Comprehensive characterization of functional RNA elements encoded in the human genome

> Brenton R. Graveley Department of Genetics and Genome Sciences Institute for Systems Genomics University of Connecticut Health Center Farmington, CT 06030

The ENCODE and modENCODE Projects



MAKING A GENOME MANUAL

Scientists in the Encyclopedia of DNA Elements Consortium have applied 24 experiment types (across) to more than 150 cell lines (down) to assign functions to as many DNA regions as possible — but the project is still far from complete.

EXPERIMENTAL TARGETS

DNA methylation: regions layered with chemical methyl groups, which regulate gene expression.

Open chromatin: areas in which the DNA and proteins that make up chromatin are accessible to regulatory proteins.

RNA binding: positions where regulatory proteins attach to RNA.

RNA sequences: regions that are transcribed into RNA.

ChIP-seq: technique that reveals where proteins bind to DNA.

Modified histones: histone proteins, which package DNA into chromosomes, modified by chemical marks.

Transcription factors: proteins that bind to DNA and regulate transcription.





Eukaryotic mRNA Synthesis



Functionally Important RNA Elements



SnapShot: The Splicing Regulatory Machinery

Mathieu Gabut, Sidharth Chaudhry, and Benjamin J. Blencowe Banting and Best Department of Medical Research, University of Toronto, Toronto, ON M5S 3E1, Canada

