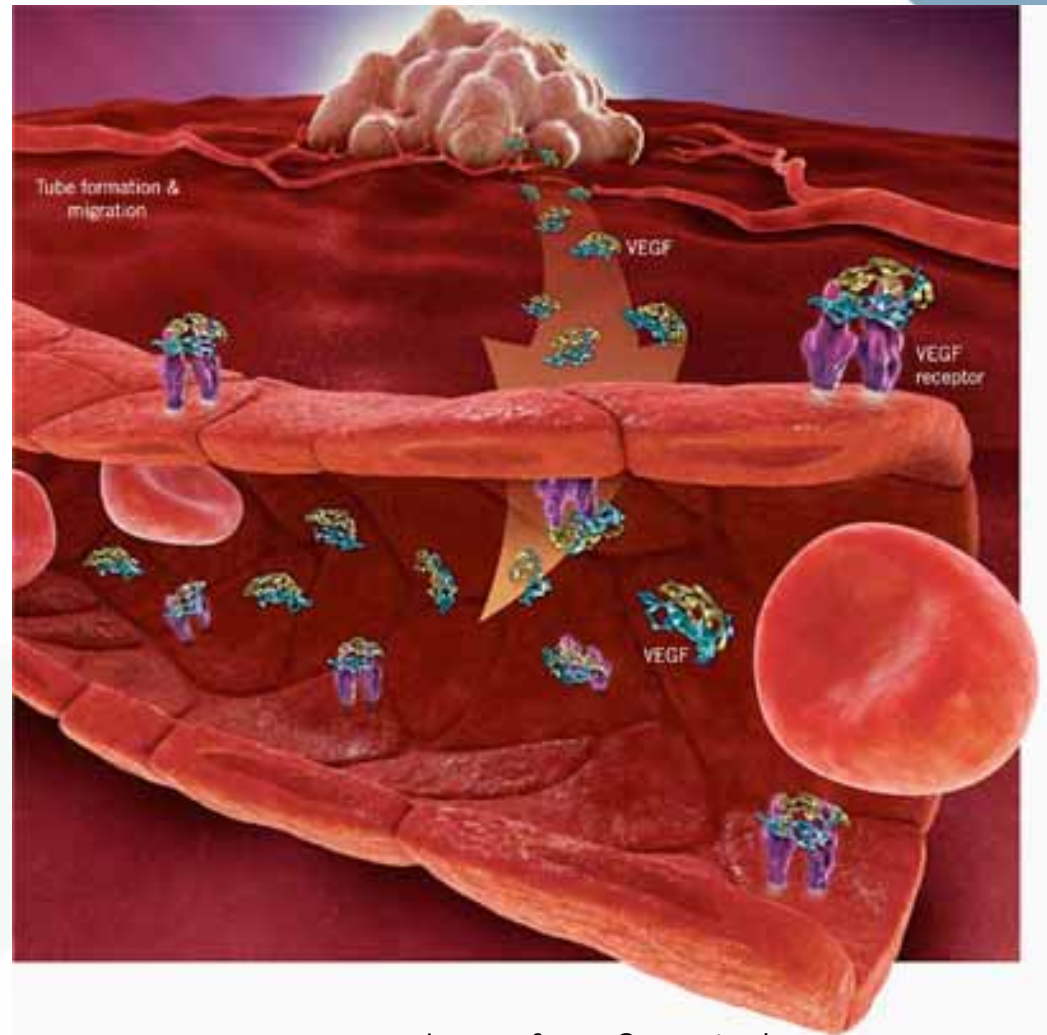


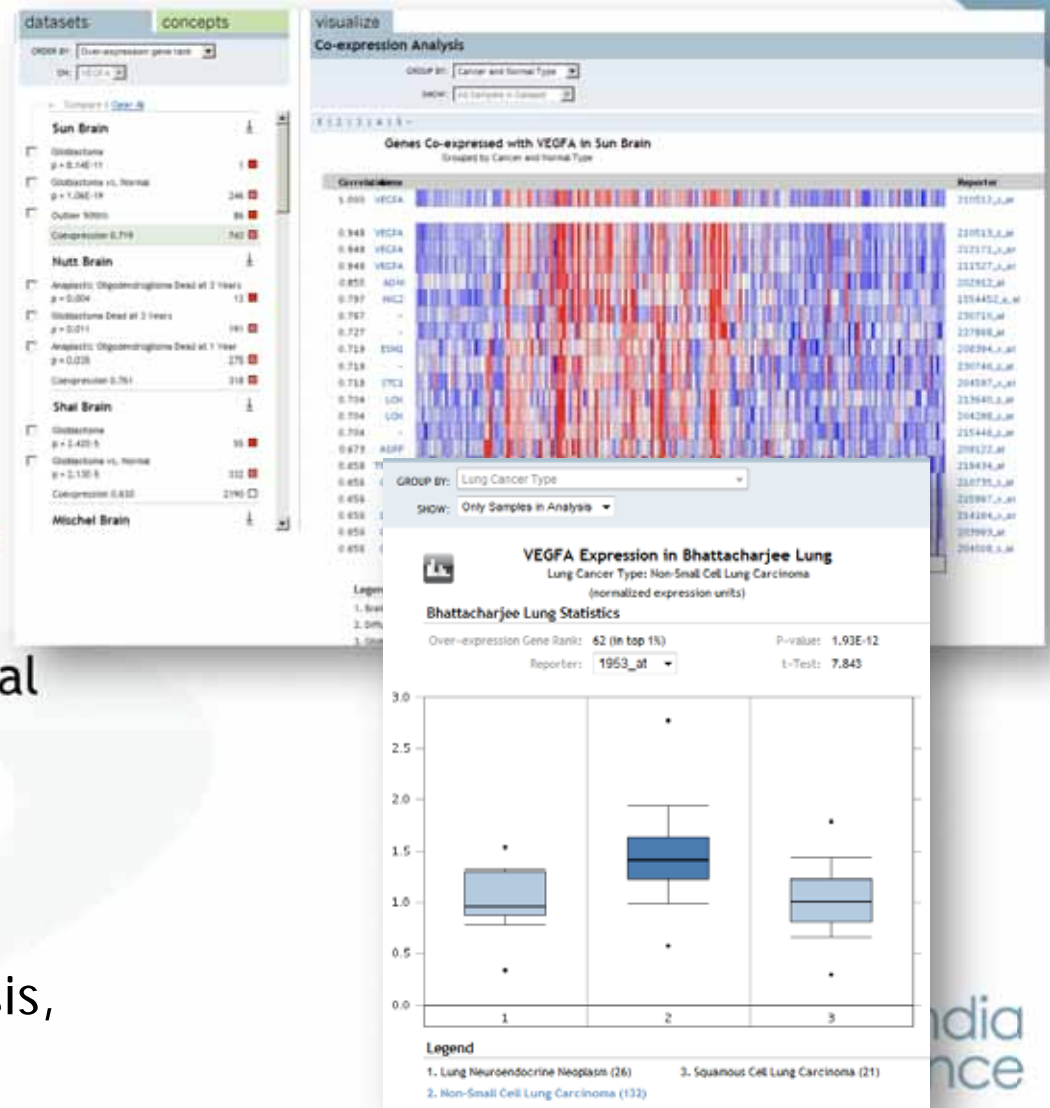
Image from Genentech
BioOncology.com

Hypothesis

- Tumors with increased angiogenic signaling are more susceptible to angiogenesis inhibitors
- A gene expression readout for angiogenic signaling can identify such tumors
- An angiogenesis signature should identify known indications and predict new indications
- Genes / pathways in the signature may represent new targets
- An angiogenesis signature could provide a tool to identify individual patients likely to benefit

OncoPrint

- Global collection of published microarray data
 - 33,000+ experiments
 - Tumors & cell lines
 - mRNA & DNA
- Standardized metadata
 - Clinical, pathology, molecular & experimental
- Pre-computed analysis
 - Differential expression, co-expression, outlier analysis, pathway analysis, molecular concepts



Angiogenesis signatures

- **Gene expression readout**
 - VEGF expression (& correlates)
 - Angiogenesis pathway
 - Hypoxic response
- **Correlated expression in tumors**
 - Co-regulation suggests representation of biological pathway in tumors

VEGFA expression in OncoPrint

Disease Summary for VEGFA

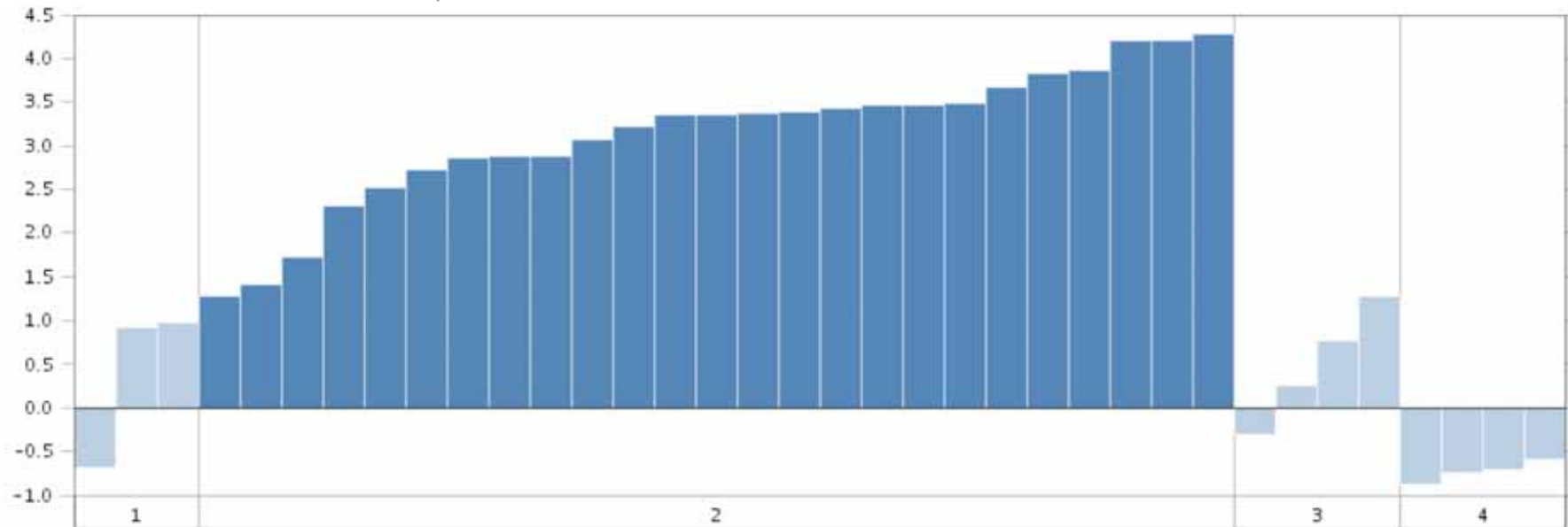
Analysis Cancer Type	Cancer vs. Normal		Cancer vs. Cancer										Pathway and Drug								
	Cancer vs. Normal	Cancer vs. Normal	Cancer Histology	Multi-cancer	Clinical Outcome	Metastasis vs. Primary	Molecular Subtype: Biomarker	Molecular Subtype: Mutation	Molecular Subtype: Other	Pathology Subtype: Grade	Pathology Subtype: Stage	Patient Treatment Response	Recurrence vs. Primary	DNA Copy Number	Drug Sensitivity	Perturbation					
Bladder Cancer	2	2																			
Brain and CNS Cancer	5		4	4	1				1					1							
Breast Cancer	1	1	2	2	2	5		7	1				3	1		1					
Cervical Cancer																					
Gastrointestinal Cancer	1																				
Head and Neck Cancer					1																
Kidney Cancer	3		2	2	2																
Leukemia		1	6	6					2	3											
Liver Cancer		1	1	1	1																
Lung Cancer	2	1	2	1		1							1			1					
Lymphoma	3		1	2	1																
Melanoma	1					1															
Myeloma	1		1						1												
Other Cancer	5		1	2																	
Ovarian Cancer	7			1																	
Pancreatic Cancer		1																			
Prostate Cancer		1				1															
Sarcoma			1																		
Not analyzed by Cancer Type																6	5				
Significant Analyses	31	8	21	21	4	4	6	2		7	4	4		5	4						
Total Analyses	236		436		139		299	42		118	7	163	28	130	5	196	24	15	17	84	213



VEGFA Expression in Higgins Renal

Renal Cell Carcinoma Type: Clear Cell Renal Cell Carcinoma
(normalized expression units)

Over-expression Gene Rank: 34 (in top 1%) P-value: 1.52E-9
Reporter: IMAGE:34778 t-Test: 10.478



Legend

1. Chromophobe Renal Cell Carcinoma (3) 2. [Clear Cell Renal Cell Carcinoma \(25\)](#) 3. Granular Renal Cell Carcinoma (4) 4. Papillary Renal Cell Carcinoma (4)

Higgins Renal

Am J Pathol 2003/03/01 44 samples
mRNA 5,794 measured genes
Platform not pre-defined in Oncomine

•Copyright© Oncomine, 2008 Images from Oncomine™ may be used in publications with proper citation. The citation for Oncomine is as follows: Oncomine™ (Compendia Bioscience, Ann Arbor, MI) was used for analysis and visualization. For further information, refer to the terms described in the license agreement.

•Oncomine Source: [https://qa6.oncomine.com:443/resource/main.html#a:717;cv:detail;d:82;dso:geneOverex;dt:predefinedClass;ec:\[2\];epv:150001,150829;et:over;f:432451;g:7422;p:200000550;pg:1;pvf:39129,150014,150817;scr:datasets;ss:analysis;th:g10.0,p1.00E-4;v:5](https://qa6.oncomine.com:443/resource/main.html#a:717;cv:detail;d:82;dso:geneOverex;dt:predefinedClass;ec:[2];epv:150001,150829;et:over;f:432451;g:7422;p:200000550;pg:1;pvf:39129,150014,150817;scr:datasets;ss:analysis;th:g10.0,p1.00E-4;v:5)



•Comparison of PGF, VEGFA and VEGFC in Gumz Renal

•Over-expression in Clear Cell Renal Cell Carcinoma vs. Normal

Rank	P-value	Gene	Heatmap																				Reporter	Gene
14	3.47E-11	VEGFA	1										2										210512_s_at	VEGFA
741	4.38E-5	PGF	1										2										209652_s_at	PGF
3369	0.045	VEGFC	1										2										209946_at	VEGFC

•Legend

•1. Kidney (10) 2. Clear Cell Renal Cell Carcinoma (10)

•Gumz Renal

Clin Cancer Res 2007/08/15

20 samples

mRNA

12,427 measured genes

Human Genome U133A Array

Least Expressed



Most Expressed



Not measured

•Note: Colors are z-score normalized to depict relative expression levels within rows. They cannot be used to compare gene expression values between rows.

•Copyright© Oncomine, 2008 Images from Oncomine™ may be used in publications with proper citation. The citation for Oncomine is as follows: Oncomine™ (Compendia Bioscience, Ann Arbor, MI) was used for analysis and visualization. For further information, refer to the terms described in the license agreement.

