

Epigenetics and non-coding RNAs

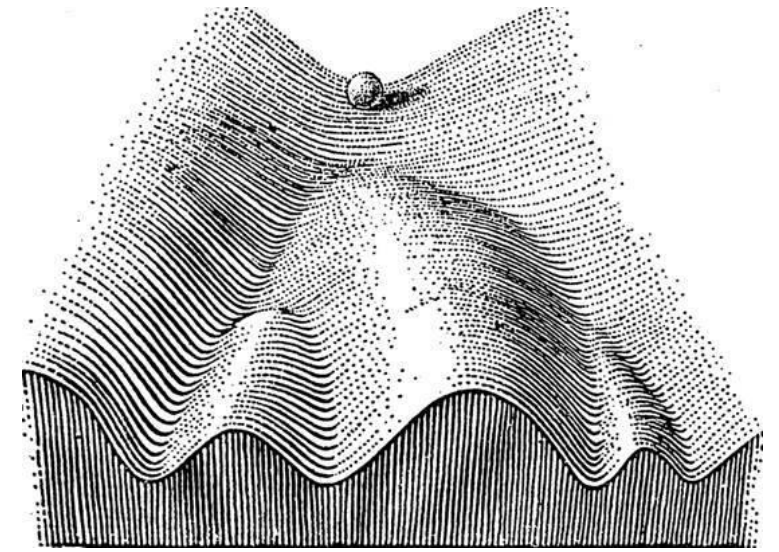
Feb 22 2016

Lecture Plan

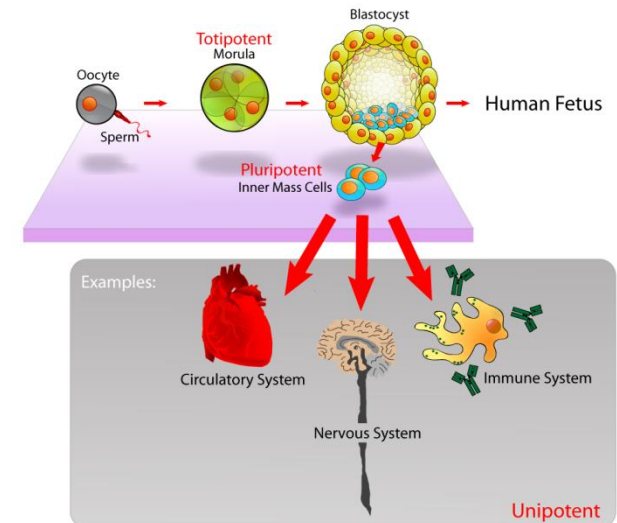
- Today: Epigenetics and lincRNAs
- Wednesday: statistical methods for RNAseq/ChIPseq
- Next Monday: microRNAs

Epigenetics

- Beyond/on-top-of genetic
 - Study of (stable/heritable) non-genetic differences in traits
- **Chromatin:** DNA and all the proteins bound to it
- Chromatin structure dictates the transcriptional potential of a cell
- The structure is heritable: across cell divisions and sometimes trans-generationally

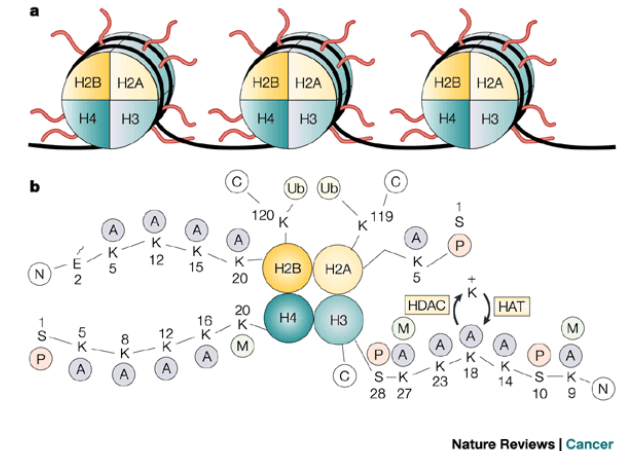


Waddington epigenetic landscape

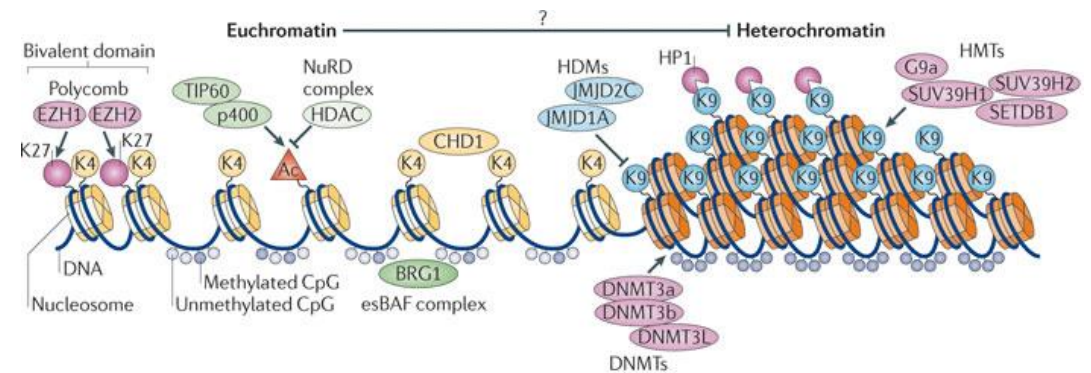


Terms and Definitions

- **Histones:** proteins found in eukaryotic cell nuclei that package and order the DNA into structural units called **nucleosomes**
- **Euchromatin:** open accessible chromatin, transcribed regions
- **Heterochromatin:** closed chromatin: inaccessible to transcriptional machinery
- **Epigenetic marks:** covalent alterations to histones or DNA
 - Generally copied at cell division
 - Determine chromosome structure recruitment of genes that execute and regulate gene expression
- **Epigenomics:** the study of the genome wide epigenetic state