	Name	Other Names	Drotoin Demoine	Dinding Cites	Target Canes (Maure Demotrance (Disease Associations	22		2 @	e	2 م	<u> </u>		\Box					2.5	0.5
	Name		Protein Domains		General CT (CCDD	A U			ыX		ΞĺΣ	피짓다			129	ゴ 白	비비크	ÓШ	페핀
	экр20	ST/\$3, X16			SKP20, CT/CGKP ; -/- early embryonic letnal E3.5														
	968	SIrs/	RKIM, KS, C2HC Zht	(GAC)n															
l s	ASF/SF2	Strs	RRM, RS	KGAAGAAC	HIPK3, CAMKII , HIV RNAS ; -/- embryonic lethal, cond. KO cardiomyopathy														
tein	SC35	Strs2	RRM, RS	UGCUGUU	AChE; -/- embryonic lethal, cond. KO deficient I-cell maturation, cardiomyopathy; LS														
Pro	SRp30c	Strs9	RRM, RS	CUGGAUU															4
Ited	SRp38	Fusip I, Nssr	RRM, RS	ACAAAGACAA	CREB, type II and type XI collagens														
Rela	SRp40	Sfrs5, HRS	RRM, RS	AGGAGAAGGGA	HipK3, PKC -II, Fibronectin														
SR-	SRp55	Strs6	RRM, RS	GGCAGCACCUG	cini, CD44					_									4
and	SRp75	Sfrs4	RRM, RS	GAAGGA	FN1, E1A, CD45 ; overexpression enhances chondrogenic differentiation														
R	Tra2	Tra2a	RRM, RS	GAAARGARR	GnRH ; overexpression promotes RA-induced neural differentiation			++											
	Tra2	Sfrs10	RRM, RS	(GAA)n	HipK3, SMN, Tau														4
	SRm160	Srrm1	RS, PWI	AUGAAGAGGA	CD44														
	SWAP	Sfrs8	RS, SWAP	ND	SWAP, CD45, Tau ; possible asthma susceptibility gene														
	hnRNP A1	Hnrnpa1	RRM, RGG	UAGGGA/U	HipK3, SMN2, c-H-ras ; rheumatoid arthritis, systemic lupus erythematosus														
	hnRNP A2/B1	Hnrnpa2b1, Hnrnpa2	RRM, RGG	(UUAGGG)n	4.1R, HIV Tat, IKBKAP ; rheumatoid arthritis, systemic lupus erythematosus													4	
s	hnRNP C	Hnrnpc, Hnrnpc1/c2	RRM	U-rich	-amyloid receptor ; -/- embryonic lethal E6.5 ; systemic sclerosis, psoriatic arthritis														
teir	hnRNP F	Hnrpf	RRM, RGG, GY	GGGA, G-rich	PLP, c-SRC, Bcl-x														
Pro	hnRNP G	Rbmxrt, Hnrnpg	RRM, RGG, SRGY	AAGU	SMN2, -tropomyosin ; -/- impaired spermatogenesis														
RNP	hnRNP H	Hnrph1	RRM, RGG, GYR, GY	GGGA, G-rich	PLP, HIV tat, Bcl-x ; possible implication in MD														
L L	hnRNP L	Hnrnpl	RRM	C/A-rich	eNOS, CD45 ; systemic rheumatic diseases														
	РТВ	Ptbp1, Hnrpi	RRM	υςυυ, ςυςυςυ	nPTB, c-SRC, Fas, cTNT, CGRP, NMDA, CLBC, hnRNP A1														
	nPTB	Ptbp2, brPTB	RRM	CUCUCU	c-SRC, GlyR 2														
	Fox1	A2bp1	RRM	(U)GCAUG	NMHC-B, CGRP, F1 ; possible autism association, sporadic epilepsy														
	Fox2	Rbm9	RRM	(U)GCAUG	NMHC-B, 4.1R, FGFR2														
	Cugbp	Cugbp1, Brunol2	RRM	U/G-rich	cTNT, Insulin Receptor ; overexpression MD symptoms ; MD, DD and BD														
	Cugbp2	ETR-3, Brunol3	RRM	U/G-rich	cTnT, Tau, Cox-2 ; MD, DD, and BD														
	Celf4	Brunol4	RRM	U/G-rich	Mtmr1, cTnT; -/- neonatal lethality, seizure disorder. CELF∆ cardiomyopathy														
	HuD	Elavl4	RRM	U-rich	Ikaros, CGRP, AChE ; overexpression cognitive deficits; Hu syndrome, PE														
	Nova-1	Nova1	КН	YCAY	GlyR 2, GABAa ; -/- postnatal lethality by motor neuron death ; POMA syndrome														
LS I	Nova-2	Nova2	КН	YCAY	JNK, GIRK, neogenin ; -/- synaptic plasticity and LTP defects ; POMA syndrome							Ν	ND						
acto	TIA1	mTia1	RRM	U-rich	MYPT1, Fas, CGRP, FGFR2, TIAR, IL-8, VEGF ; -/- early embryonic lethality														
erE	TIAR	Tial1, mTIAR	RRM	U-rich	TIA1, CGRP, TIAR ; -/- early embryonic lethality														
oth	Mbnl1	Mbnl	C3H1 Znf	YGCU(U/G)Y	cTnT, Insulin receptor, Clcn1, Tnnt3 ; -/- mice develop MD-like disease ; MD														
	Slm-2	Khdrbs3, T-STAR	КН	UAAA	CD44, VEGF-A ; possible glomerular diseases association														
	Quaking	Qk, Qkl	КН	ACUAAY[]UAAY	MAG, PLP ; -/- embryonic lethal, qkv CNS/PNS dysmyelination, tremors ; ataxia, SCZ														
	PSF	Sfpq	RRM	ND	CD45, CoAA														
	SPF45	Rbm17	RRM, G patch	ND	Sxl, Fas ; overexpression mutlidrug-resistance phenotypes														
	Rbm4	Rbm4a, Lark	RRM, C2HC Znf	C/U-rich	MAPT, -tropomyosin, Tau														
	Sf3b1	SAP155, SF3b155	RRM, HEAT	ND	Bcl-x ; +/- skeletal transformations concomitant with ectopic Hox expression														
	Sam68	Khdrbs1	кн	A/U-rich	Bcl-x ; -/- increased osteoblast differentiation, reduced adipocyte differentiation														
							-	_				_		_	-		_		

Expression in mouse

High

Low

1072 "RNA binding proteins"

ARE BOY ENT. DAT DOW OUT EFFERS, LET FILLET, MSIL NET AND ALL REVEALS AND ALL



Comprehensive Identification of Functional RNA Elements in the Human Genome

- Identify RNA Elements Recognized by 250 (All) Human RNA Binding Proteins in vivo
 - Characterize the Binding Affinity of each RNA Binding Protein to all possible RNA Sequences
 - Determine the functions of the Protein-RNA Interactions



The Periodic Table of Human RNA Binding Proteins RICCATE TOP q

NAG *			
38402			
3 · · · · ·	4		
RBFOX2	SMN1		
41 kDa	32 kDa		
11	12		
TIAL1	TARDBP		
42 kDa	45 kDa		
19	20	21	22
PTBP1	🔹 FUS 殿	TRA2A	SRSF
58 kDa	53 kDa	33 kDa	26 kDa
37	38	39	40
RAVER1	FXR1	SCAF4	SRSF7
64 kDa	70 kDa	126 kDa	27 kDa
55	56 📏 🎽	57-71	72 🏹
PUM2	FXR2		SRSF
114 kDa	74 kDa		31 kDa
87	88	89-103	104
PUM1	ATXN1		SRSF4
126 kDa	87 kDa		56 kDa





What can be done with these data?