•Oncomine Source: [https://qa6.oncomine.com:443/resource/main.html#a:1846;cv:detail;d:67367807;dso:geneOverex;dt:predefinedClass;ec:\[2\];epv:150001,150829;et:over;f:546247;g:7422;p:200001292;pg:1;pvf:31379,39129,39131,150004,150817;scr:datasets;ss:analysis;th:g10.0,p1.00E-4;v:5](https://qa6.oncomine.com:443/resource/main.html#a:1846;cv:detail;d:67367807;dso:geneOverex;dt:predefinedClass;ec:[2];epv:150001,150829;et:over;f:546247;g:7422;p:200001292;pg:1;pvf:31379,39129,39131,150004,150817;scr:datasets;ss:analysis;th:g10.0,p1.00E-4;v:5)

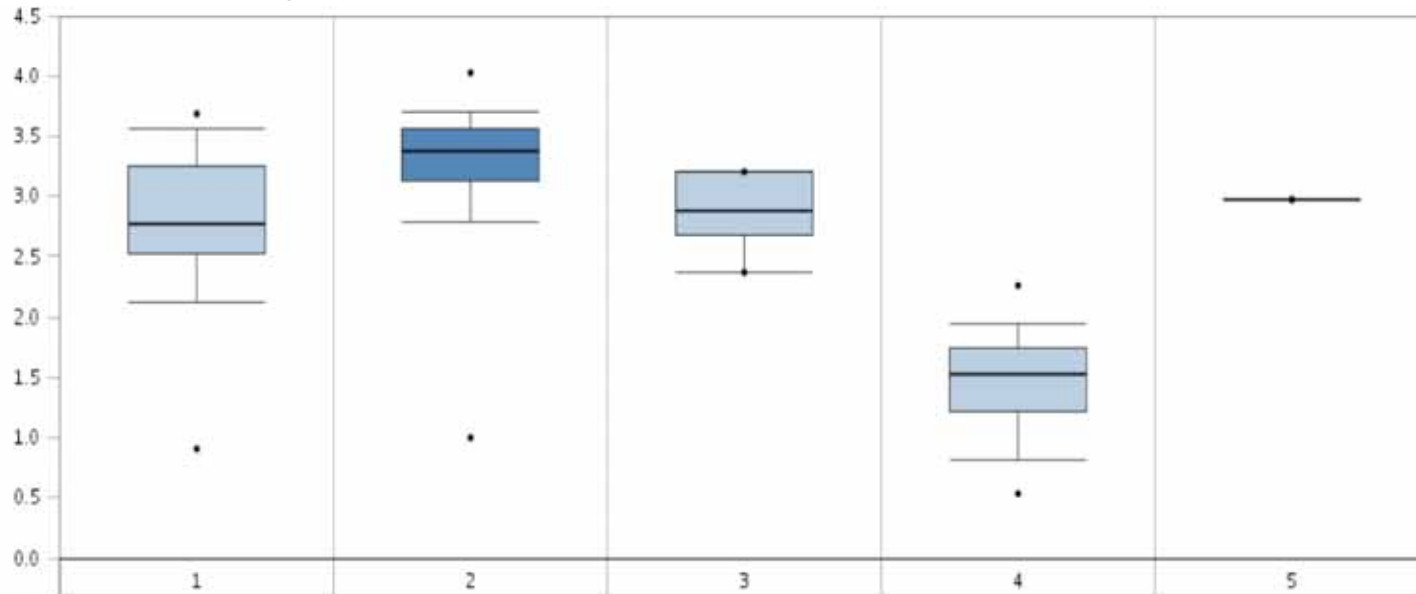


•VEGFA Expression in Bittner Renal

•Renal Cell Carcinoma Type: Clear Cell Renal Cell Carcinoma

•(normalized expression units)

Over-expression Gene Rank: 134 (in top 1%) P-value: 2.01E-11
Reporter: 210512_s_at t-Test: 8.544



•Legend

•1. Chromophobe Renal Cell Carcinoma (16) 2. Clear Cell Renal Cell Carcinoma (184) 3. Granular Renal Cell Carcinoma (5) 4. Papillary Renal Cell Carcinoma (21) 5. Sarcomatoid Renal Cell Carcinoma (1)

•Bittner Renal

Not Published 2005/01/15

256 samples

mRNA

19,079 measured genes

Human Genome U133 Plus 2.0 Array

•Copyright© Oncomine, 2008 Images from Oncomine™ may be used in publications with proper citation. The citation for Oncomine is as follows: Oncomine™ (Compendia Bioscience, Ann Arbor, MI) was used for analysis and visualization. For further information, refer to the terms described in the license agreement.

•Oncomine Source: [https://qa6.oncomine.com:443/resource/main.html#a:224;cv:detail;d:97370307;dso:geneOverex;dt:predefinedClass;ec:\[2\];epv:150001,150829;et:over;f:1905655;g:7422;gt:boxplot;p:200000163;pg:1;pvf:39129,150014,150817;scr:datasets;ss:analysis;th:g10.0,p1.00E-4;v:5](https://qa6.oncomine.com:443/resource/main.html#a:224;cv:detail;d:97370307;dso:geneOverex;dt:predefinedClass;ec:[2];epv:150001,150829;et:over;f:1905655;g:7422;gt:boxplot;p:200000163;pg:1;pvf:39129,150014,150817;scr:datasets;ss:analysis;th:g10.0,p1.00E-4;v:5)

SEARCH

filter

selected 13 datasets (1757 samples)

- Gene: VEGFA
- Analysis Cancer Type: Lung Cancer
- Analysis Type: Cancer Histology Analysis

Primary Filters

Analysis Type

- + Cancer Subtype Analysis (21)
- + Cancer vs. Cancer Analysis (23)
- + Cancer vs. Normal Analysis (10)
 - DNA Copy Number Analysis (1)
- + Normal vs. Normal Analysis (2)
 - Outlier Analysis (25)
- + Pathway and Drug Analysis (10)

Analysis Cancer Type

- Bladder Cancer (9)
- Brain and CNS Cancer (15)
- Breast Cancer (24)
- Cervical Cancer (2)
- Gastrointestinal Cancer (12)
- Head and Neck Cancer (2)
- Kidney Cancer (6)
- Leukemia (17)
- Liver Cancer (4)
- Lung Cancer (13)**
- Lymphoma (14)

ORDER BY: Over-expression gene rank

ON: VEGFA

Compare | Clear All

Chen Lung 3

- Lung Cancer Type: Non-Small Cell Lung Carcinoma
p = 0.005 28
- Non-Small Cell Lung Carcinoma Type: Large Cell Lung Carcinoma
p = 0.180 198
- Lung Cancer Type: Lung Neuroendocrine Neoplasm
p = 0.352 260
- Coexpression 0.415 73

Bhattacharjee Lung

- Lung Cancer Type: Non-Small Cell Lung Carcinoma
p = 1.93E-12 62

Su Multi-cancer

- Lung Cancer Type: Non-Small Cell Lung Carcinoma
p = 8.88E-4 137

Garber Lung

- Lung Cancer Type: Non-Small Cell Lung Carcinoma
p = 7.20E-5 412
- Coexpression 0.620 501

Bild Lung

Tomida Lung

Bitter Lung

Pre-defined Classes Analysis

OTHER

GROUP BY: Lung Cancer Type

SHOW: Only Samples in Analysis



VEGFA Expression in Bhattacharjee Lung

Lung Cancer Type: Non-Small Cell Lung Carcinoma
(normalized expression units)

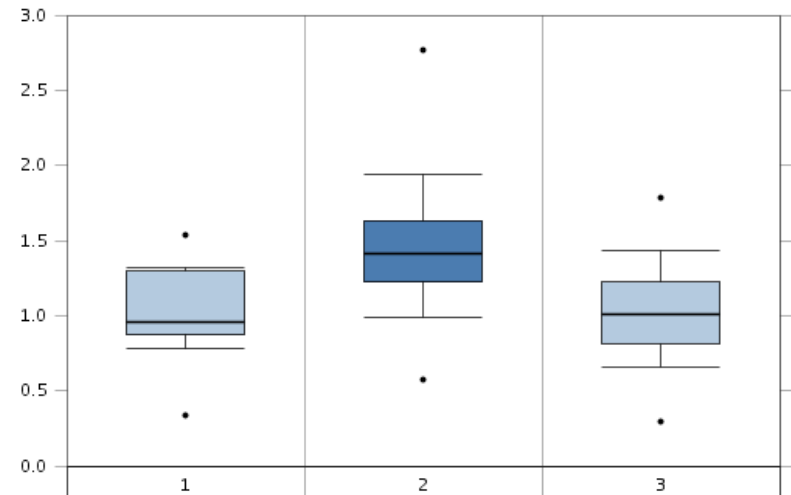
Bhattacharjee Lung Statistics

Over-expression Gene Rank: 62 (in top 1%)

P-value: 1.93E-12

Reporter: 1953_at

t-Test: 7.843



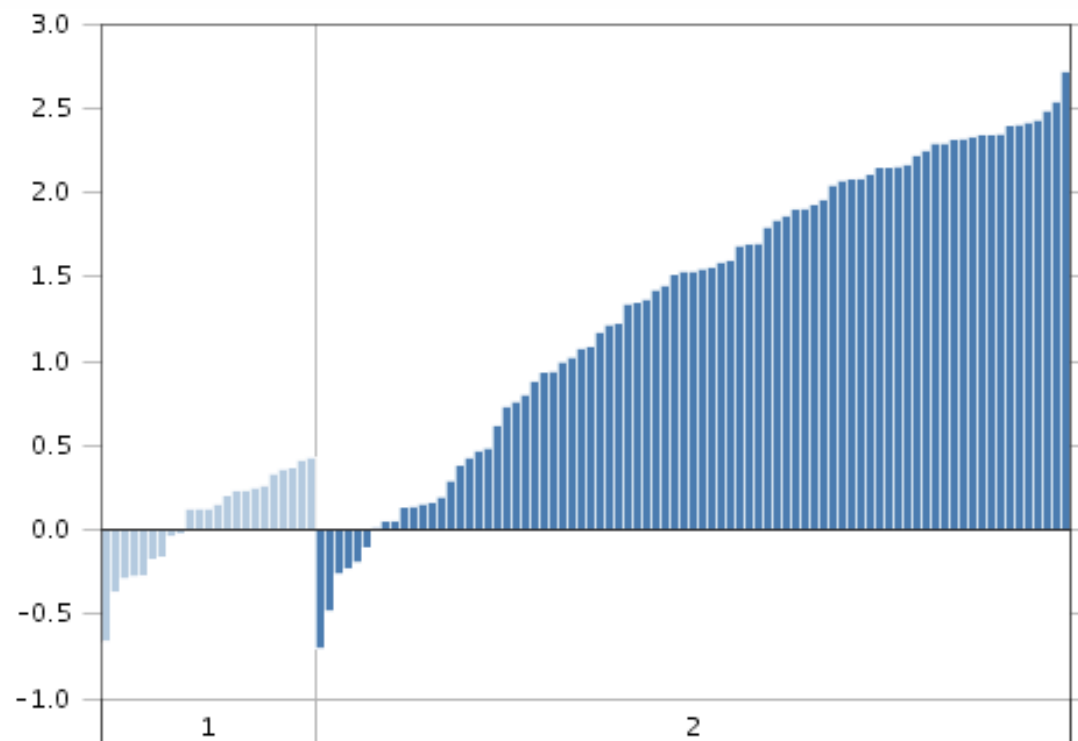
Legend

- 1. Lung Neuroendocrine Neoplasm (26)
- 2. Non-Small Cell Lung Carcinoma (132)
- 3. Squamous Cell Lung Carcinoma (21)

Is VEGF expression high in normal brain tissues?

VEGFA expression is low in normal brain tissue, but high in glioblastoma

VEGFA Expression in Sun Brain
Glioblastoma vs. Normal
(normalized expression units)



Legend

- 1. Brain
- 2. Glioblastoma

VEGFA Cluster from Sun_Brain

search

filter

selected 1 datasets (81 samples)

- Gene: VEGFA (Search: vegf)
- Cancer Type: Glioblastoma
- Concept Type: Oncoine Clusters
- Dataset Name: Sun Brain

Primary Filters

- Analysis Type
 - Cancer Types Analysis (1)
 - Cancer vs. Normal Analysis (1)
 - Cancer Type
- Sample Filters
- Dataset Filters
- Concept Filters

datasets | **concepts**

Select a primary concept to compare with other concepts.

Sun Brain - cluster ID n3808 [214]
Oncoine Clusters

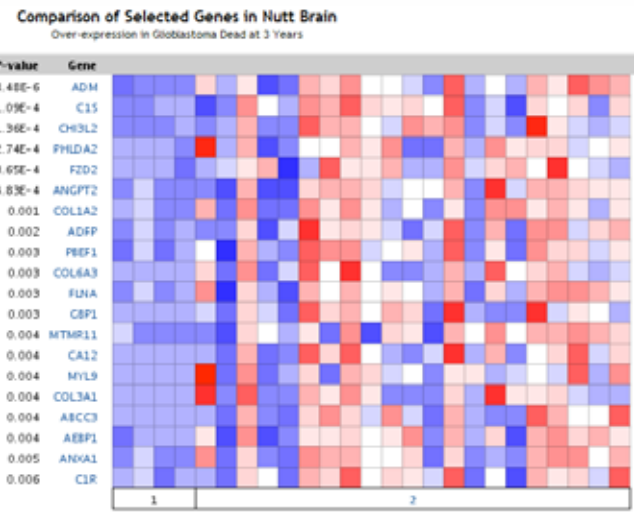
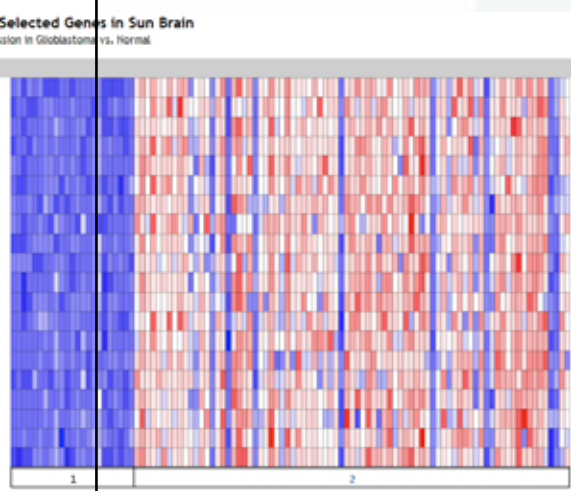
visualize

Concept Details OTHER VIEWS: ▶
EXPORT: ▶

Concept:

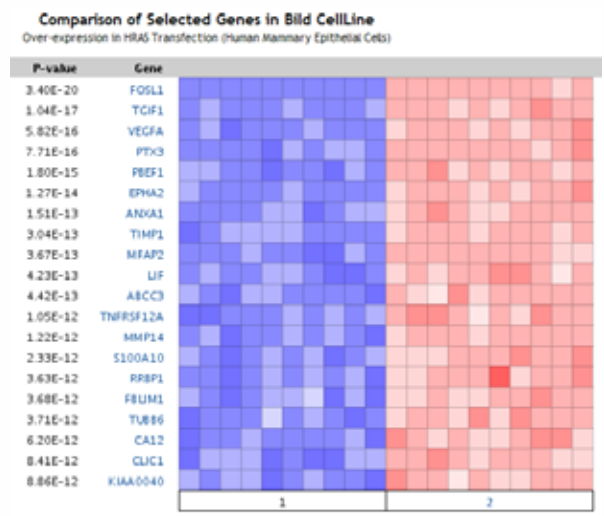
Name: Sun Brain - cluster ID n3808
 Concept Type: Oncoine Clusters
 Size: 214 genes
 Null List: Human Genome U133 Plus 2.0 Array (19079)