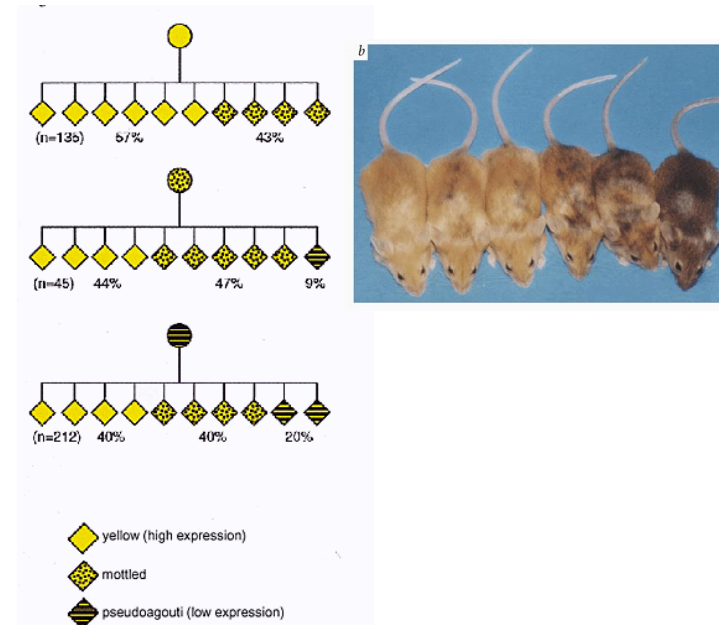
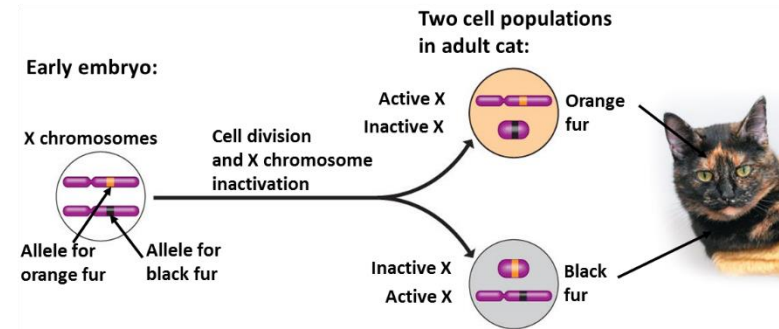
Nature Reviews | Cancer



Nature Reviews | Molecular Cell Biology

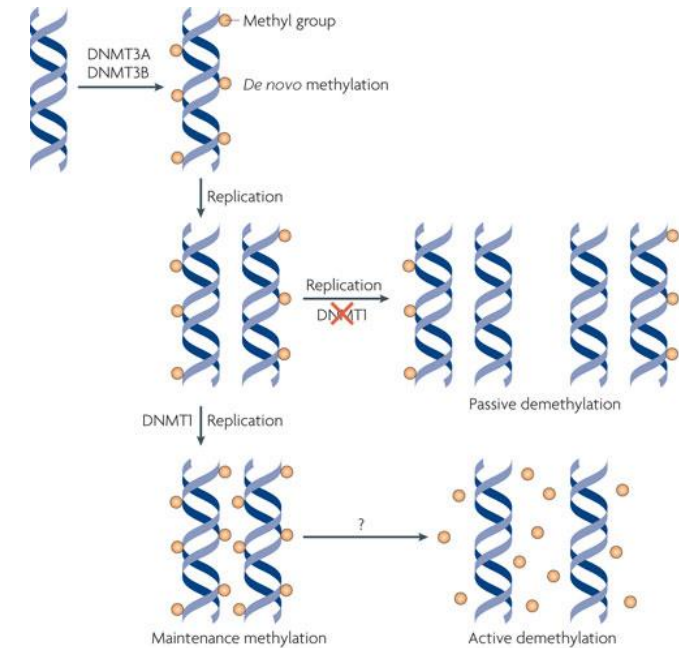
Examples of epigenetic processes

- X chromosome inactivation
 - In females each cell randomly inactivate 1 X chromosome and this pattern is inherited through cell divisions
 - Mediated by a non-coding RNA Xist
- Coat coloration in mice
 - Isogenic mice have different coat patterns that are partially heritable
- Paternal/maternal imprinting
 - Some genes are only expressed from a single parental chromosome in a cell-type specific way
 - Loss of a part of chromosome 15
 - Maternal: Angelman syndrome
 - Sever learning problems, seizures, movement problems, unusually cheerful disposition
 - Paternal: Prader-Willi syndrome
 - Learning difficulties, short stature, compulsive eating