- Identify binding sites for all RBPs
- Determine the function of RBP binding sites
 - Determine RNP composition
 - Predict how mutations will impact RNA processing
 - New insights into RNA biology

Cell lines being studied





K562 (bone marrow) chronic myelogenous leukemia (CML) 53 year old female HepG2 (Liver) Hepatocellular carcinoma 15 year old male

1,072 "RNA binding proteins"



Antibody Validations

Acquired 852 antibodies and >1,000 shRNAs Tested 701 antibodies against 538 unique RBPs



438 antibodies against 385 RBPs 362 shRNAs against 276 RBPs

Antibody Validations



Sundararaman et al. Molecular Cell, 2016

Antibody Validations

Domain analysis of RBPs with IP-grade antibodies



Antibody Resource



Antibody Resource

ENCODE Da	ta √ Meth	ods - About ENCODE -	Help -	Search ENCO	DE Q Sign in
ENCAB9	34MDI	N 🗕 🚽	Acce	ssion ID	
Antibody a	gainst <i>I</i>	Homo sapiens IG	F2BP3		
Homo sapiens	к	562		Antibody status	ligible for new data 🔴
Sour	ce (vendor): Product ID: Lot ID: Targets: Host: Clonality: Isotype:	MBLI C* RN009) C* 002 IGF2BP3 (Homo sapiens) Rabbit Polyclonal IgA	Meta d	data	
Antigen	description:	KLH-conjugated synthetic	peptide HQQQKALQSGF	Characterization st	atus
IGF2BP3 (Homo s Method: immunoprecipitati Caption excerpt: IP-Western Blot at using IGF2BP3 sp twenty million who 25% of IP enrichm	sapiens) on nalysis of Hep vecific antibod ole cell lysate nent using rab	oG2 whole cell lysate dy. Lane 1 is 1% of input and lane 2 is obit normal IgG	HepG2 1 2 3 4 M - 225 - 15 - 65 - 50 - 65 - 50 - 25 - 15 - 65 - 50 - 25 - 15 - 65 - 50 - 25 - 10 - 25 - 10 - 25 - 10 - 25 - 10 - 25 - 10 - 25 - 10 - 25 - 115 - 65 - 50 - 25 - 50 - 25 - 50 - 50	IGF2BP3 (Homo sapiens) Method: knockdown or knockort Caption excerpt Western blot following shRNA against IGF2BP3 in K562 and HepG2 whole cell lysate using IGF2BP3 specific antibody. Lane 1 is a ladder, lane 2 is K562 pon-targeting control knockdown, lane 3 and 4 are	KSR2 (45 µg) Cont. KD1 KD2 Cont. K
l		MOIE		MOLE	
Experimen	ts using	g antibody ENCA	B934MDN	Links to CLIP exper	iments
Accession	Assay	Biosample term name	Target	Description	Lab
ENCSR077KVG	eCLIP	HepG2	IGF2BP3 eCLIP mock	input eCLIP control experiment on HepG2 against IGF2BP3	Gene Yeo, UCSD
ENCSR993OLA	eCLIP	HepG2	IGF2BP3	eCLIP experiment on HepG2 against IGF2BP3	Gene Yeo, UCSD
ENCSR096IJV	iCLIP	K562	IGF2BP3		Gene Yeo, UCSD

Antibody and shRNA Resources











Protein Localization Studies



Sundararaman et al. Molecular Cell, 2016

Accessing ENCODE RBP Data

RBP Image Database



About the database

This microscopy image database documents the results of immuno-fluorescence (IF) experiments to characterize the subcellular localization properties of human RNA binding proteins (RBPs) studied in the context of the ENCODE team grant entitled "Comprehensive analysis of function RNA elements encoded in the human genome", led by Dr. Brenton Graveley at the UConn Health Center. These studies are being conducted using several human model cell lines prioritized by the ENCODE consortium (e.g. HepG2, MCF7 and HeLa) and validated commercial antibodies targeting over 250 distinct RBPs. The database displays images resulting from co-labeling experiments of individual RBPs in conjunction with a panel of cellular markers for various organelles and subcellular structures. The data can be accessed via different search options, either by searching for individual RBPs or in batch display formats. Antibody validation was performed in the lab of Dr. Gene Yeo at UCSD, while all IF experiments and analyses are being conducted in the lab of Dr. Eric Lécuyer at the IRCM in Montreal.