- Gene List: (214)**
- ABCC3 ATP-binding cassette, sub-family C (CFTR/MRP), member 3
 - ACTN1 actinin, alpha 1
 - ADAM12 ADAM metalloproteinase domain 12 (metrin alpha)
 - ADFP adipose differentiation-related protein
 - ADM adrenomedullin
 - AEBP1 AE binding protein 1
 - AFAP1L1 actin filament associated protein 1-like 1
 - ALPK3 alpha-kinase 3
 - ANGPT2 angiotensin 2
 - ANTXR1 anthrax toxin receptor 1
 - ANXA1 annexin A1



legend

- Glioblastoma - Alive at 3 Years
- Glioblastoma - Dead at 3 Years



legend

- GFP Transfection Control (Human Mammary Epithelial Cells)
- HRAS Transfection (Human Mammary Epithelial Cells)

Genes Co-expressed with VEGFA

datasets **concepts**

ORDER BY: Over-expression gene rank

ON: VEGFA

Compare | Clear All

Sun Brain

- Glioblastoma
p = 8.14E-11 1
- Glioblastoma vs. Normal
p = 1.06E-19 246
- Outlier 90th% 86
- Coexpression 0.719 743**

Nutt Brain

- Anaplastic Oligodendroglioma Dead at 3 Years
p = 0.004 13
- Glioblastoma Dead at 3 Years
p = 0.011 191
- Anaplastic Oligodendroglioma Dead at 1 Year
p = 0.035 275
- Coexpression 0.761 318

Shai Brain

- Glioblastoma
p = 2.42E-5 55
- Glioblastoma vs. Normal
p = 2.13E-5 332
- Coexpression 0.630 2190

Mischel Brain

visualize

Co-expression Analysis

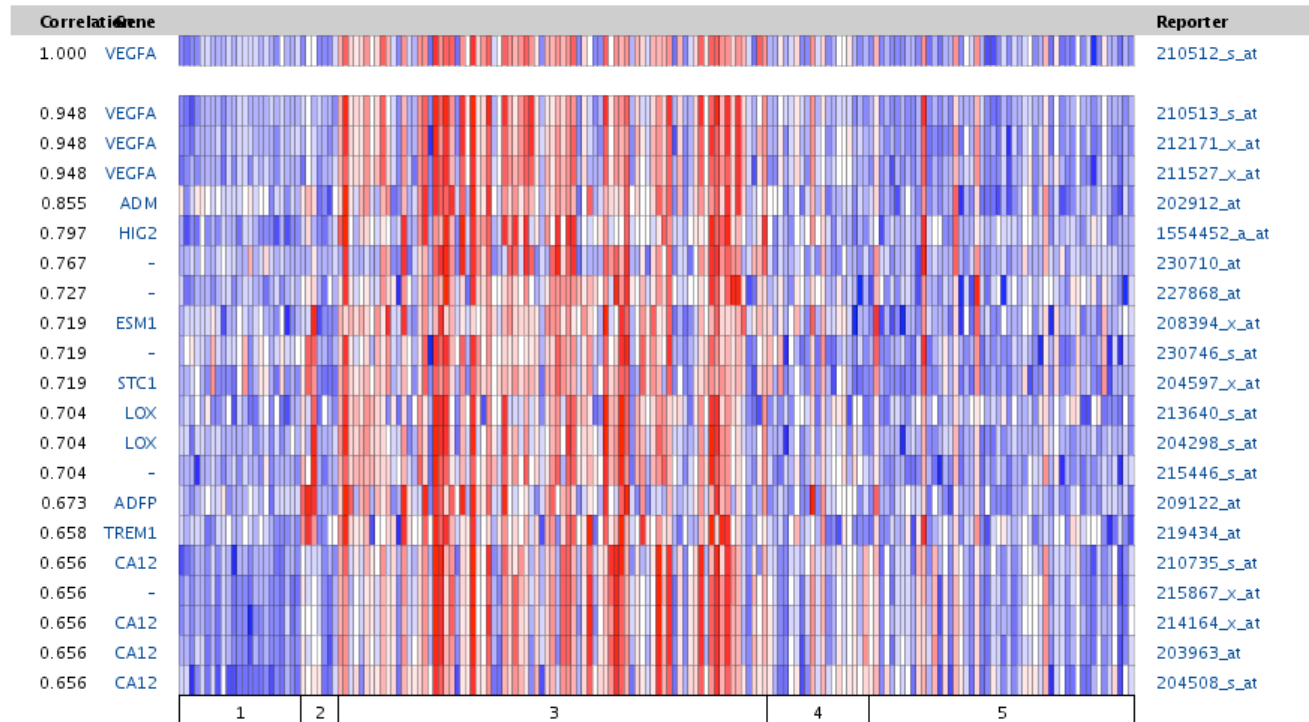
GROUP BY: Cancer and Normal Type

SHOW: All Samples in Dataset

1 | 2 | 3 | 4 | 5 »

Genes Co-expressed with VEGFA in Sun Brain

Grouped by Cancer and Normal Type



Legend

- 1. Brain
- 4. Anaplastic Astrocytoma
- 2. Diffuse Astrocytoma
- 5. Oligodendroglioma
- 3. Glioblastoma

Concepts Associated with VEGFA

search

filter

1.1 selected 25 datasets (636 samples)

- Gene: VEGFA (Search: vegf)
- Concepts: Sun Brain - cluster ID n3808 - Oncomine Clusters
- Cancer Type: Glioblastoma
- Concept Type: Oncomine Clusters

Primary Filters

- Analysis Type
 - + Cancer Subtype Analysis (9)
 - + Cancer Types Analysis (18)
 - Cancer vs. Normal Analysis (7)
 - + Normal Tissue Analysis (1)
 - + Pathway and Drug Analysis (4)
- Dataset Type
 - + Cell Line Panel Datasets (7)
 - DNA Copy Number Datasets (3)
 - Multi-Cancer Panel Datasets (2)
 - Normal Tissue Panel Datasets (1)
- + Cancer Type

Sample Filters

Dataset Filters

Concept Filters

datasets associated concepts

Primary Concept: Sun Brain - cluster ID n3808 - Oncomine Clusters

Freije Brain - cluster ID n7713
Oncomine Clusters
p = 2.07E-159 q = 1.30E-154 Odds = 74.7

Bredel Brain 2 - cluster ID n5965
Oncomine Clusters
p = 1.16E-105 q = 1.21E-101 Odds = 47.6

Hutt Brain - cluster ID n4820
Oncomine Clusters
p = 1.78E-30 q = 8.56E-28 Odds = 27.6

vandenBom Brain - cluster ID n3158
Oncomine Clusters
p = 3.18E-27 q = 1.12E-24 Odds = 31.1

Dong Brain - cluster ID n8676
Oncomine Clusters
p = 3.31E-14 q = 3.74E-12 Odds = 16.0

Shai Brain - cluster ID n5248
Oncomine Clusters
p = 1.16E-13 q = 1.23E-11 Odds = 129.4

Mueßer Brain - cluster ID n9631
Oncomine Clusters
p = 6.67E-6 q = 2.25E-4 Odds = 3.3

Liang Brain - cluster ID n8173
Oncomine Clusters
p = 4.47E-5 q = 0.001 Odds = 27.3

visualize

Concept Association Results OTHER VIEWS: ▶

EXPORT: ▶

Primary Concept:

Name: Sun Brain - cluster ID n3808
Concept Type: Oncomine Clusters
Size: 214 genes
Null List: Human Genome U133 Plus 2.0 Array (19079)

Associated Concept:

Name: Freije Brain - cluster ID n7713
Concept Type: Oncomine Clusters
Size: 585 genes
Null List: Human Genome U133A Array (12427)
Human Genome U133B Array (8497)

Interaction:

P-value: 2.07E-159 Q-value: 1.30E-154 Odds Ratio: 74.7 Size: 141 genes

AUCC3	ATP-binding cassette, sub-family C (CFTR/MRP), member 3
ACTN1	actinin, alpha 1
ADAH12	ADAM metallopeptidase domain 12 (meitrin alpha)
ADM	adrenomedullin
AEBP1	AE binding protein 1
ANGPT2	angiopoietin 2
ANXA1	annexin A1
ANXA2	annexin A2
ANXA2P2	annexin A2 pseudogene 2
APOL1	apolipoprotein L, 1
ARHGAP18	Rho GTPase activating protein 18
BCL3	B-cell CLL/lymphoma 3
DGN	biglycan

ECM Concept Associated with VEGFA

search

filter

selected 421 datasets (30728 samples)

- Concept: Sun Brain - cluster ID n3808 - Oncome Clusters
- Concept Type: Biology Concepts

Primary Filters

- Analysis Type
 - + Cancer Subtype Analysis (227)
 - + Cancer Types Analysis (137)
 - Cancer vs. Normal Analysis (131)
 - + Normal Tissue Analysis (7)
 - + Pathway and Drug Analysis (75)
- Dataset Type
 - + Cell Line Panel Datasets (43)
 - DNA Copy Number Datasets (12)
 - Multi-Cancer Panel Datasets (9)
 - Normal Tissue Panel Datasets (10)
- + Cancer Type

Sample Filters

Dataset Filters

Concept Filters

datasets associated concepts

Primary Concept: Sun Brain - cluster ID n3808 - Oncome Clusters

extracellular matrix structural constituent
GO Molecular Function
p = 2.35E-13 q = 2.44E-11 Odds = 17.8

COL1A1
HPRD Interaction Sets
p = 7.51E-12 q = 6.63E-10 Odds = 30.7

collagen
GO Cellular Component
p = 1.61E-10 q = 1.19E-8 Odds = 48.1

Collagen helix repeat
InterPro Protein Domains and Families
p = 1.01E-9 q = 6.71E-8 Odds = 19.2

COL1A2
HPRD Interaction Sets
p = 1.08E-9 q = 7.13E-8 Odds = 41.2

Collagen triple helix repeat
InterPro Protein Domains and Families
p = 5.37E-9 q = 3.23E-7 Odds = 13.1

ITGB1
HPRD Interaction Sets
p = 5.60E-9 q = 3.36E-7 Odds = 10.4

cell adhesion
GO Biological Process
p = 1.61E-8 q = 9.05E-7 Odds = 4.6

visualize

Concept Association Results OTHER VIEWS: ▶

EXPORT: ▶

Primary Concept:

Names: Sun Brain - cluster ID n3808
Concept Type: Oncome Clusters
Size: 214 genes
Null List: Human Genome U133 Plus 2.0 Array (19079)

Associated Concept: ▶ Primary Concept

Name: extracellular matrix structural constituent
Concept Type: GO Molecular Function (GO)
Size: 79 genes
Null List: Gene Ontology (14239)

Interaction:

P-value: 2.35E-13 Q-value: 2.44E-11 Odds Ratio: 17.8 Size: 15 genes

BGN	biglycan
CHI3L1	chitinase 3-like 1 (cartilage glycoprotein-39)
COL1A1	collagen, type I, alpha 1
COL1A2	collagen, type I, alpha 2
COL3A1	collagen, type III, alpha 1 (Ehlers-Danlos syndrome type IV, autosomal dominant)
COL4A1	collagen, type IV, alpha 1
COL4A2	collagen, type IV, alpha 2
COL5A1	collagen, type V, alpha 1
COL5A2	collagen, type V, alpha 2
COL6A2	collagen, type VI, alpha 2
ELN	elastin (supravalvular aortic stenosis, Williams-Beuren syndrome)
EMILIN1	elastin microfibril interlacer 1
FBN1	fibronectin 1
LUM	lumican
MFAP2	microfibrillar-associated protein 2

Angiogenesis Associated with VEGFA

search

filter

1 selected 421 datasets (30728 samples)

- Concept: Sun Brain - cluster ID n3808 - Oncome Clusters
- Concept Type: Biology Concepts

Primary Filters

- Analysis Type
 - + Cancer Subtype Analysis (227)
 - + Cancer Types Analysis (137)
 - Cancer vs. Normal Analysis (131)
 - + Normal Tissue Analysis (7)
 - + Pathway and Drug Analysis (75)
- Dataset Type
 - + Cell Line Panel Datasets (43)
 - DNA Copy Number Datasets (12)
 - Multi-Cancer Panel Datasets (9)
 - Normal Tissue Panel Datasets (10)
 - + Cancer Type

Sample Filters

Dataset Filters

Concept Filters

datasets associated concepts

Primary Concept: Sun Brain - cluster ID n3808 - Oncome Clusters

extracellular matrix structural constituent
GO Molecular Function
p = 2.35E-13 q = 2.44E-11 Odds = 17.8

COL1A1
HPRD Interaction Sets
p = 7.51E-12 q = 6.63E-10 Odds = 30.7

collagen
GO Cellular Component
p = 1.61E-10 q = 1.19E-8 Odds = 48.1

Collagen helix repeat
InterPro Protein Domains and Families
p = 1.01E-9 q = 6.71E-8 Odds = 19.2

COL1A2
HPRD Interaction Sets
p = 1.08E-9 q = 7.15E-8 Odds = 41.2

Collagen triple helix repeat
InterPro Protein Domains and Families
p = 5.37E-9 q = 3.23E-7 Odds = 13.1

ITGB1
HPRD Interaction Sets
p = 5.60E-9 q = 3.36E-7 Odds = 10.4

cell adhesion
GO Biological Process
p = 1.61E-8 q = 9.05E-7 Odds = 4.6

visualize

Concept Association Results OTHER VIEWS: ▶

EXPORT: ▶

Primary Concept:

Name: Sun Brain - cluster ID n3808
Concept Type: Oncome Clusters
Size: 214 genes
Null List: Human Genome U133 Plus 2.0 Array (19079)

Associated Concept: Primary Editor

Name: angiogenesis
Concept Type: GO Biological Process (GO)
Size: 35 genes
Null List: Gene Ontology (14239)

Interaction:

P-value: 1.29E-4 Q-value: 0.003 Odds Ratio: 11.8 Size: 5 genes

ANGPT2	angiopoietin 2
JAG1	Jagged 1 (Alagille syndrome)
HRP1	neuropilin 1
TNFRSF12A	tumor necrosis factor receptor superfamily, member 12A
VEGFA	vascular endothelial growth factor A

Angiogenesis Pathway



Concept Information

Concept:

Name: angiogenesis

Concept Type: GO Biological Process (GO)

Size: 35 genes

Null List: Gene Ontology (14239)