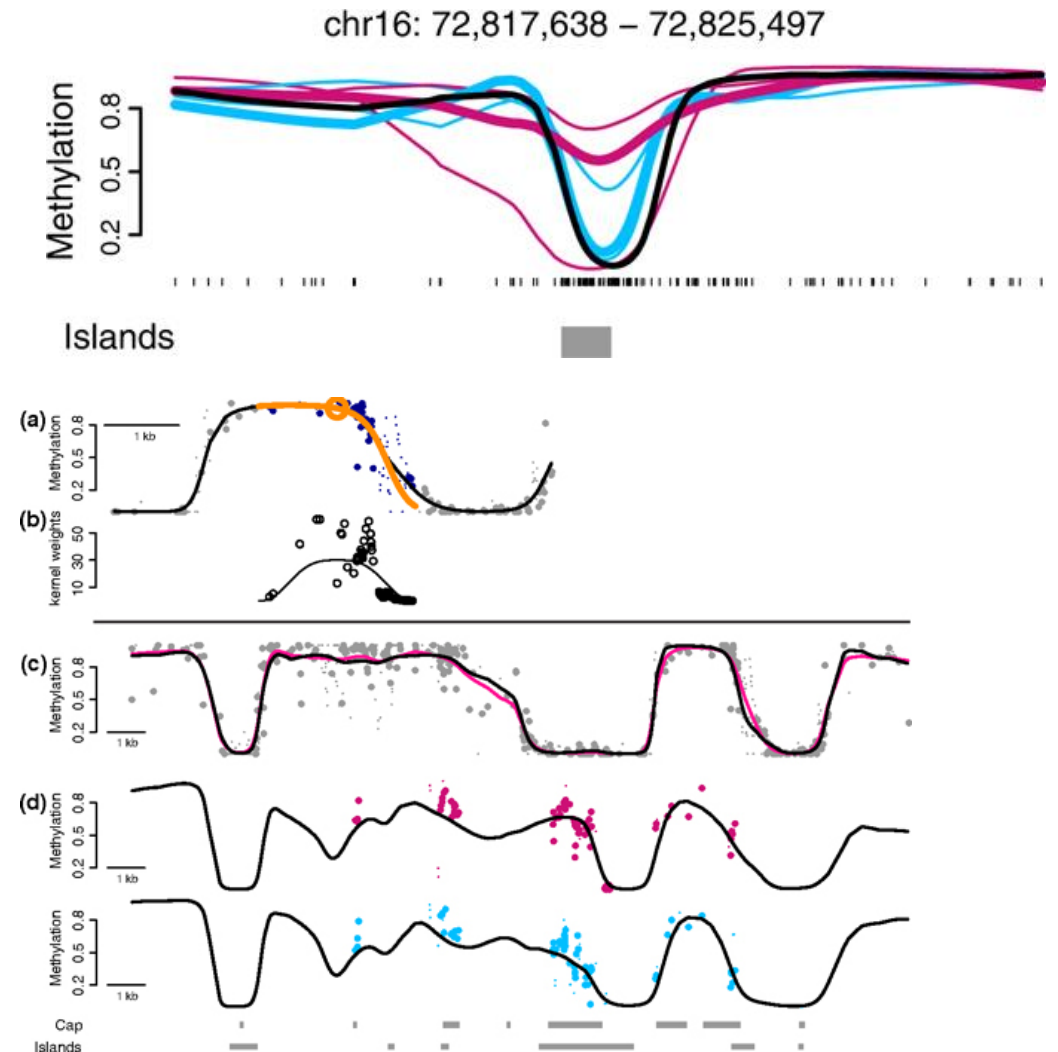
Epigenetic Marks – DNA Methylation

- Methylation (mammalian genome)
 - Mostly on CpG dinucleotides
 - Most are methylated in the mammalian genome (70-80%)
 - CG dinucleotides are relatively rare because of higher mutation rate
 - CpG islands are stretches of DNA relatively rich in CpGs
 - Working definition: had a GC content greater than 55%, and an observed-to-expected CpG ratio of 65%
 - Typically associated with promoters of genes
 - 70% of genes have canonical CpG islands
- Methylation is repressive: closed chromatin
- Methylations are relatively stable
 - Actively copied during replications (failure to do so results in passive loss)
 - Active demethylase activity is typically low

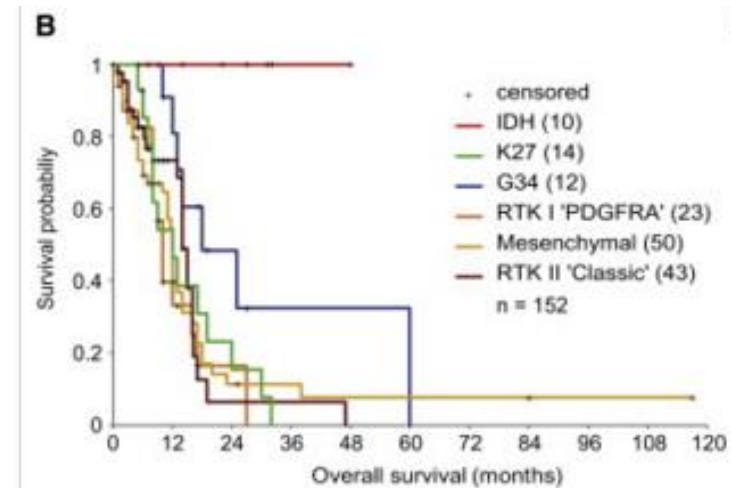
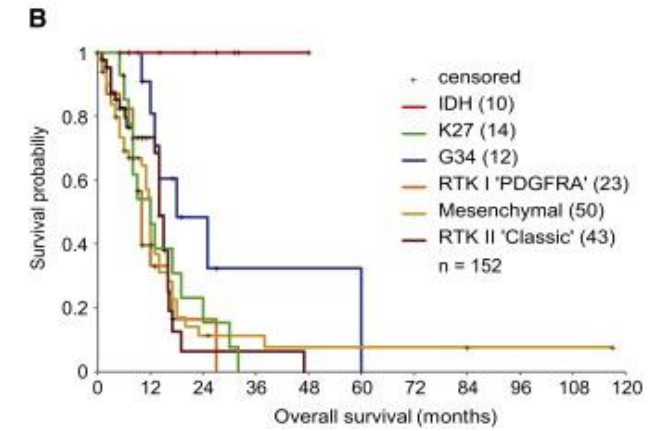
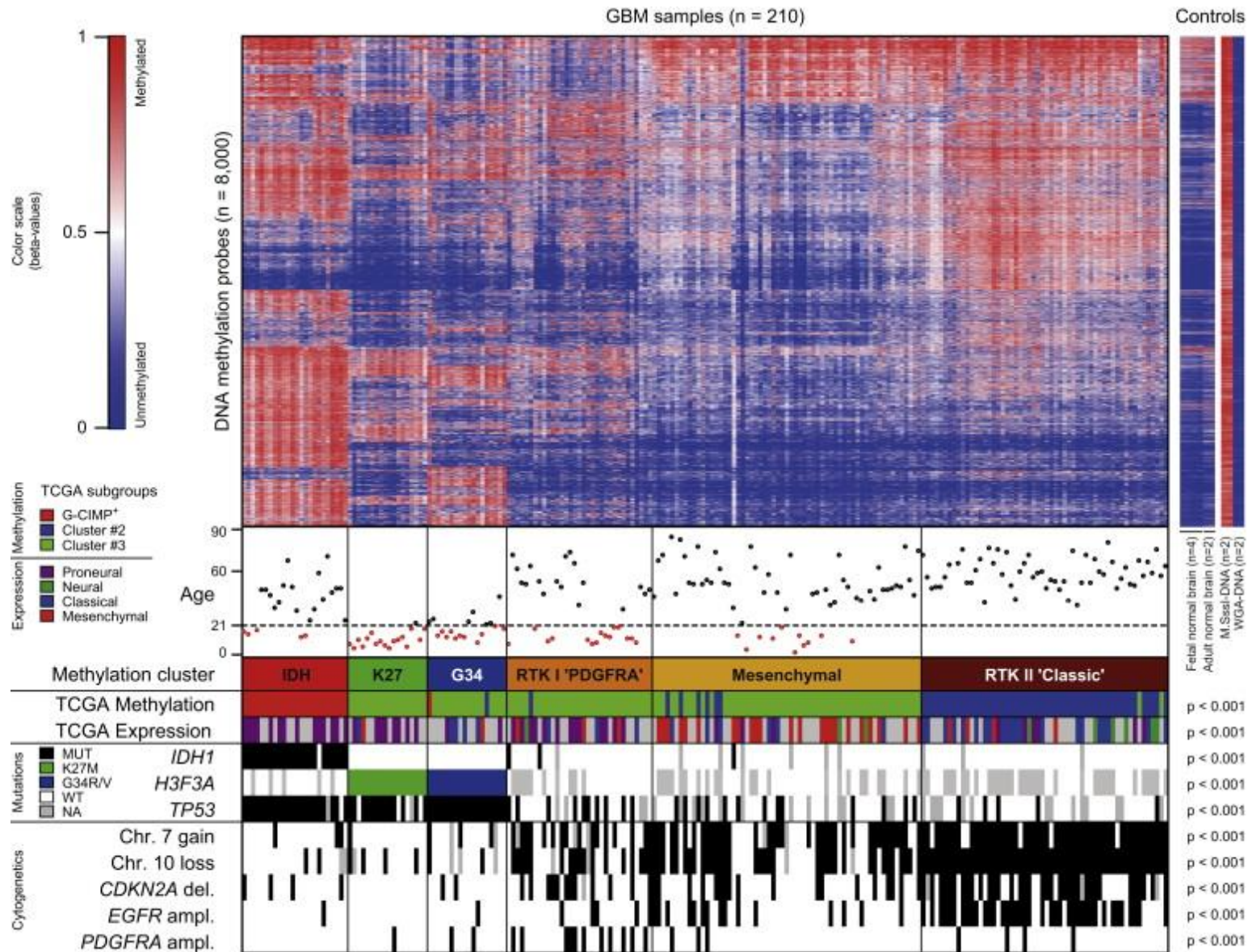