Ki	Kindly note that this website is still under active contruction. Not all functions are implemented or yet fully functional. Thank you for your comprehension.											
	Search by gene symbols			Search by Annotation	Browse by cell lines							
	Select a Cell Line	Line •		Under construction	•HepG2 253 genes							
	Select a Target			Search	MCF7 22 genes							
	Search				Browse							

This database was developed and is maintained by the Lecuyer Lab. Please email us for any comments, suggestions or bug reports.

http://rnabiology.ircm.qc.ca/RBPImage/

Accessing ENCODE RBP Data

Gene sets



http://rnabiology.ircm.qc.ca/RBPImage/

Accessing ENCODE RBP Data

ACO1

Microtubules (anti-aTubulin)



Endoplasmic Reticulum

(anti-KDEL)



Endosomal Network

Mitochondria

(Mitotracker)

(anti-Coilin)



Filamentous Actin

(Phalloidin)

Cajal Bodies



P-Bodies

(anti-DCP1a)

Cell Cortex and Focal Adhesions

(anti-PhosphoTyrosine)



(anti-PML)

Nucleoli

(anfi-Fibrillarin)

Golgi Apparatus (anti-GM130)



Nuclear Speckles (anti-SC35)







PML Nuclear Bodies

ADAR

Microtubules (anti-aTubulin)



Endoplasmic Reticulum (anti-KDEL)



Mitochondria

(Mitotracker)

Endosomal Network

Cajal Bodies (anti-Coilin)



P-Bodies

Cell Cortex and Focal Adhesions (anti-PhosphoTyrosine)



PML Nuclear Bodies (anti-PML)

Nucleoli

(anfi-Fibrillarin)



Golgi Apparatus (anti-GM130)



Nuclear Speckles (anti-SC35)



http://rnabiology.ircm.qc.ca/RBPImage/

Filamentous Actin

(Phalloidin)



The eCLIP Protocol and Analysis Pipeline



Van Nostrand et al. Nature Methods, 2016

eCLIP-seq reveals RBP-specific binding profiles



Van Nostrand et al. Nature Methods, 2016

eCLIP-seq Identifies Co-Associated Proteins





Van Nostrand et al. Nature Methods, 2016

Discovery of RNA elements in the Human Genome



RNA Bind-n-Seq (RBNS): A method to quantify protein/RNA interactions



Lambert, N., et al. (2014). RNA Bind-n-Seq: Quantitative Assessment of the Sequence and Structural Binding Specificity of RNA Binding Proteins. *Mol Cell.*

eCLIP identifies motifs at crosslinktermination points



Assigning Function to Binding Sites



Polymenidou, et al. (2011). Nat Neurosci.

RNA Maps for RBPs



Identification of RBPs that regulate proximal vs distal polyadenylation site usage



RNA Localization (Frac-Seq)

ANKRD52 (mRNA and ciRNA)



(Neal Cody)

Integrative Analysis eCLIP-Seq

ChrM: 1,000 | 2,000 | 3,000 | 4,000 | 5,000 | 6,000 | 7,000 | 8,000 | 9,000 | 10,000 | 11,000 | 12,000 | 13,000 | 14,000 | 15,000 | 16,000 |





RBM27 Mito DNA





Data Production Status

(as of 06/06/16)