- Growth factors, receptors

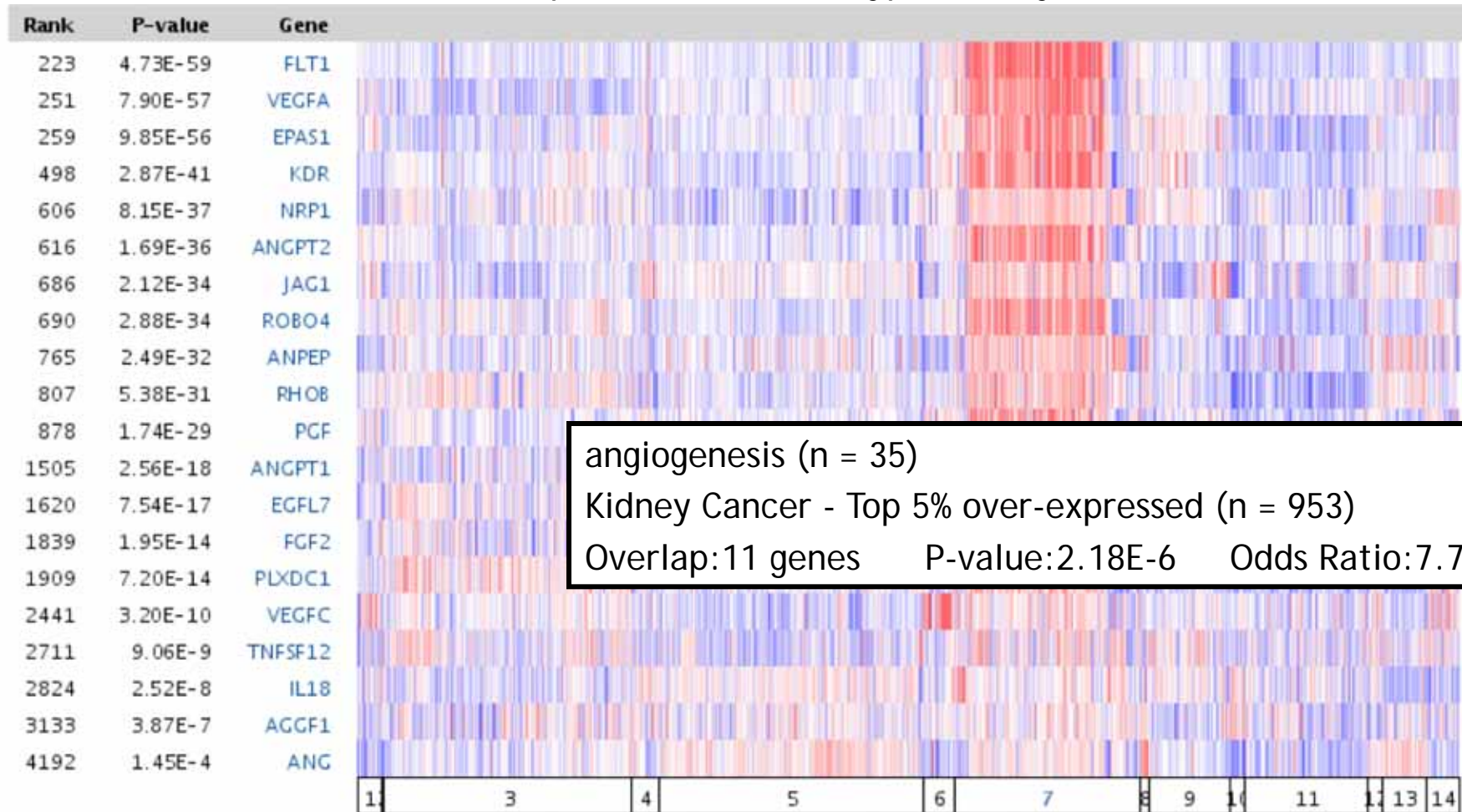
AGGF1	angiogenic factor with G patch and FHA domains 1
ANG	angiogenin, ribonuclease, RNase A family, 5
ANGPT1	angiopoietin 1
ANGPT2	angiopoietin 2
ANPEP	alanyl (membrane) aminopeptidase (aminopeptidase N, aminopeptidase M, microaminopeptidase, CD13, p150)
ECGF1	endothelial cell growth factor 1 (platelet-derived)
EGFL7	EGF-like-domain, multiple 7
EPAS1	endothelial PAS domain protein 1
EREG	epiregulin
FGF1	fibroblast growth factor 1 (acidic)
FGF2	fibroblast growth factor 2 (basic)
FGF6	fibroblast growth factor 6
FIGF	c-fos induced growth factor (vascular endothelial growth factor D)
FLT1	fms-related tyrosine kinase 1 (vascular endothelial growth factor/vascular permeability factor receptor)
HAND2	heart and neural crest derivatives expressed 2
IL18	interleukin 18 (interferon-gamma-inducing factor)
IL8	interleukin 8
JAG1	jagged 1 (Alagille syndrome)
KDR	kinase insert domain receptor (a type III receptor tyrosine kinase)
MMP19	matrix metalloproteinase 19
NARG1	NMDA receptor regulated 1
NRP1	neuropilin 1
NRP2	neuropilin 2
PGF	placental growth factor, vascular endothelial growth factor-related protein
PLXDC1	plexin domain containing 1
PROK2	prokineticin 2
RHOB	ras homolog gene family, member B
ROBO4	roundabout homolog 4, magic roundabout (Drosophila)
SH2D2A	SH2 domain protein 2A
TMPRSS6	transmembrane protease, serine 6
TNFAIP2	tumor necrosis factor, alpha-induced protein 2
TNFRSF12A	tumor necrosis factor receptor superfamily, member 12A
TNFSF12	tumor necrosis factor (ligand) superfamily, member 12
VEGFA	vascular endothelial growth factor A
VEGFC	vascular endothelial growth factor C

Angiogenesis pathway associations

OncoPrint Signatures	#	Avg (OR)
Cancer Type: Kidney Cancer	4	7.0
Sarcoma Type: Liposarcoma	3	7.3
Acute Leukemia Type: Acute Myeloid Leukemia	2	5.0
Acute Myeloid Leukemia - CBFβ-MYH11 Gene Fusion	2	6.0
Brain and CNS Cancer Type: Glioblastoma	2	7.5
Ductal Breast Carcinoma Type: Invasive Ductal Breast Carcinoma	2	7.5
Lymphoma Type: Diffuse Large B-Cell Lymphoma	2	5.5
Mature B-Cell Non-Hodgkin's Lymphoma Type: Diffuse Large B-Cell Lymphoma	2	5.5
Renal Cell Carcinoma Type: Clear Cell Renal Cell Carcinoma	2	8.0

Angiogenesis genes

Over-expression in Cancer Type: Kidney Cancer



Legend

1. Bladder Cancer (32) 2. Brain and CNS Cancer (4) 3. Breast Cancer (328) 4. Cervical Cancer (35) 5. Gastrointestinal Cancer (350) 6. Head and Neck Cancer (41) 7. **Kidney Cancer (246)** 8. Liver Cancer (11) 9. Lung Cancer (107) 10. Lymphoma (19) 11. Ovarian Cancer (164) 12. Pancreatic Cancer (19) 13. Prostate Cancer (59) 14. Sarcoma (42)

Bittner Multi-cancer

Not Published 2006/01/01

1,911 samples

mRNA

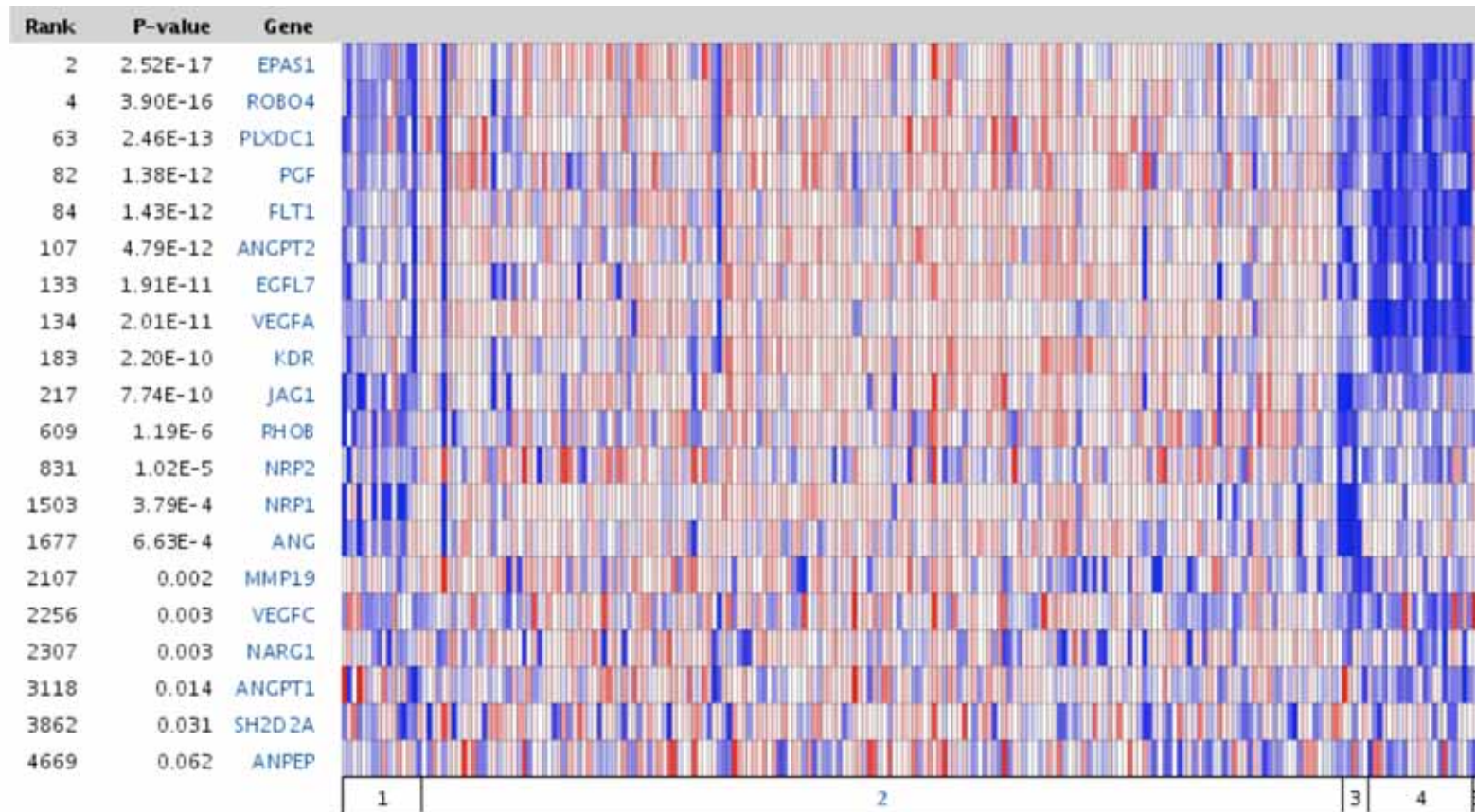
19,079 measured genes

Human Genome U133 Plus 2.0 Array



Angiogenesis genes

Over-expression in Renal Cell Carcinoma Type: Clear Cell Renal Cell Carcinoma



Legend

1. Chromophobe Renal Cell Carcinoma (16) 2. **Clear Cell Renal Cell Carcinoma (184)** 3. Granular Renal Cell Carcinoma (5) 4. Papillary Renal Cell Carcinoma (21) 5. Sarcomatoid Renal Cell Carcinoma (1)

Bittner Renal

Not Published 2005/01/15

mRNA

256 samples

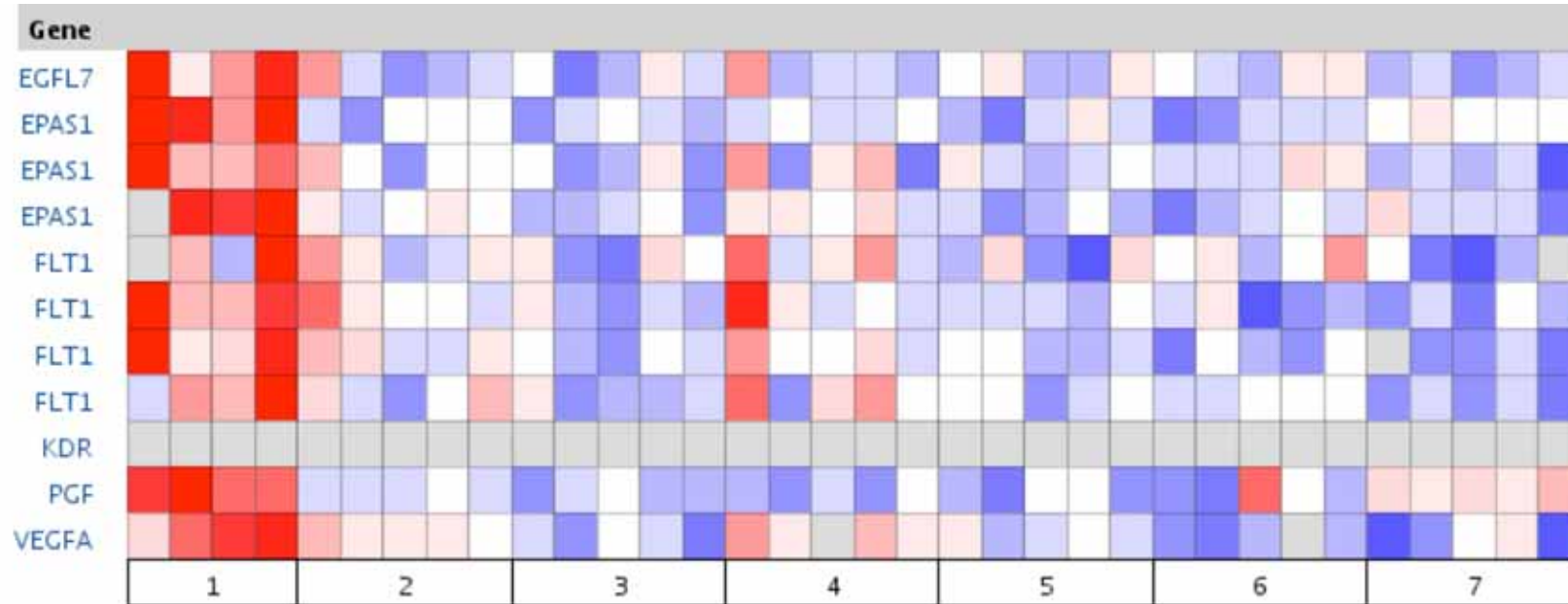
19,079 measured genes

angiogenesis (n = 35)

Clear Cell Renal Cell Carcinoma - Top 1% over-expressed (n = 190)

Overlap: 9 genes P-value:1.97E-10 Odds Ratio:30.6

Comparison of Selected Genes in Higgins Normal Grouped by Kidney Structure



Legend

1. Glomeruli (4) 2. Inner Cortex (5) 3. Inner Medulla (5) 4. Outer Cortex (5) 5. Outer Medulla (5) 6. Papillary Tips (5) 7. Pelvis (5)