Methylation techniques and analysis

- Bisulfite conversion: chemical procedure turns unmethylated Cs into Us
- Relative abundance of Cs and Us at a single locus can be determined by hybridization or sequencing
- Only one genome per cell!
 - Single cell values are {0, 0.5, 1}
 - Assay values [0,1] represent population averages
- Computational challenges
 - Spatial dependence
 - Biological variability
 - Hypothesis testing: many CpG loci
- Popular software: bSmooth

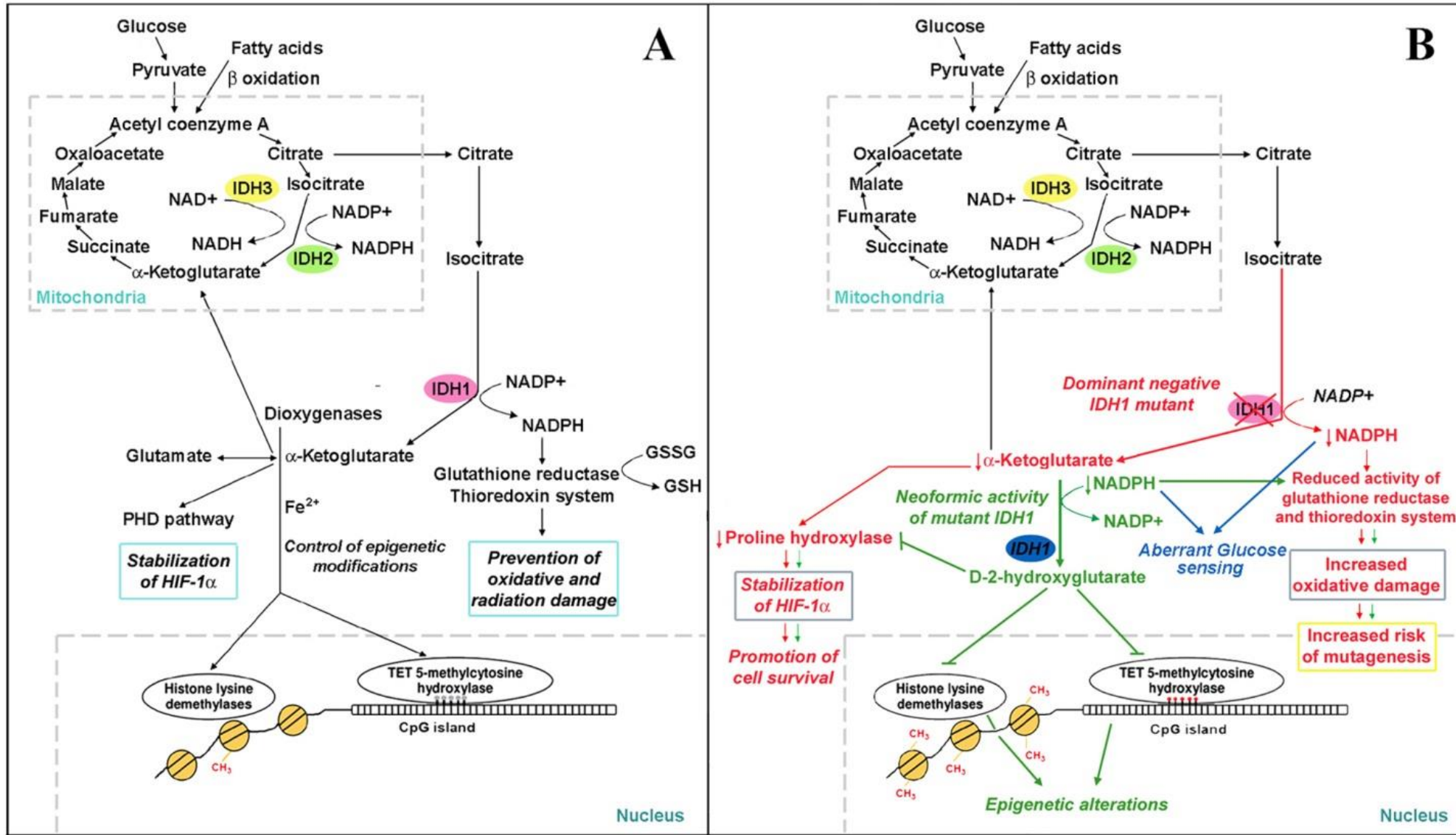


Methylation classification of cancers



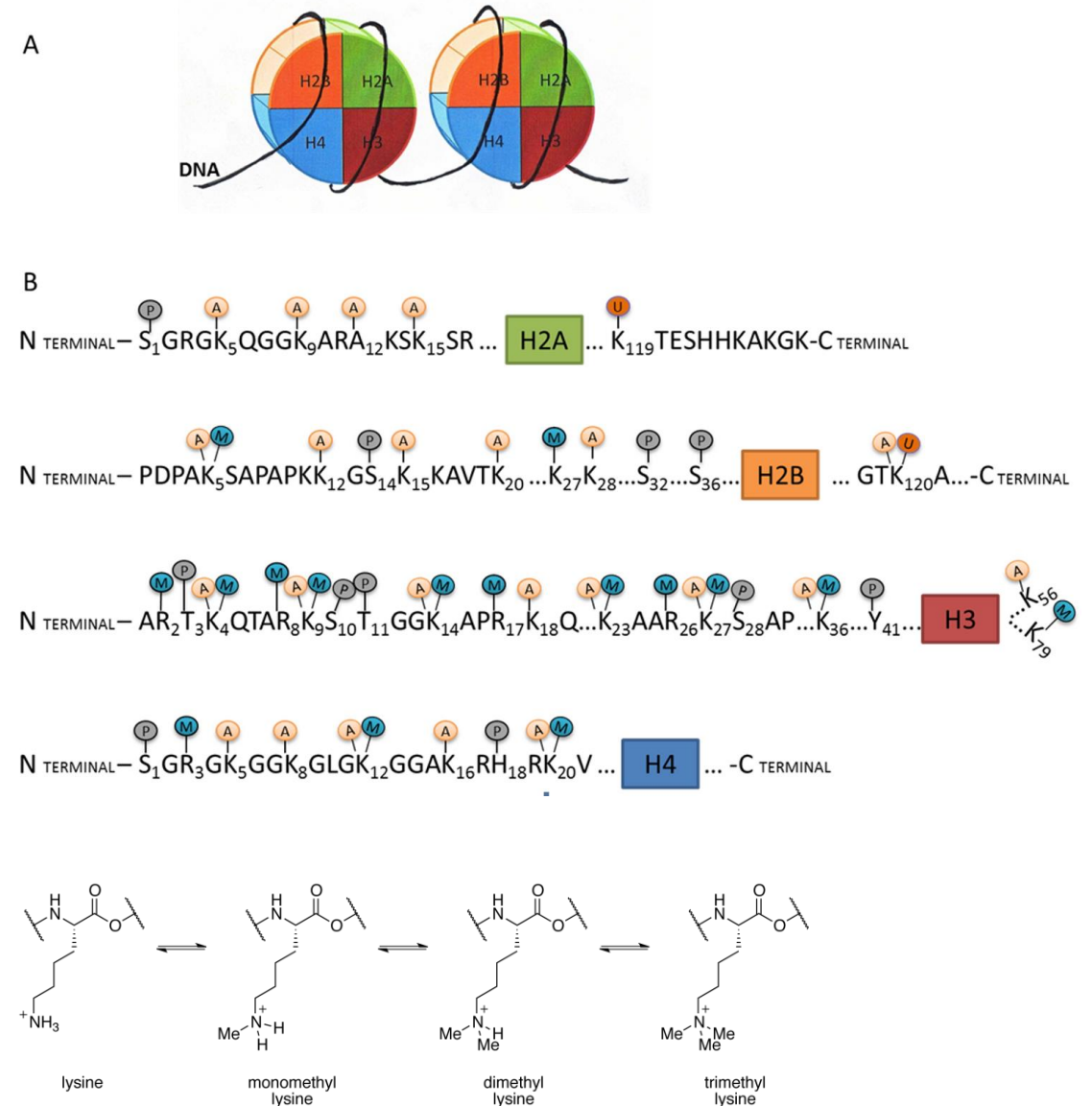