1,303 Completed/Released Experiments

The Periodic Table of Human RNA Binding Proteins

1 🎭																	2
© KI																	RBM17
38kDa																	45 kDa
3	4											5	6	7	8	9	10 66 6
RBFOX2	SMN1											LSM11	SF3B4	HNRNPC	CSTF50	SLBP	RBM22
41 kDa	32 kDa											40 kDa	44 kDa	34 kDa	48 kDa	31 kDa	47 kDa
11	12											13. 8 %	14	15	16	17	18
TIAL1	TARDBP											U2AF1	PRPF4	KHDRBS2	CPSF7	PABPN1	RBM5
42 kDa	45 kDa											28 kDa	58 kDa	39 kDa	52 kDa	33 kDa	92 kDa
19	20	21	22	23	24	25	26	27	28	29	30	31	32 💓	33	34	35	36
PTBP1	🕈 FUS 树	TRA2A	SRSF9	ZC3H8	NIP7	PUS1	LIN28B	MAGOH	XRCC6	IGF2BP1	PCBP	U2AF2	SF3A3	KHDRBS1	CPSF6	RBM34	RBM25
58 kDa	53 kDa	33 kDa	26 kDa 🔹	34 kDa	20 kDa	47 kDa	27 kDa 🖌	17 kDa	•70 kDa	63 kDa	38 kDa	54 kDa	59 kDa	48 kDa	59 kDa	48 kDa	100 kDa
37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54
RAVER1	FXR1	SCAF4	SRSF7	ZC3H11A	NOL12	SSB	DGCR8	PNN	XRCC5	IGF2BP3	PCBP2	CAPER	PRPF6	HNRNPH1	CSTF2	MTPAP	RBM15
64 kDa	70 kDa	126 kDa	27 kDa	89 kDa	25 kDa	47 kDa	86 kDa	82 kDa	83 kDa	64 kDa	30 kDa	59 kDa	107 kDa	49 kDa	61 kDa	66 kDa	107 kDa
55	56 📏 🧹	57-71	72	73	74	75	76	7722	78	79	80	81	82	83	84	85100	86
PUM2	FXR2		SRSF5	ZFC3H1	NPM1	LARP7	EIF2C1	RENT1	XRN2	IGF2BP2	PCBP3	PUF60	SNRNP200	EWSR1	CSTF2T	PABPC4	RBM27
114 kDa	74 kDa		31 kDa	226 kDa	• 33 kDa	67 kDa	97 kDa	124 kDa	1 09 kDa	66 kDa	39 kDa	60 kDa	244 kDa	68 kDa	64 kDa	71 kDa	119 kDa
87	88	89-103	104	105	106	107	108	109	110	111	112	113	114	115	116	117	118
PUM1	ATXN1		SRSF4	ZFP106	NOLC1	LARP4	DROSHA	UPF2	XRN1	KHSRP	HNRNPK	AQR	PRPF8	HNRNPU	FIP1L1	CPEB4	RBM6
126 kDa	87 kDa		56 kDa	269 kDa	74 kDa	81 kDa	159 kDa	148 kDa	194 kDa	73 kDa	51 kDa	171 kDa	274 kDa	91 kDa	67kDa	80 kDa	129 kDa
				Рори	ular 📃 SF	k Nuc	leolar	miRNA	Turn	over/Repair	r Splice	eosome	3' End	DDX/H	lelicase	SRP	
				Diser	ase Zin	IC La		EJC/NMD	Almo	ost Famous	hnRN	Ps	RBMs	Transla	ation	Modific	ation
			57	58	59	60	61	62	63	64	65	66	67	68	69	70	71
			DHX33	DDX6	DDX19F	B DDX52	DDX55	DDX59	SRP68	DDX3X	DDX21	SUPV3L1	DDX27	DDX20	DDX24	DHX30	DHX29
			47 kDa	54 kDa	54 kDa	67 kDa	69 kDa	69 kDa	71 kDa	73 kDa	87 kDa	88 kDa	90 kDa	92 kDa	96 kDa	134 kDa	155 kDa
			89	90	91	92	93	94	95	96	97	98	99	100 🗳	101	102	103
						- DDOO		FIFOOL	HEREAU	FILLING	FILCOD		EFE?	FIFACO	HETTUD	FIFON	FIELOA

36 kDa 40 kDa 47 kDa

18 kDa 25 kDa 27 kDa

15 kDa

36 kDa

64 kDa

69 kDa

95 kDa

102 kDa

109 kDa

167 kDa

175 kDa

Acknowledgments

Brent Graveley – UConn

Michael Duff Sara Olson Xintao Wei Lijun Zhan

Chris Burge – MIT

Cassandra Bazile Daniel Dominguez Peter Freese Nicole Lambert Abigail Hochman

Mitch Guttman Alex Shishkin

Gene Yeo – UCSD Stefan Aigner Eric van Nostrand Balaji Sundararaman Keri Elkins Rebecca Stanton Thai Nguyen Steven Blue Chelsea Gelboin-Burkhar Gabriel Pratt Ruth Wang Shashank Sathe Brian Yee

Xiang-Dong Fu – UCSD Taiki Tsutsui Rui Xiao

Grace Xiao - UCLA

Eric Lécuyer – IRCM

Xiaofeng Wang Neal Cody Olivia Zhang Philip Bouvrette Julie Bergalet **Data Coordination Center** Mike Cherry Jean Davidson Eurie Hong

NHGRI Elise Feingold Mike Pazin Dan Gilchrist

U54 HG007005 R21 HG008799 R01 GM067842 R01 GM095296 R35 GM118140