Higgins Normal

Mol Biol Cell 2004/02/01

34 samples

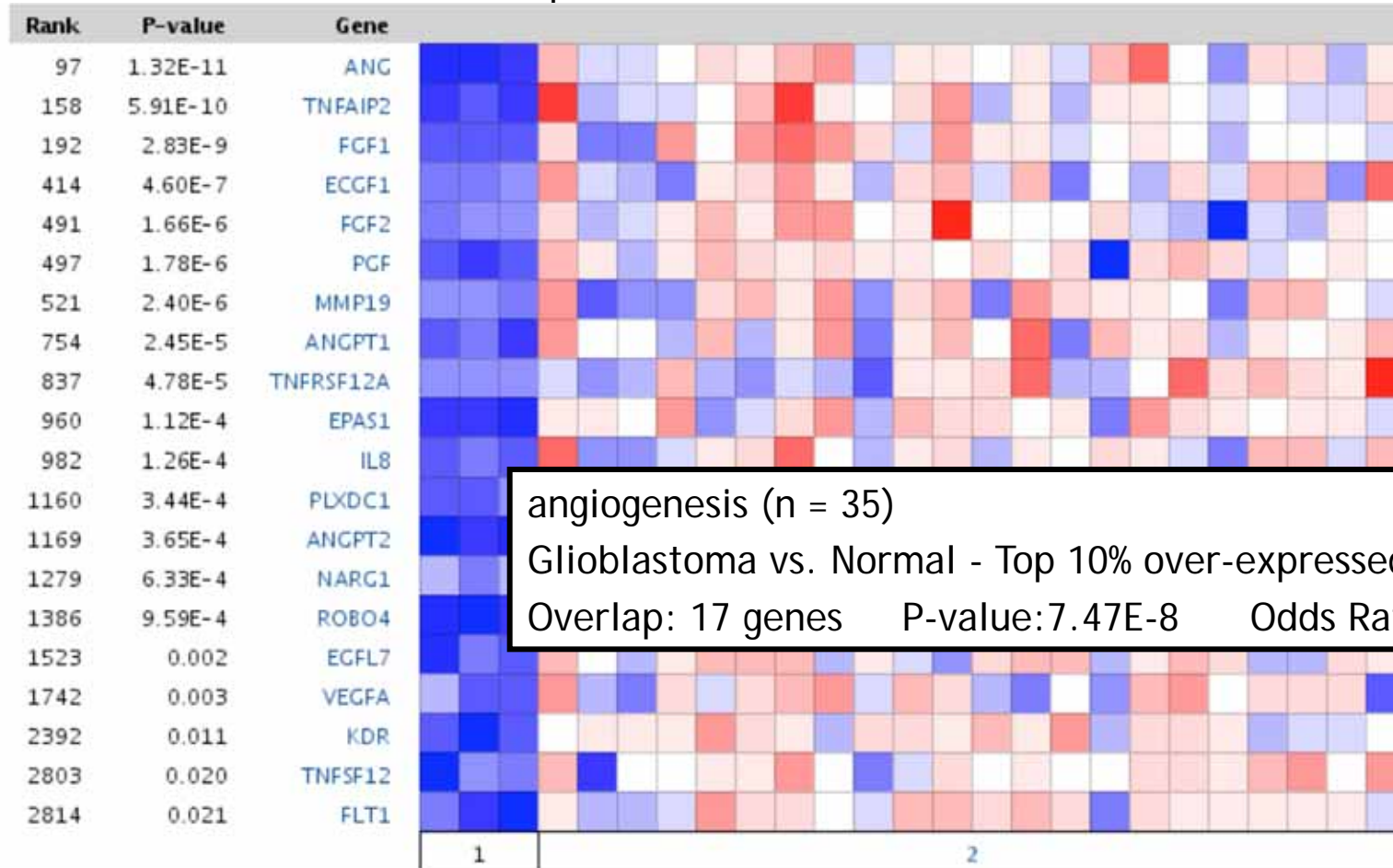
mRNA

13,016 measured genes

Platform not pre-defined in Oncomine

Angiogenesis genes

Over-expression in Glioblastoma vs. Normal



Legend

1. Neural Stem Cell (3) 2. Glioblastoma (22)

Lee Brain

Cancer Cell 2006/05/15

mRNA

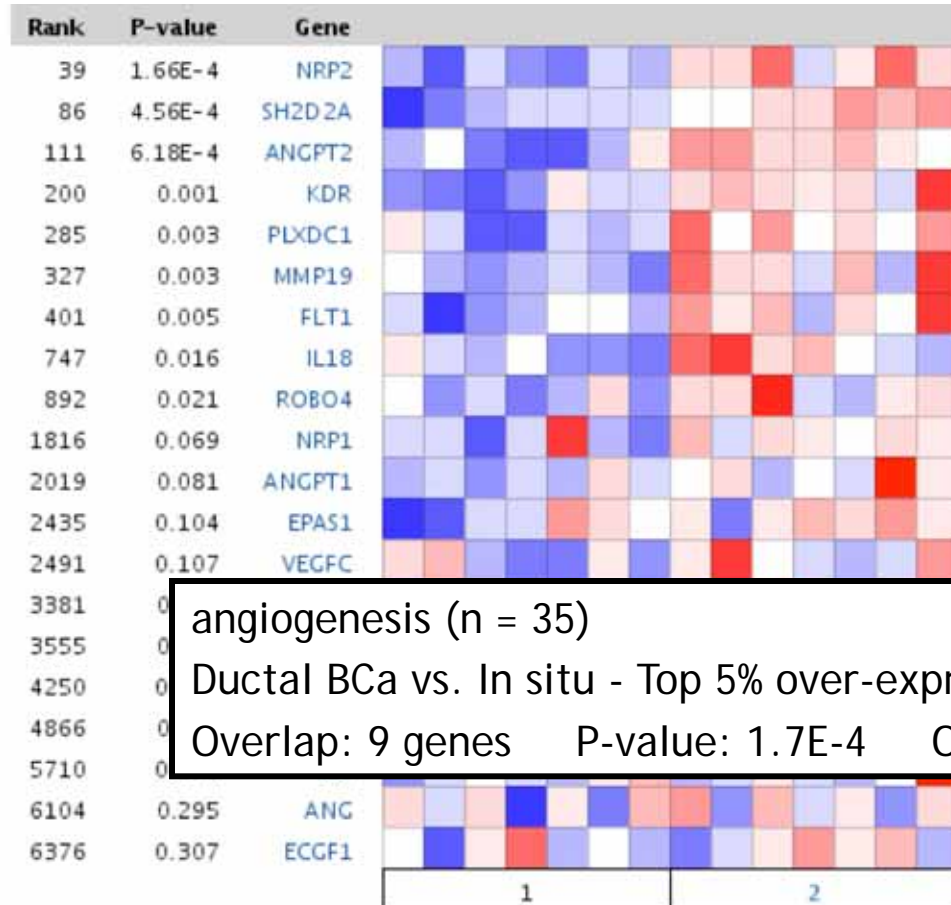
Human Genome U133 Plus 2.0 Array

101 samples

19,079 measured genes

Angiogenesis Genes

Over-expression in Ductal Breast Carcinoma Type: Invasive
Ductal Breast Carcinoma



Legend

1. Ductal Breast Carcinoma in Situ (7) 2. Invasive Ductal Breast Carcinoma (7)

Schuetz Breast 2

Cancer Res 2006/05/18

mRNA

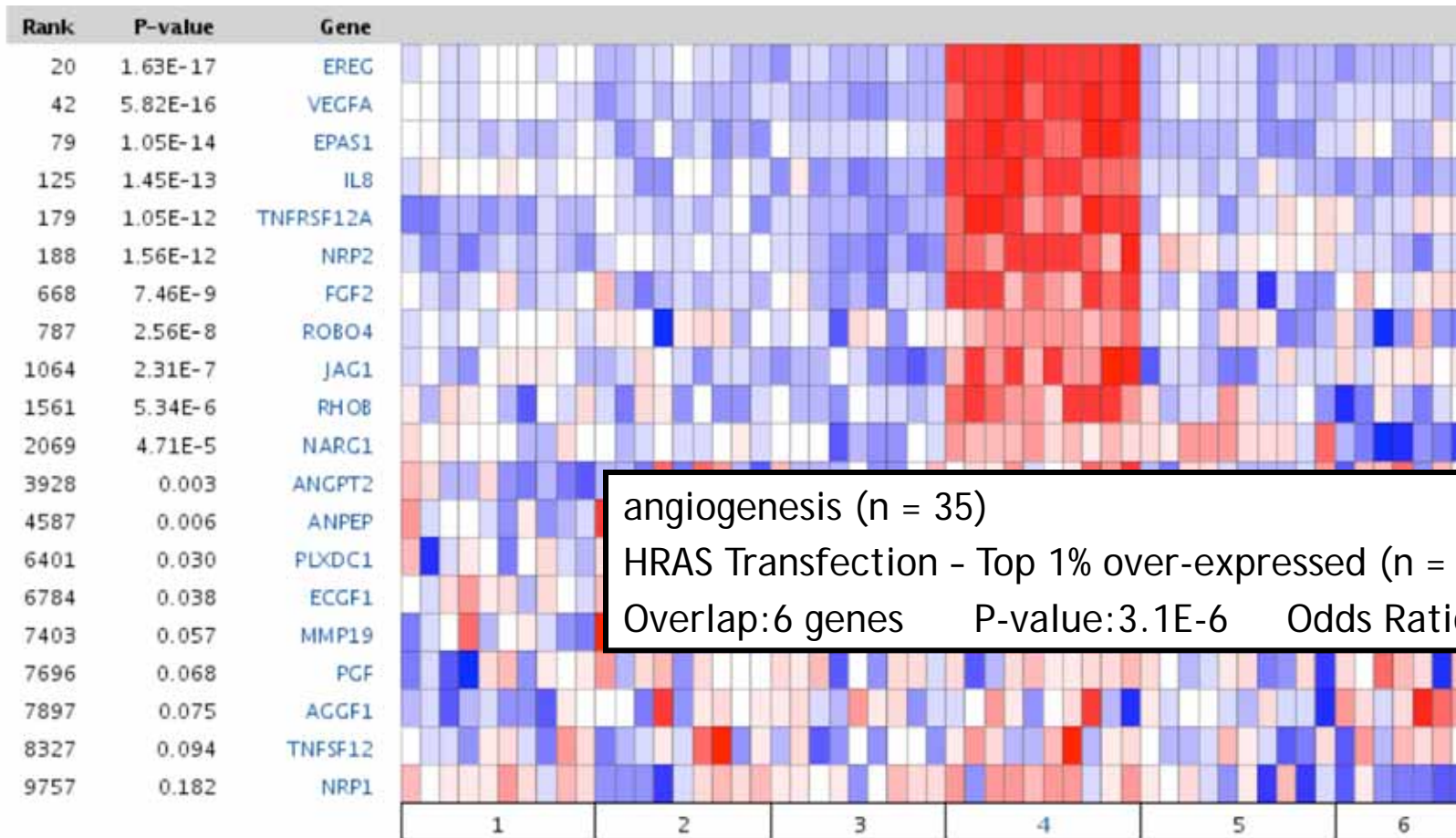
Human Genome U133 Plus 2.0 Array

14 samples

19,079 measured genes

Angiogenesis genes

Over-expression in HRAS Transfection - Human Mammary Epithelial Cells



Legend

1. GFP Transfection Control (10) 2. CTNNB1 Transfection (9) 3. E2F3 Transfection (9) 4. **HRAS Transfection (10)** 5. MYC Transfection (10) 6. SRC Transfection (7)

Bild CellLine

Nature 2005/11/07

mRNA

Human Genome U133 Plus 2.0 Array

55 samples

19,079 measured genes

Correlation of angiogenesis pathway

- Does angiogenesis pathway genes show correlation in particular cancer types?
- Identify individual tumors
- Approach
 - Oncomine clusters
 - Sets of correlated genes (>0.50)

Tissue	#	Avg (OR)
Brain	8	24.5
Renal	7	23.3
Breast	6	29.9
Melanoma	6	10.7
Bladder	5	9.6
Leukemia	5	13.0
Lung	4	4.8
Lymphoma	4	20.0
Prostate	4	8.7
Sarcoma	4	29.5
Colon	2	16.5

search

filter

selected 453 datasets (33631 samples)

- ✗ Concept: angiogenesis - GO Biological Process
- ✗ Concept Type: Oncomine Clusters

Primary Filters

- + Analysis Type
- + Analysis Cancer Type
- + Dataset Type
- + Data Source

Sample Filters

Dataset Filters

Concept Filters

datasets

associated concepts

Primary Concept: angiogenesis - GO Biological Process

- Compare | Clear All
- Bittner Renal - cluster ID n1341
Oncomine Clusters
 p = 8.80E-8 q = 4.06E-4 Odds = 57.5
 - Klapper Lymphoma - cluster ID n8966
Oncomine Clusters
 p = 2.87E-7 q = 0.001 Odds = 45.3
 - Gumz Renal - cluster ID n8852
Oncomine Clusters
 p = 7.55E-7 q = 0.002 Odds = 7.5
 - Bachtiary Cervix - cluster ID n9456
Oncomine Clusters
 p = 1.21E-6 q = 0.004 Odds = 21.2
 - Klapper Lymphoma - cluster ID n8838
Oncomine Clusters
 p = 3.31E-6 q = 0.008 Odds = 17.9
 - Lee Brain - cluster ID n5228
Oncomine Clusters
 p = 4.35E-6 q = 0.009 Odds = 44.5
 - An CellLine - cluster ID n5566
Oncomine Clusters
 p = 5.65E-6 q = 0.010 Odds = 13.1
 - Hoek Melanoma 2 - cluster ID n7630
Oncomine Clusters
 p = 6.99E-6 q = 0.013 Odds = 15.4
 - TCGA Brain - cluster ID n7201
Oncomine Clusters
 p = 7.55E-6 q = 0.012 Odds = 106.5
 - Daigeler Sarcoma - cluster ID n6548
Oncomine Clusters
 p = 9.59E-6 q = 0.014 Odds = 96.8

visualize

Concept Association Results

OTHER VIEWS: ▶

EXPORT: ▶

Primary Concept:

Name: angiogenesis
 Concept Type: GO Biological Process (GO)
 Size: 35 genes
 Null List: Gene Ontology (14239)

Associated Concept:

+ primary concept

Name: Bittner Renal - cluster ID n1341
 Concept Type: Oncomine Clusters
 Size: 51 genes
 Null List: Human Genome U133 Plus 2.0 Array (19079)

Interaction:

P-value: 8.80E-8 Q-value: 4.06E-4 Odds Ratio: 57.5 Size: 5 genes

- ANGPT2 angiopoietin 2
- EGFL7 EGF-like-domain, multiple 7
- FLT1 fms-related tyrosine kinase 1 (vascular endothelial growth factor/vascular permeability factor receptor)
- KDR kinase insert domain receptor (a type III receptor tyrosine kinase)
- VEGFA vascular endothelial growth factor A

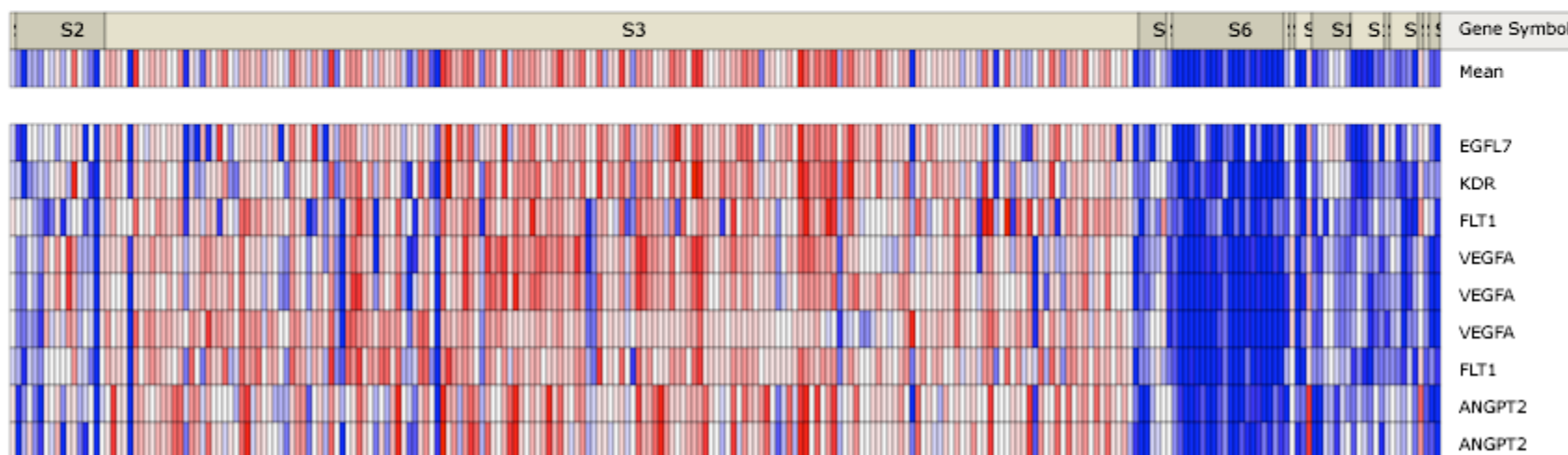
Angiogenesis signature in RCC

Navigation: Next 20 Width: [Left Arrow] [Right Arrow] Contrast: [Left Arrow] [Right Arrow] Map Type: Heat Sub Class: Renal Carcinoma - Type