Strum et al. Hotspot mutations in H3F3A and IDH1 define distinct epigenetic and biological subgroups of glioblastoma

Mechanism—epigenetic and metabolism are linked



Histone modification

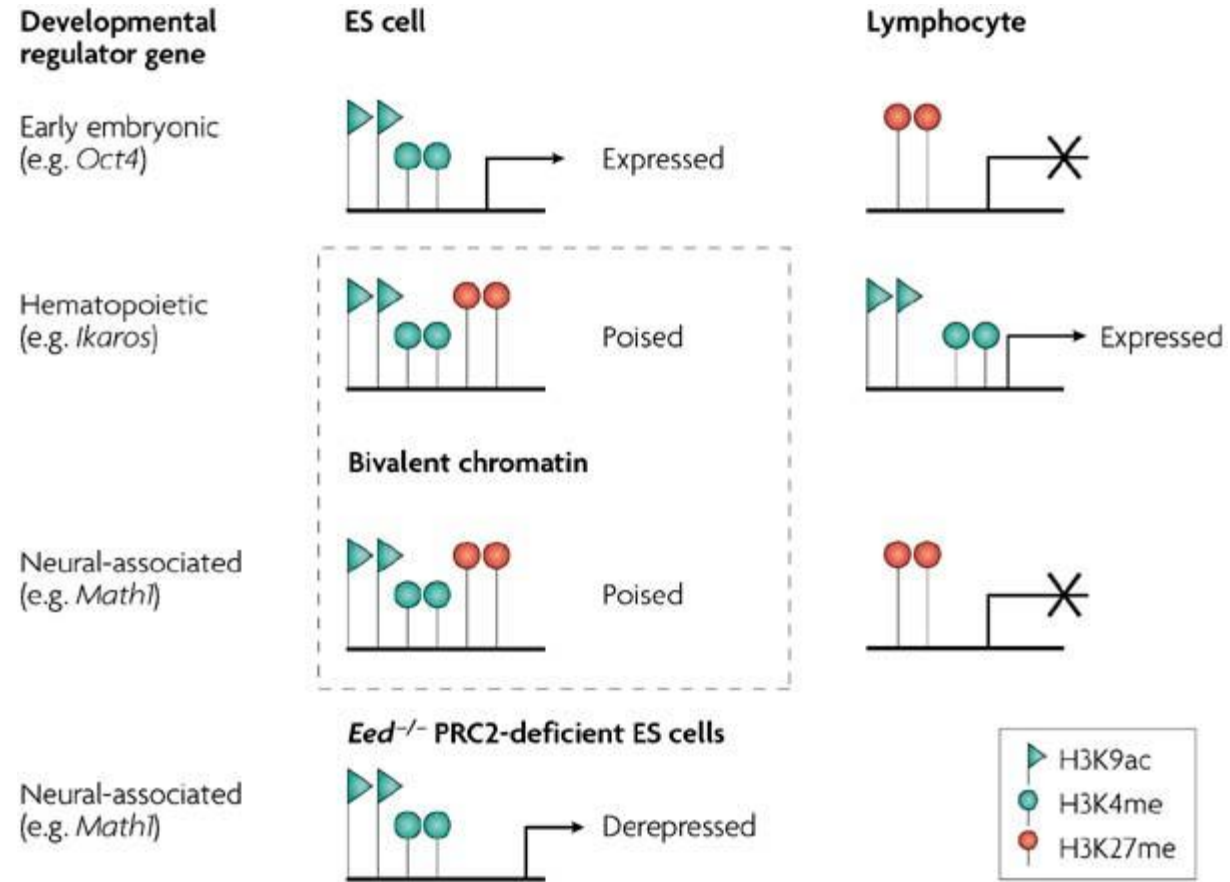
- Many different modifications possible
 - Acetylation
 - Methylation
 - Phosphorylation
 - Histone splice variants affect possible modification
- Consequences?
 - DNA is acidic and histones are basic
 - Histone marks change the DNA histone binding affinity creating open chromatin region—basic chemistry
 - Interact with gene transcription machinery—complex
 - Combinatorial effects?



Histone modifications

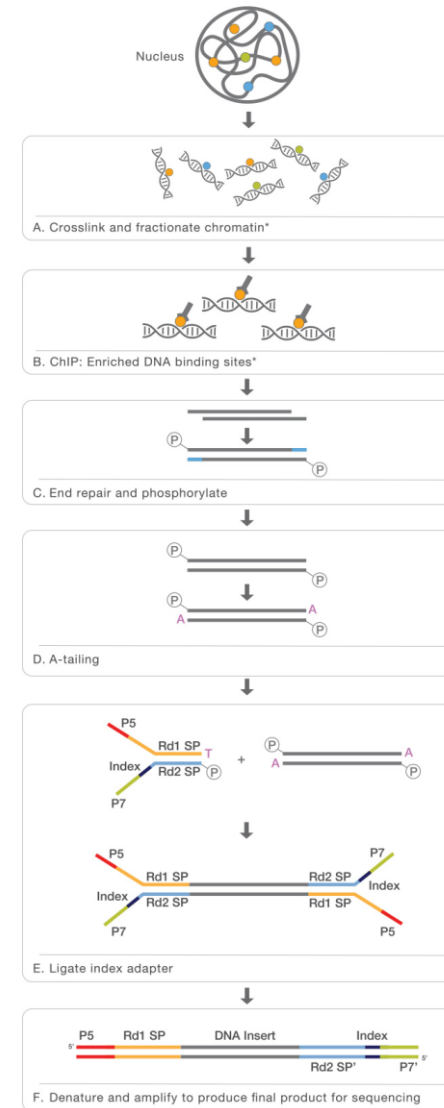
Histone modification or variant	Signal characteristics	Putative functions
H2A.Z	Peak	Histone protein variant (H2A.Z) associated with regulatory elements with dynamic chromatin
H3K4me1	Peak/region	Mark of regulatory elements associated with enhancers and other distal elements, but also enriched downstream of transcription starts
H3K4me2	Peak	Mark of regulatory elements associated with promoters and enhancers
H3K4me3	Peak	Mark of regulatory elements primarily associated with promoters/transcription starts
H3K9ac	Peak	Mark of active regulatory elements with preference for promoters
H3K9me1	Region	Preference for the 5' end of genes
H3K9me3	Peak/region	Repressive mark associated with constitutive heterochromatin and repetitive elements
H3K27ac	Peak	Mark of active regulatory elements; may distinguish active enhancers and promoters from their inactive counterparts
H3K27me3	Region	Repressive mark established by polycomb complex activity associated with repressive domains and silent developmental genes
H3K36me3	Region	Elongation mark associated with transcribed portions of genes, with preference for 3' regions after intron 1
H3K79me2	Region	Transcription-associated mark, with preference for 5' end of genes
H4K20me1	Region	Preference for 5' end of genes

Bivalent chromatin in stem cells



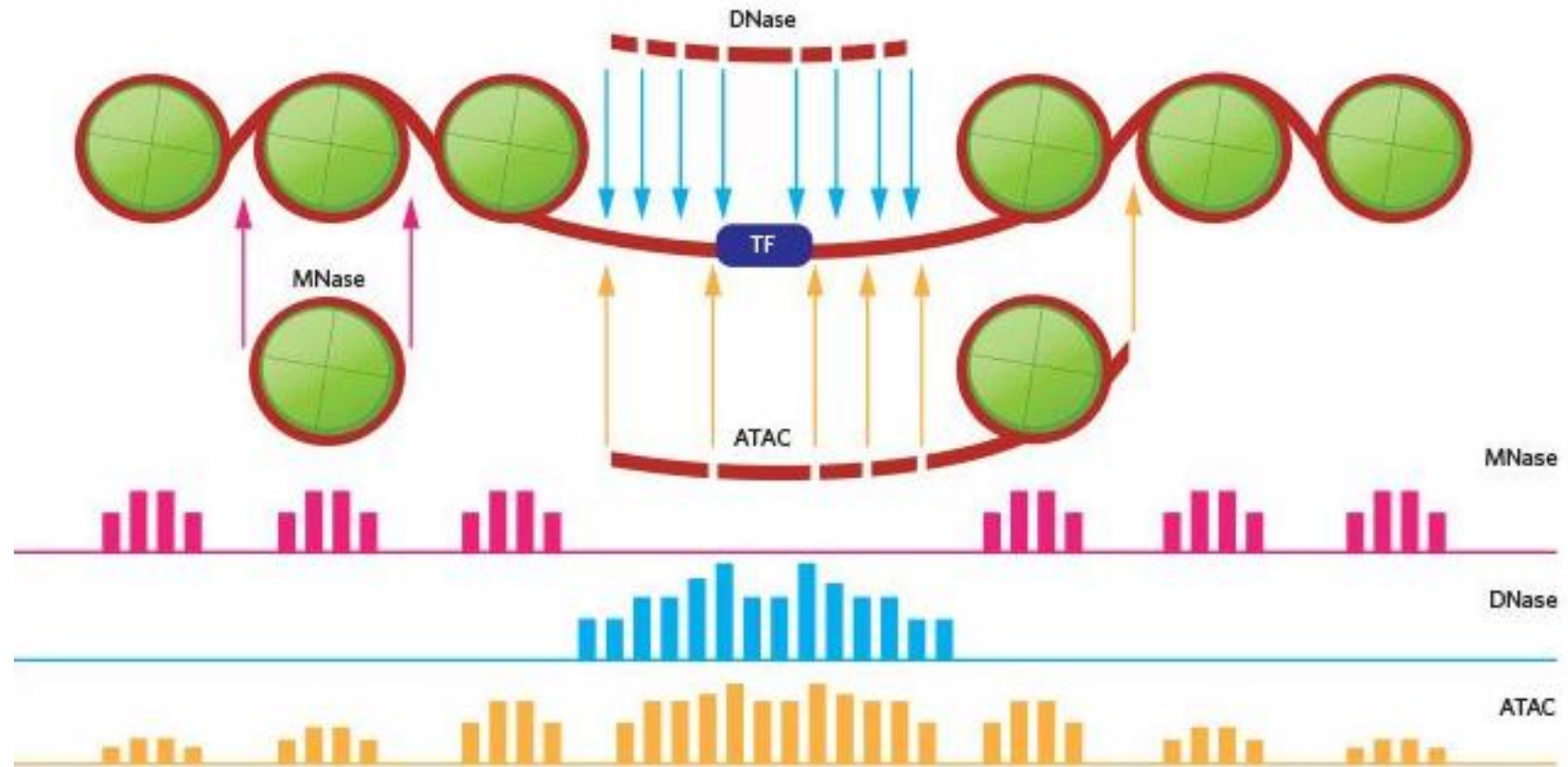
ChIPseq

- **ChIPseq**—chromatin immunoprecipitation
 - Grab the part of chromatin we are interested in
 - Nucleosome mark or other chromatin proteins –ex: Transcription factors
- **ChIPseq—how to quantify**
 - By sequencing-most recent method highly accurate and unbiased
 - ChIPchip-microarray like hybridization method– need genomics probes
 - ChIP-PCR-small scale validation method