Study: Bittner_Renal

Experiment Type: mRNA

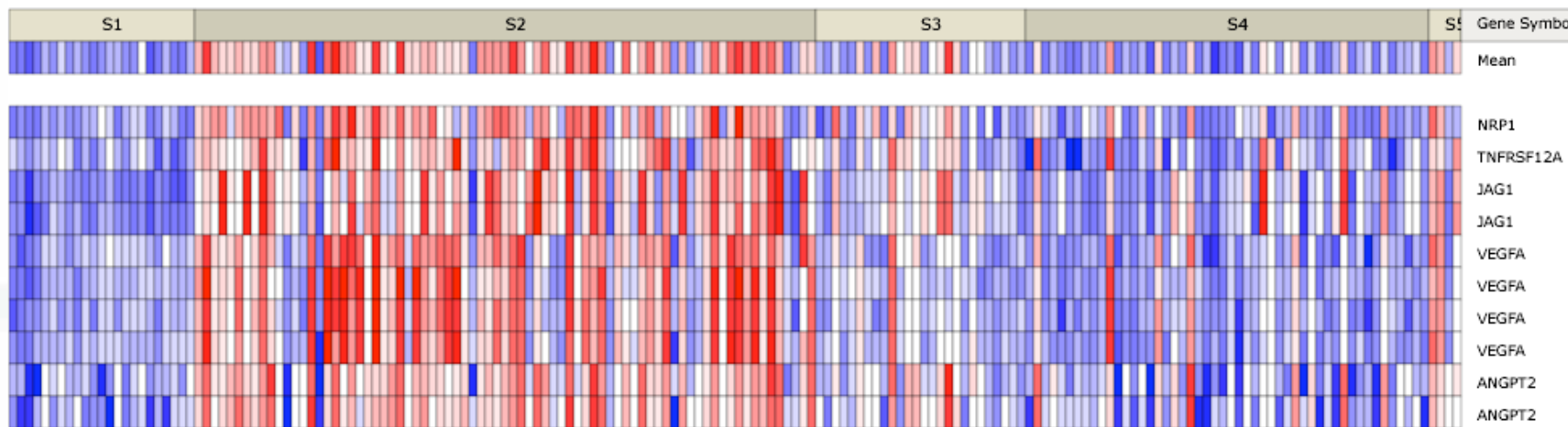
Tissue: Carcinoma of the Collecting Ducts of Bellini (1), Chromophobe Renal Cell Carcinoma (16), Clear Cell Renal Cell Carcinoma (185), Granular Renal Cell Carcinoma (5), Infiltrating Renal Pelvis Urothelial Carcinoma, Sarcomatoid Variant (1), Papillary Renal Cell Carcinoma (20), Renal Angiomyolipoma (1), Renal Carcinoma (1), Renal Cell Carcinoma (3), Renal Oncocytoma (7), Renal Pelvis Papillary Urothelial Carcinoma (6), Renal Pelvis Squamous Cell Carcinoma (1), Renal Pelvis Urothelial Carcinoma (5)

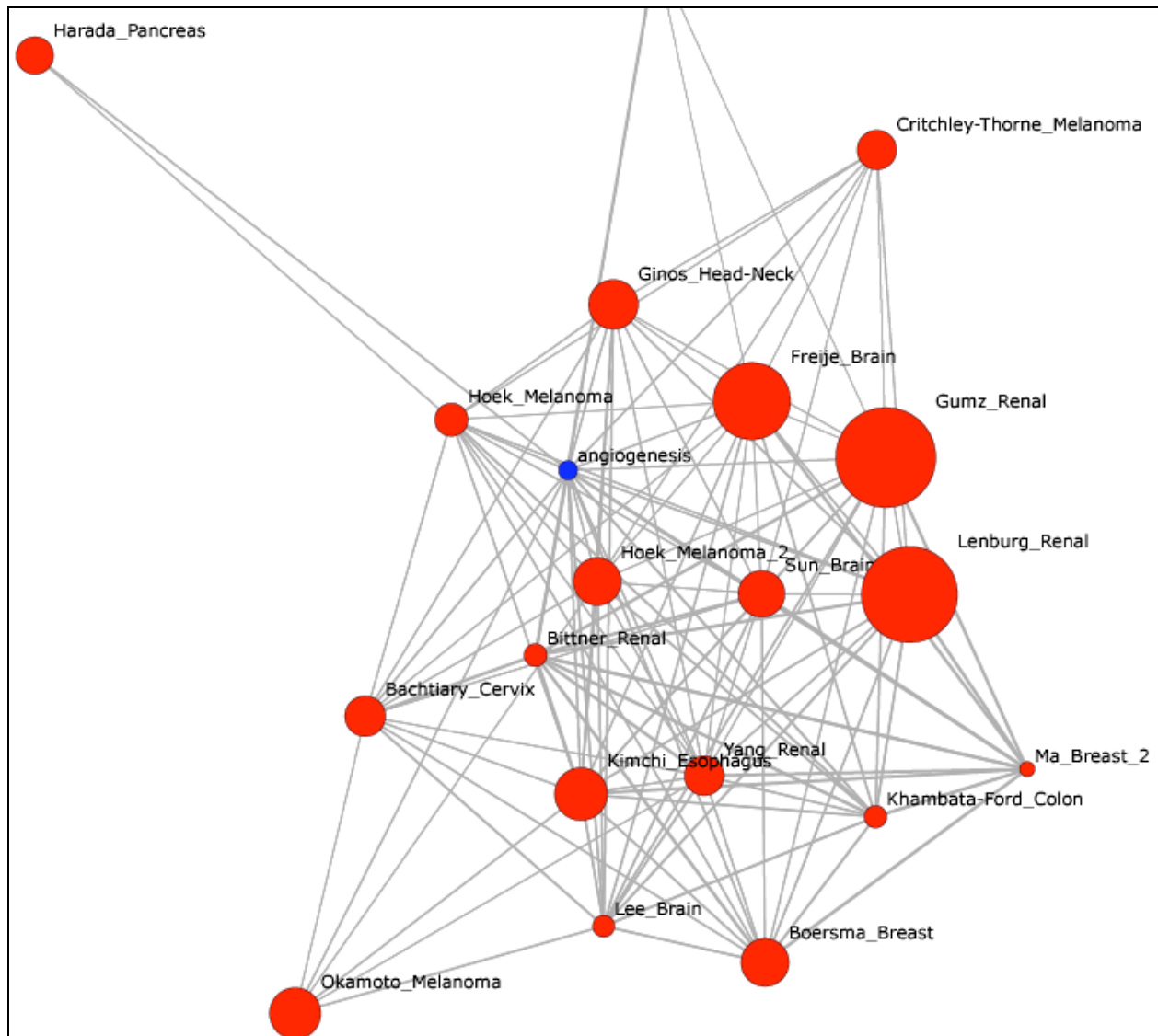


Angiogenesis signature in glioblastoma

Navigation: Next 20 Width: ◀◀◀▶▶▶ Contrast: ◀◀◀▶▶▶ Map Type: Heat Sub Class: Brain - Type

Study: Sun_Brain
Experiment Type: mRNA
Tissue: Normal Brain From Epilepsy Patient (23), Glioblastoma Multiforme (77), Astrocytoma (26), Oligodendroglioma (50), Unknown Glioma (4)
Geneset: angiogenesis





•P-value: <1E-3 Odds Ratio: >4



Angiogenesis genes across 8 tumor clusters

Gene	P	1	2	3	4	5	6	7	8	Gene
ANGPT2										ANGPT2
FLT1										FLT1
KDR										KDR
VEGFA										VEGFA
EGFL7										EGFL7
PLXDC1										PLXDC1
JAG1										JAG1
NRP1										NRP1
EPAS1										EPAS1
ECGF1										ECGF1
ROBO4										ROBO4
TNFRSF12A										TNFRSF12A
PGF										PGF
RHOB										RHOB
TNFSF12										TNFSF12
EREG										EREG
SH2D2A										SH2D2A
ANGPT1										ANGPT1
VEGFC										VEGFC
NRP2										NRP2

Legend

P. angiogenesis

GO Biological Process

1. Bittner Renal - cluster ID n1341

Oncomine Clusters

2. Gumz Renal - cluster ID n8852

Oncomine Clusters

3. Bachtary Cervix - cluster ID n9456

Oncomine Clusters

4. TCGA Brain - cluster ID n7201

Oncomine Clusters

5. Boersma Breast - cluster ID n7839

Oncomine Clusters

6. Lenburg Renal - cluster ID n9819

Oncomine Clusters

7. Sun Brain - cluster ID n3808

Oncomine Clusters

8. Hoek Melanoma - cluster ID n5920

Oncomine Clusters

search

filter

selected 453 datasets (33631 samples)

- Concept: Angiogenesis meta-cluster - My Concepts
- Concept Type: Biology Concepts

Primary Filters

Sample Filters

Dataset Filters

Concept Filters

- Concept Type

- + Biology Concepts
 - Connectivity Map v2 Drug Signatures
 - Literature-defined Concepts
- + Mutation Concepts
 - My Concepts
 - Oncomine Clusters
 - Oncomine Gene Expression Signatures
 - shRNA Concepts

datasets associated concepts

Primary Concept: Angiogenesis meta-cluster - My Concepts

angiogenesis
GO Biological Process
 p = 8.77E-19 q = 1.29E-16 Odds = 76.4

extracellular matrix structural constituent
GO Molecular Function
 p = 1.39E-16 q = 1.66E-14 Odds = 30.8

EGF-like
InterPro Protein Domains and Families
 p = 1.90E-12 q = 1.54E-10 Odds = 10.0

extracellular matrix (sensu Metazoa)
GO Cellular Component
 p = 4.26E-12 q = 3.31E-10 Odds = 12.5

COL1A1
HPRD Interaction Sets
 p = 6.14E-12 q = 4.73E-10 Odds = 38.7

collagen
GO Cellular Component
 p = 6.66E-12 q = 5.09E-10 Odds = 70.7

Collagen helix repeat
InterPro Protein Domains and Families
 p = 8.21E-12 q = 6.25E-10 Odds = 32.4

COL1A2
HPRD Interaction Sets
 p = 6.19E-11 q = 4.34E-9 Odds = 60.6

cell adhesion
GO Biological Process
 p = 9.54E-11 q = 6.55E-9 Odds = 7.0

EGF-like, subtype 2
InterPro Protein Domains and Families
 p = 3.96E-10 q = 2.55E-8 Odds = 10.9

visualize

Concept Association Results

OTHER VIEWS: ▶

EXPORT: ▶

Primary Concept:

Name: Angiogenesis meta-cluster
 Concept Type: My Concepts
 Size: 127 genes
 Null List: All Entrez Gene IDs (36486)

Associated Concept: + primary concept

Name: extracellular matrix (sensu Metazoa)
 Concept Type: GO Cellular Component (GO)
 Size: 185 genes
 Null List: Gene Ontology (14239)

Interaction:

P-value: 4.26E-12 Q-value: 3.31E-10 Odds Ratio: 12.5 Size: 16 genes

- BGN** biglycan
- COL13A1** collagen, type XIII, alpha 1
- COL6A3** collagen, type VI, alpha 3
- FBN1** fibrillin 1
- LOX** lysyl oxidase
- LUM** lumican
- MMP19** matrix metallopeptidase 19
- MMP9** matrix metallopeptidase 9 (gelatinase B, 92kDa gelatinase, 92kDa type IV collagenase)
- POSTN** periostin, osteoblast specific factor
- PXDN** peroxidasin homolog (Drosophila)
- SPARCL1** SPARC-like 1 (mast9, hev1n)
- TGFBI** transforming growth factor, beta-induced, 68kDa
- TIMP1** TIMP metallopeptidase inhibitor 1
- VCAN** versican
- VEGFA** vascular endothelial growth factor A
- VWF** von Willebrand factor

Hypoxic response signature

- Transcriptional regulation in response to hypoxia and HIF-1 (Manalo et al, Blood, 2005)
 - Arterial endothelial cells cultured under hypoxic conditions
 - Transfected with HIF-1 alpha
 - 191 genes up-regulated by both conditions
- Hypoxic response signature characteristics
 - Cell adhesion, ECM, HIF-1 binding sites
 - VEGFA, VEGFC, PLCG2

search

filter

selected 453 datasets (33631 samples)

- Concept: Upregulated genes in response to hypoxia and in response to HIF-1 expression - Literature-defined Concepts
- Concept Type: GO Biological Process

Primary Filters

- Analysis Type
 - + Cancer Subtype Analysis (251)
 - + Cancer vs. Cancer Analysis (143)
 - + Cancer vs. Normal Analysis (117)
 - + DNA Copy Number Analysis (11)
 - + Normal vs. Normal Analysis (9)
 - + Outlier Analysis (302)
 - + Pathway and Drug Analysis (93)
- Analysis Cancer Type
 - Bladder Cancer (15)
 - Brain and CNS Cancer (38)
 - Breast Cancer (67)
 - Cervical Cancer (7)
 - Gastrointestinal Cancer (45)
 - Head and Neck Cancer (17)
 - Wound Healing (10)

datasets associated concepts

Primary Concept: Upregulated genes in response to hypoxia and in response to HIF-1 expression - Literature-defined Concepts

- Compare | Clear All
- cell proliferation
GO Biological Process
p = 0.007 q = 0.081 Odds = 3.0
 - protein amino acid phosphorylation
GO Biological Process
p = 0.007 q = 0.083 Odds = 2.3
 - regulation of blood pressure
GO Biological Process
p = 0.007 q = 0.083 Odds = 8.4
 - generation of precursor metabolites and energy
GO Biological Process
p = 0.008 q = 0.089 Odds = 5.5
 - regulation of cell cycle
GO Biological Process
p = 0.008 q = 0.095 Odds = 3.2
 - angiogenesis
GO Biological Process
p = 0.008 q = 0.096 Odds = 7.8
 - blood coagulation
GO Biological Process
p = 0.009 q = 0.097 Odds = 5.3
 - neurogenesis

visualize

Concept Association Results

OTHER VIEWS: ▶

EXPORT: ▶

Primary Concept:

Name: Upregulated genes in response to hypoxia and in response to HIF-1 expression
 Concept Type: Literature-defined Concepts (PubMed)
 Size: 191 genes
 Null List: All Entrez Gene IDs (36486)

Associated Concept: + primary concept

Name: angiogenesis
 Concept Type: GO Biological Process (GO)
 Size: 35 genes
 Null List: Gene Ontology (14239)

Interaction:

P-value: 0.008 Q-value: 0.096 Odds Ratio: 7.8 Size: 3 genes

- PGF placental growth factor, vascular endothelial growth factor-related protein
- VEGFA vascular endothelial growth factor A
- VEGFC vascular endothelial growth factor C

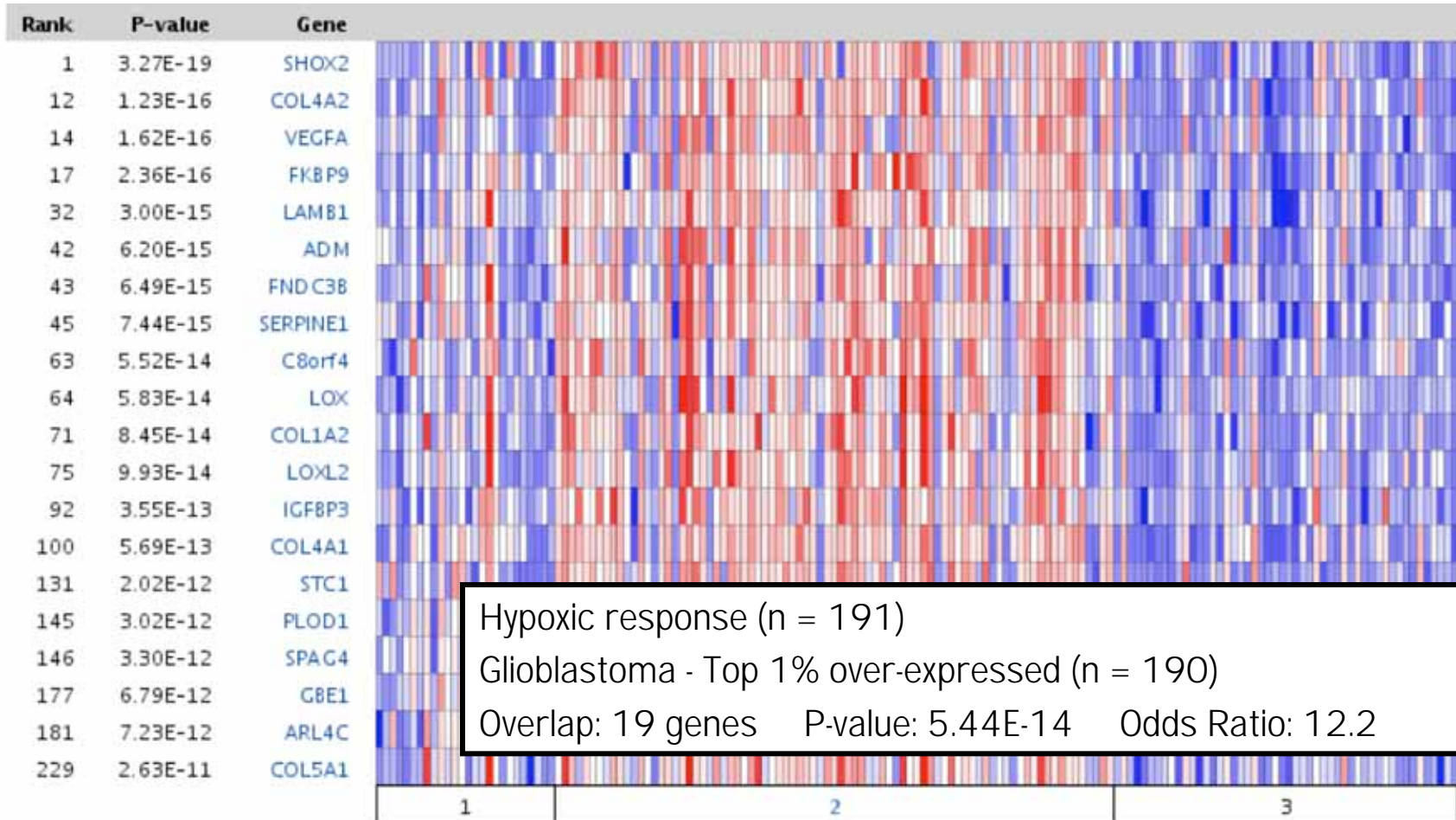
Hypoxic response signature associations

Oncomine Signatures	Count	Avg (OR)
Cancer Type: Kidney Cancer	7	5.0
Bladder Cancer Type: Bladder Urothelial Carcinoma	5	3.8
Brain and CNS Cancer Type: Glioblastoma	3	4.3
Cancer Type: Brain and CNS Cancer	3	3.6
Clear Cell Renal Cell Carcinoma vs. Normal	3	4.9
Glioblastoma vs. Normal	3	5.0
Organ Type: Lung	3	3.3
Renal Cell Carcinoma Type: Clear Cell Renal Cell Carcinoma	3	7.1
Cancer Type: Pancreatic Cancer	2	3.3
Diffuse Gastric Adenocarcinoma vs. Normal	2	4.6
Ductal Breast Carcinoma - ERBB2 Positive	2	3.4
Ductal Breast Carcinoma Type: Invasive Ductal Breast Carcinoma	2	4.0
Gastric Adenocarcinoma Type: Gastric Mixed Adenocarcinoma	2	3.6
Gastric Mixed Adenocarcinoma vs. Normal	2	3.7
Head and Neck Squamous Cell Carcinoma vs. Normal	2	4.4
Infiltrating Bladder Urothelial Carcinoma - Advanced N Stage	2	4.3



Upregulated genes in response to hypoxia and in response to HIF-1 expression

Over-expression in Brain and CNS Cancer Type: Glioblastoma



Hypoxic response (n = 191)
 Glioblastoma - Top 1% over-expressed (n = 190)
 Overlap: 19 genes P-value: 5.44E-14 Odds Ratio: 12.2

Legend

1. Astrocytoma (26) 2. Glioblastoma (81) 3. Oligodendroglial Tumor (50)

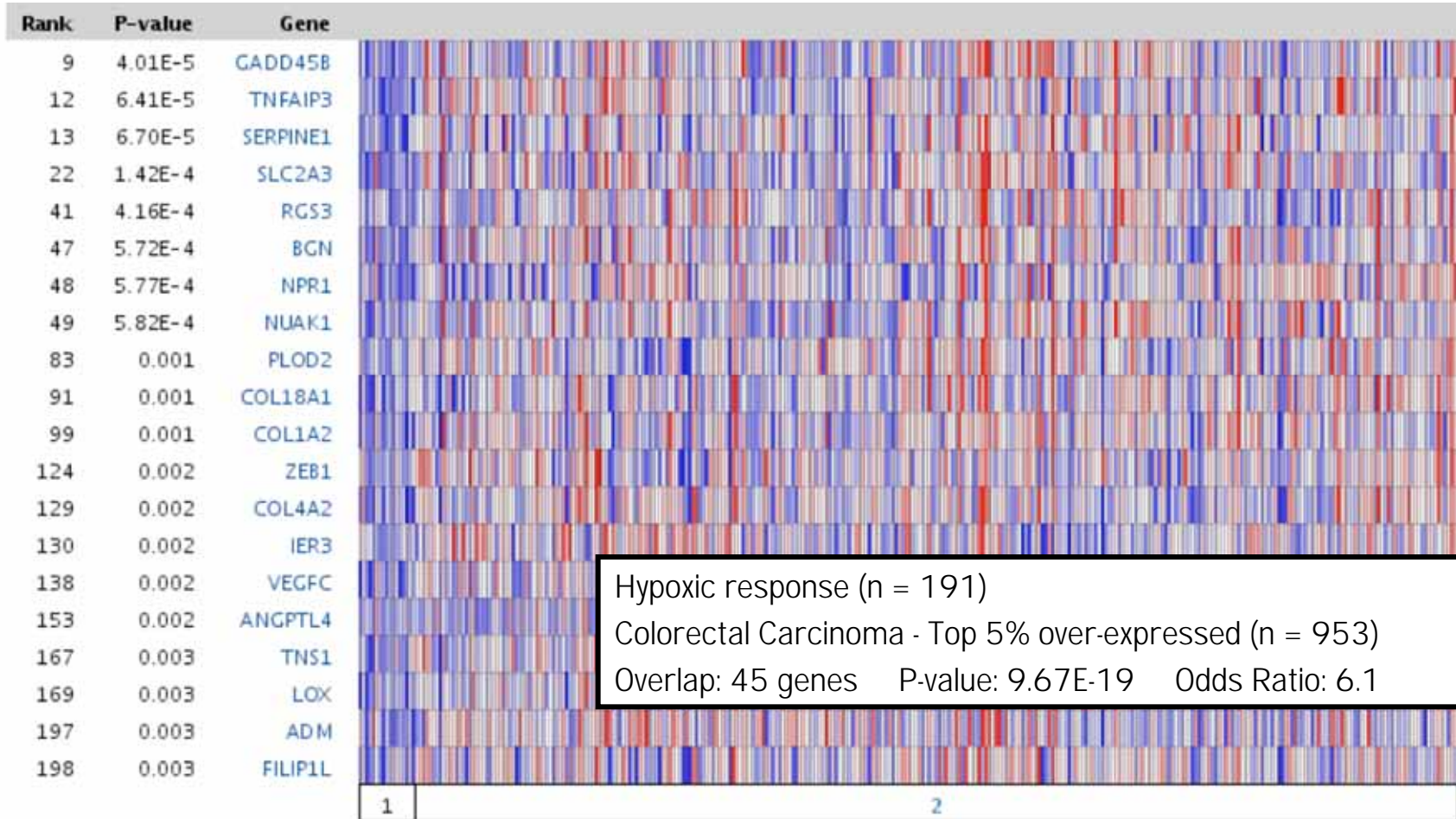
Sun Brain

Cancer Cell 2006/04/17 180 samples
 mRNA 19,079 measured genes
 Human Genome U133 Plus 2.0 Array



Upregulated genes in response to hypoxia and in response to HIF-1 expression

Over-expression in Colorectal Cancer Type: Colorectal Carcinoma



Legend

1. Colorectal Adenoma (17) 2. Colorectal Carcinoma (313)

Bittner Colon

Not Published 2005/01/15

373 samples

mRNA

19,079 measured genes

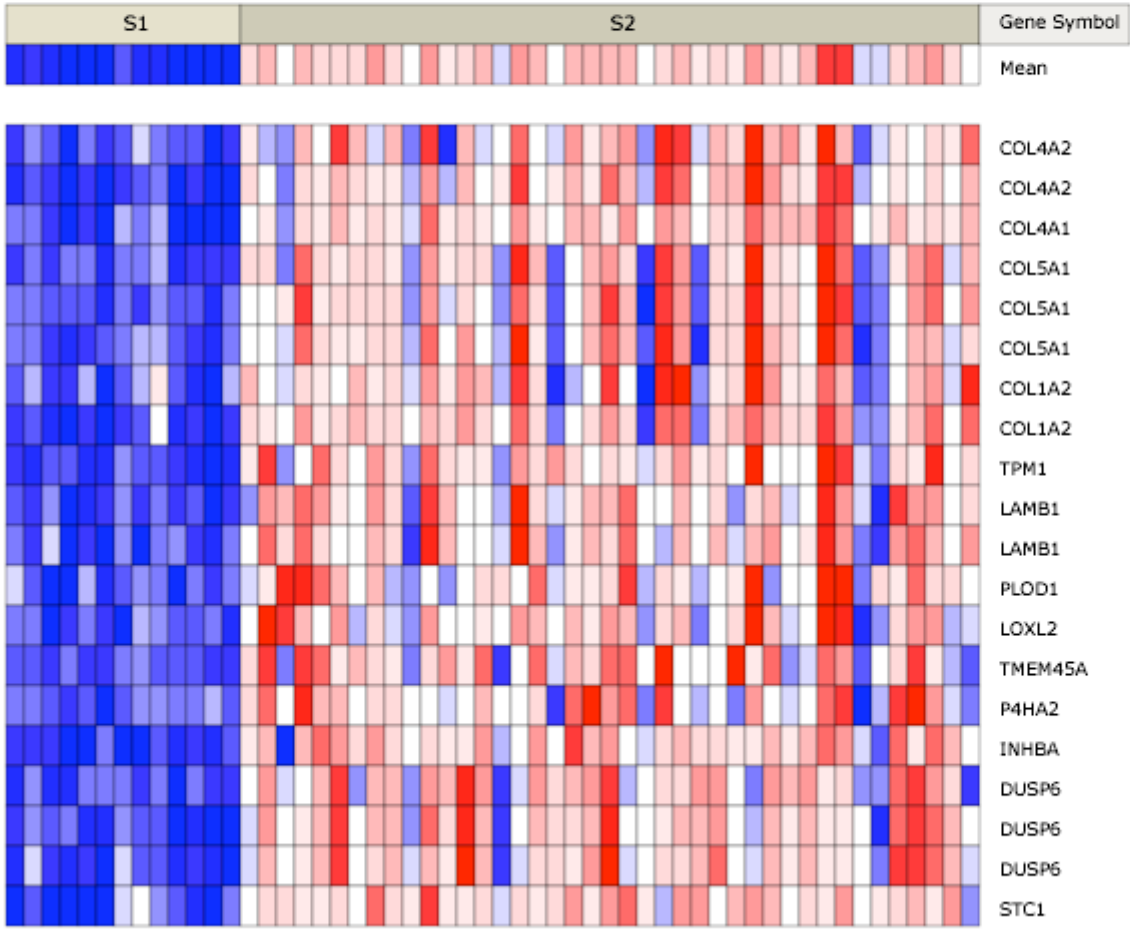
Human Genome U133 Plus 2.0 Array

Correlation of signature in tumors

Tissue	#	Avg (OR)
Breast	35	9.7
Brain	19	22.7
Lung	12	8.0
Ovarian	10	14.2
Prostate	10	12.0
Sarcoma	9	14.8
Lymphoma	8	10.2
Bladder	7	8.6
Melanoma	7	18.3
Normal	7	10.1
Renal	7	12.7
Colon	6	10.4
Leukemia	6	12.8
Esophagus	3	11.4
Head-Neck	3	12.7
Liver	3	8.2
Neuroblastoma	3	9.8
Pancreas	3	5.0
Skin	3	6.3
Cervix	2	12.4
Multi-cancer	2	12.4
Seminoma	2	22.0