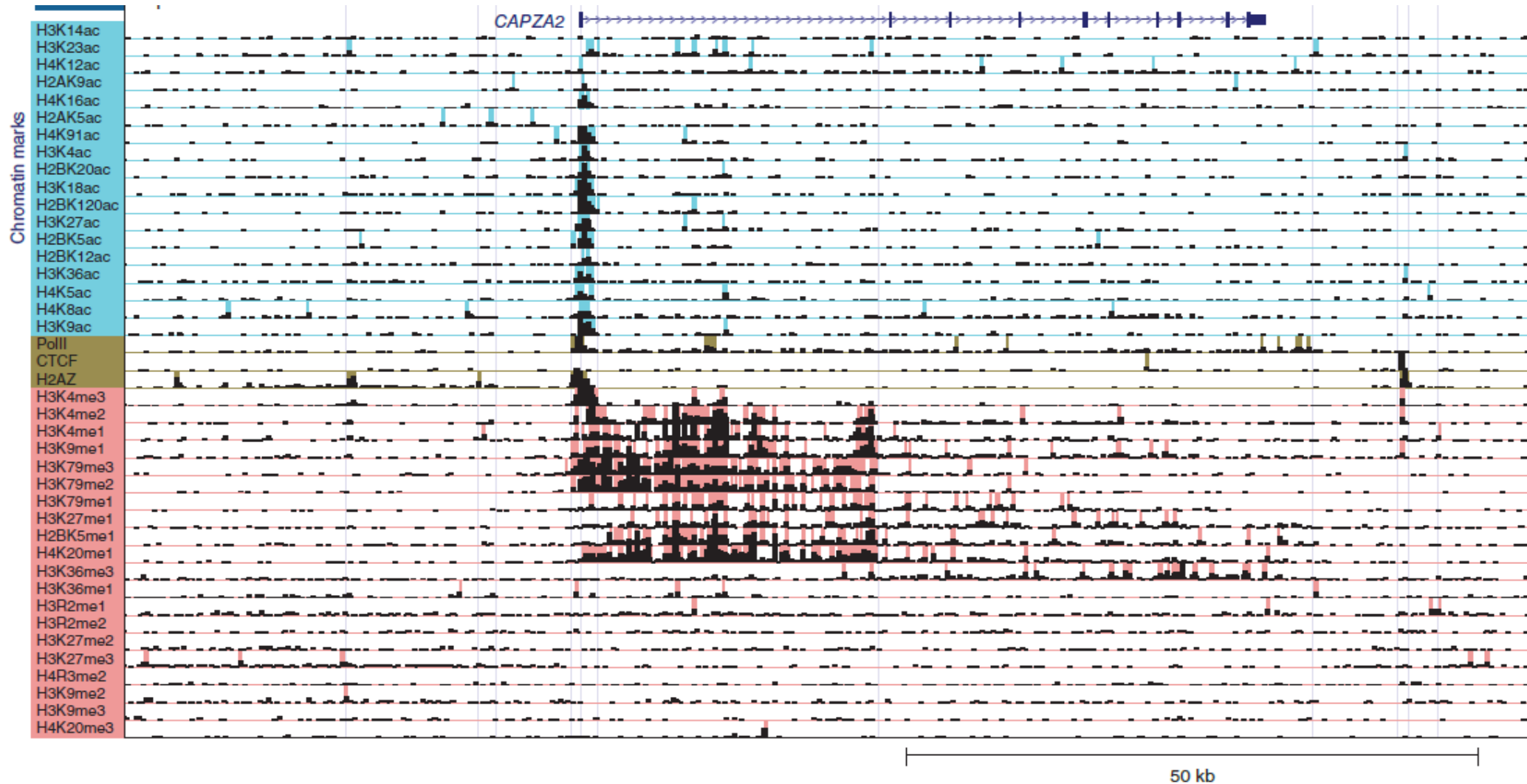


Open chromatin assays

- Looking at which parts of the chromatin are accessible
- DNase-seq—digest all unbound DNA
- ATAC-seq—transposon inserted near nucleosome boundaries



What the data looks like



- ENCODE, the **Encyclopedia Of DNA Elements** goal identify all functional elements in the human genome sequence
- 38 histone marks: 2^{38} states?
- What is the combinatorial complexity?

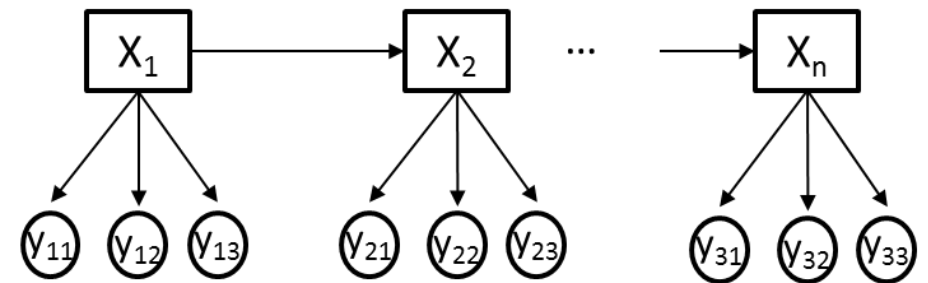
Discovery and characterization of chromatin states for systematic annotation of the human genome

Jason Ernst & Manolis Kellis, Nature Biotech 2010

- **chromoHMM**
- Multivariate Hidden Markov Model
- The number of states is unknown!
- Many random initializations with variable number of states-fit parameters by EM
- Best model has 79 states-using **BIC**
- Use best model to initialize smaller models—nested initialization
- Final model has 51 states