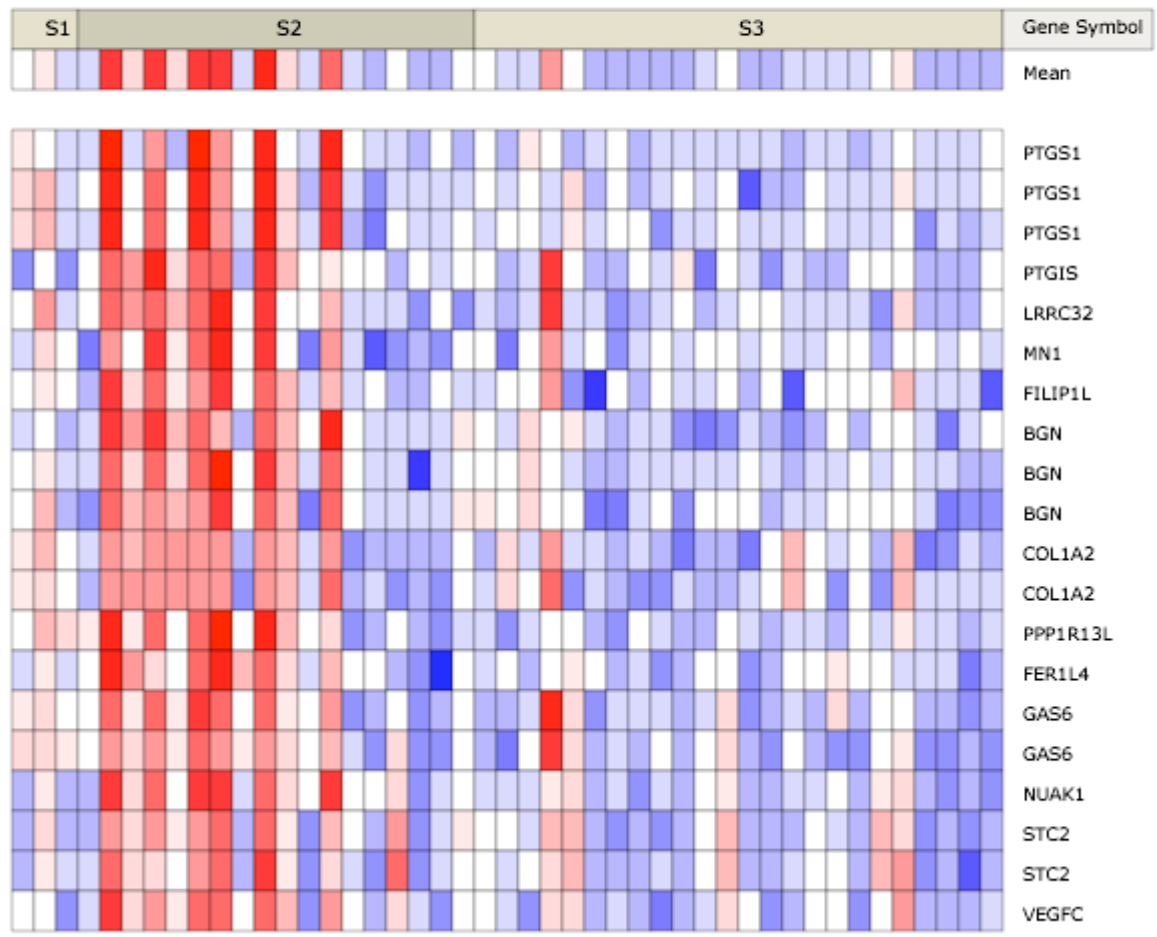
Navigation	Width	Contrast	Map Type	Sub Class
Next 20	◀◀◀▶▶▶▶▶	◀◀◀▶▶▶▶▶	Heat	Head and Neck - Type

Study: Ginos_Head-Neck
Experiment Type: mRNA
Tissue: Normal Oral Mucosa (13), Head and Neck Squamous Cell Carcinoma (41)
Geneset: Upregulated genes in response to hypoxia and in response to HIF-1 expression



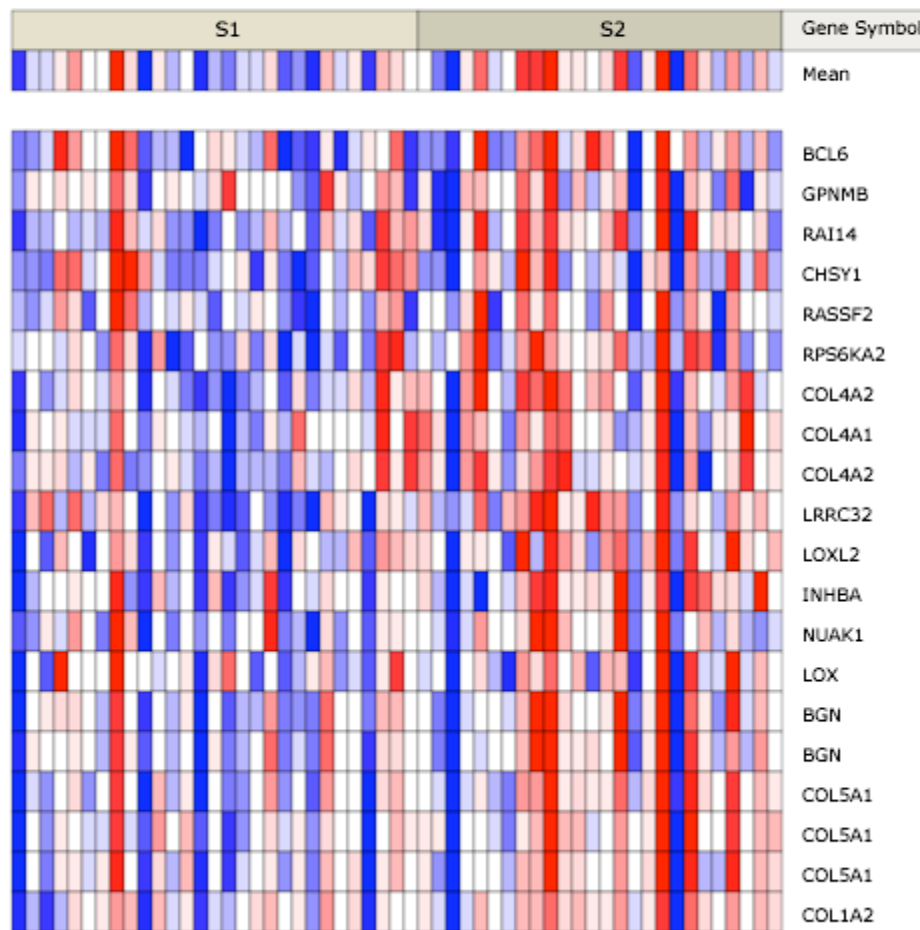
Navigation	Width	Contrast	Map Type	Sub Class
Next 20	◀◀◀▶▶▶▶▶	◀◀◀▶▶▶▶▶	Heat	Skin - Type

Study: Hoek_Melanoma
Experiment Type: mRNA
Tissue: Normal Melanocyte (3), Cutaneous Melanoma (18), Metastatic Melanoma (24)
Geneset: Upregulated genes in response to hypoxia and in response to HIF-1 expression



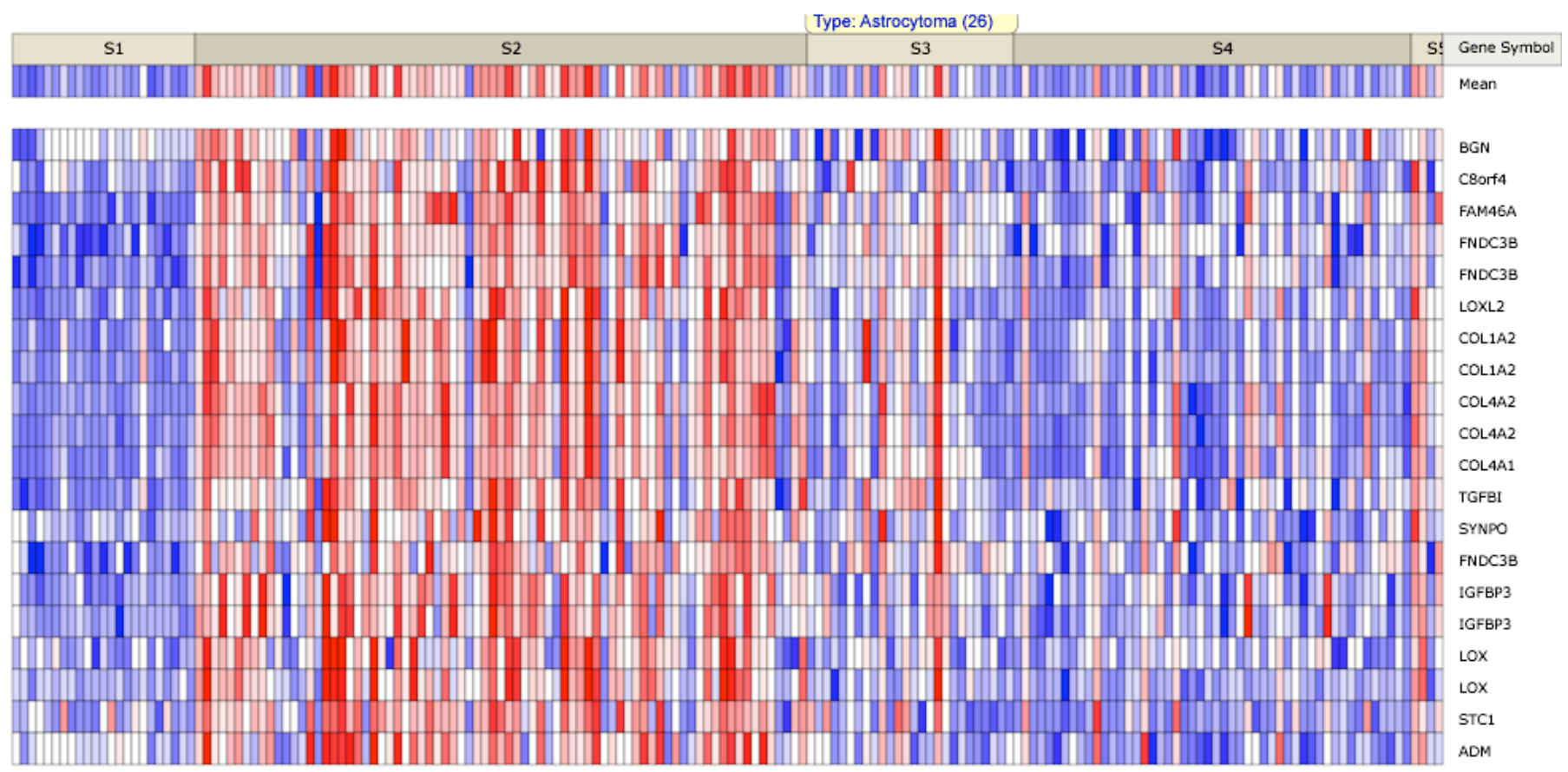
Navigation	Width	Contrast	Map Type	Sub Class
Next 20	◀◀◀▶▶▶▶▶	◀◀◀▶▶▶▶▶	Heat	Colorectal Carcinoma - Recurrence - 5 Years

Study: [Lin_Colon](#)
Experiment Type: mRNA
Tissue: [Colorectal Carcinoma \(55\)](#)
Geneset: Upregulated genes in response to hypoxia and in response to HIF-1 expression



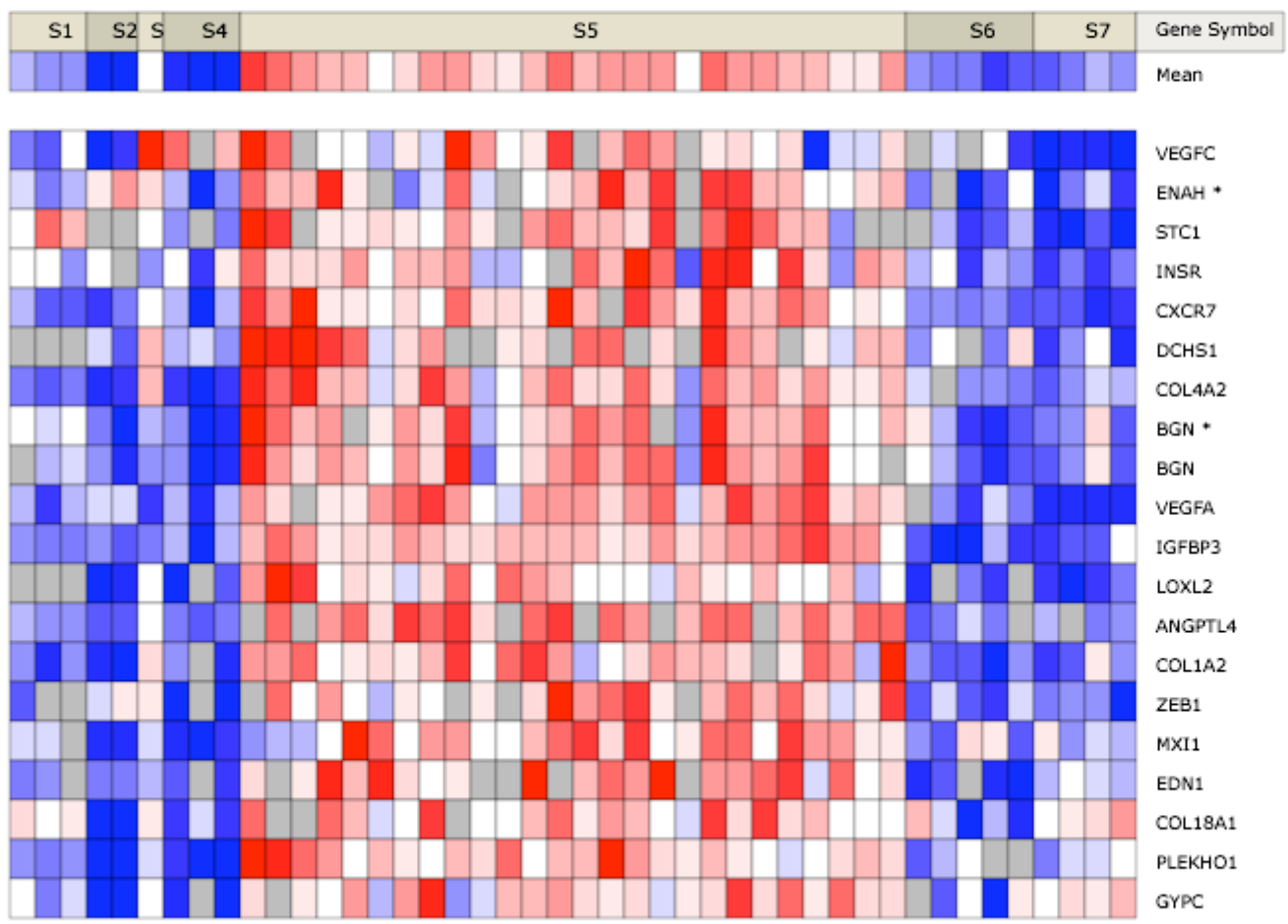
Navigation: Next 20 Width: [Left Arrow] [Right Arrow] Contrast: [Left Arrow] [Right Arrow] Map Type: Heat Sub Class: Brain - Type

Study: Sun_Brain
Experiment Type: mRNA
Tissue: Normal Brain From Epilepsy Patient (23), Glioblastoma Multiforme (77), Astrocytoma (26), Oligodendrogloma (50), Unknown Glioma (4)
Geneset: Upregulated genes in response to hypoxia and in response to HIF-1 expression



Navigation **Width** **Contrast** **Map Type**
 Next 20 ◀◀◀▶▶▶ ◀◀◀▶▶▶ Heat

Study: Higgins_Renal
Experiment Type: mRNA
Tissue: Normal Kidney (3), Benign Oncocytoma (2), Angiomyolipoma (1), Chromophobe Renal Cell Carcinoma (3), Clear Renal Cell Carcinoma (26), Granular Renal Cell Carcinoma (5), Papillary Renal Cell Carcinoma (4)
Geneset: Upregulated genes in response to hypoxia and in response to HIF-1 expression



Summary

- Gene expression readout for angiogenesis pathway
 - VEGFA & correlates
 - Angiogenesis pathway
 - Hypoxic response signature
- Tumor populations over-expressing angiogenesis signatures
 - Clear cell RCC (not papillary)
 - Glioblastoma
 - Fraction of other tumor populations (H&N, Colon...)
 - Activated by HRAS / MAPK
- Do signatures predict response to therapy?