X_t : hidden state variables

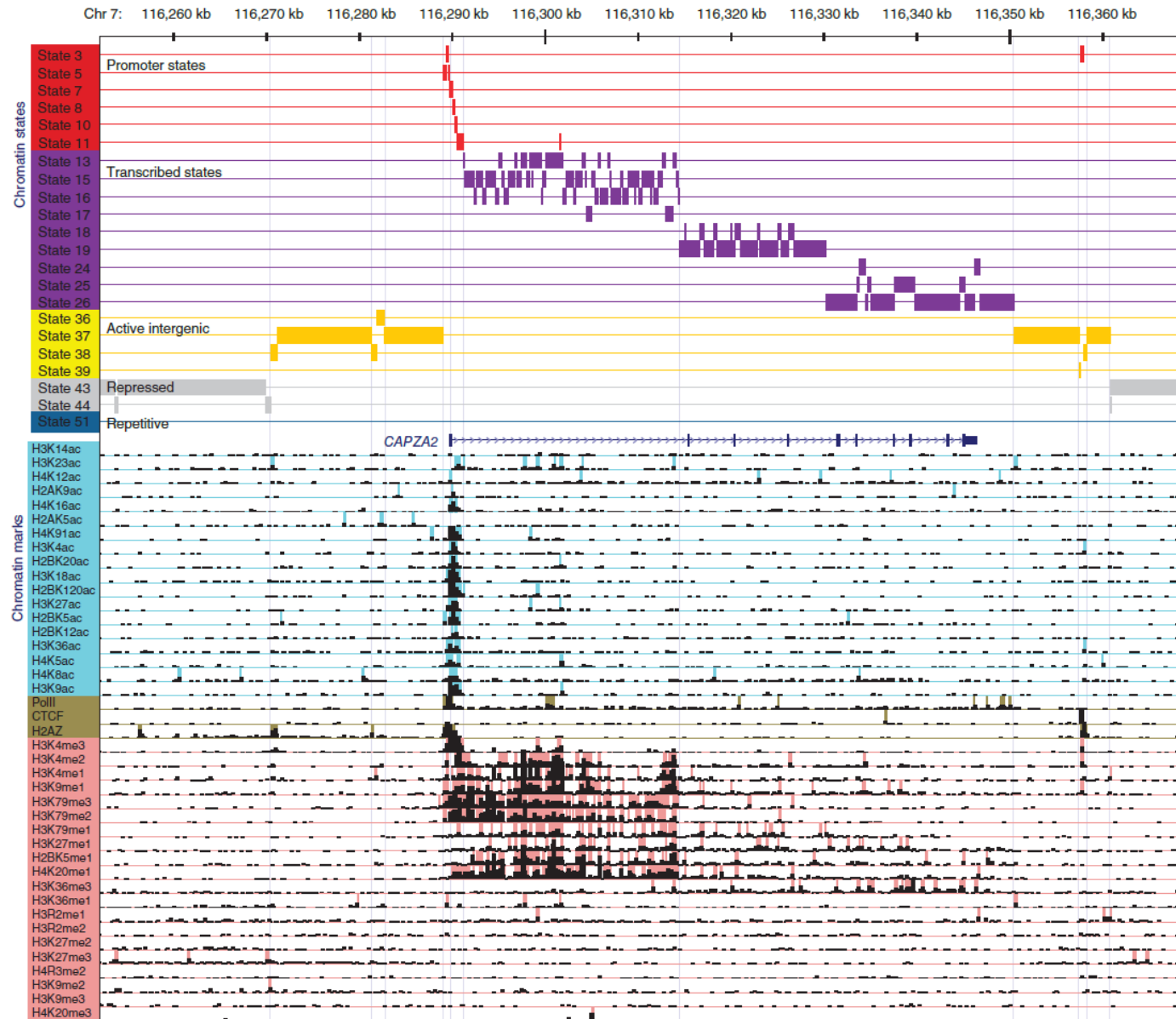
y_{ti} : i^{th} observed variable @ t



Note about model selection

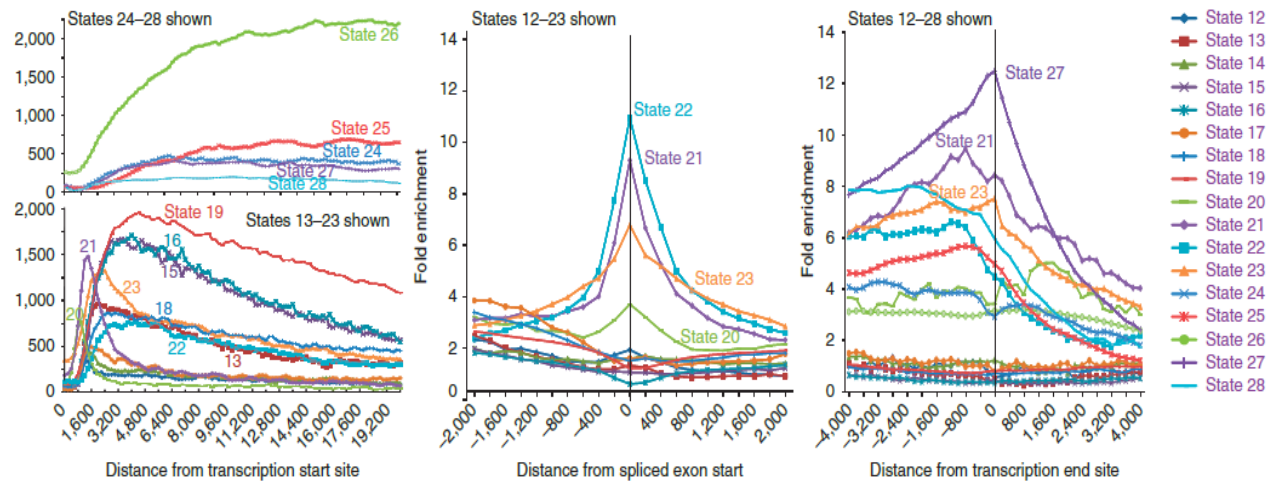
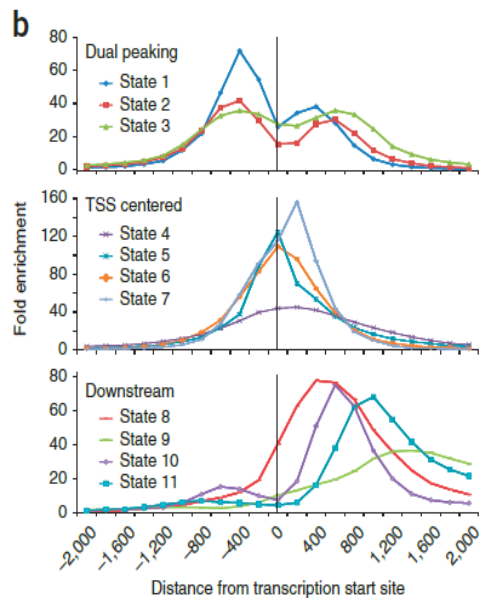
- Want the best model that doesn't overfit the data
- Bayesian information criterion: $BIC = -2 \times \ln(\text{likelihood}) + \ln(N) \times k$
 - k = number of parameters estimated
 - N = number of observations
- Akaike information criterion: $AIC = -2 \times \ln(\text{likelihood}) + 2 \times k$ -- less conservative: will produce larger models
- BIC: attempt to find the "true" model
- AIC: "true" model is infinitely complex so find the best predictive model
 - Asymptotically equivalent to minimizing parameter CVs
 - Similar to cross-validation

Example of state assignment

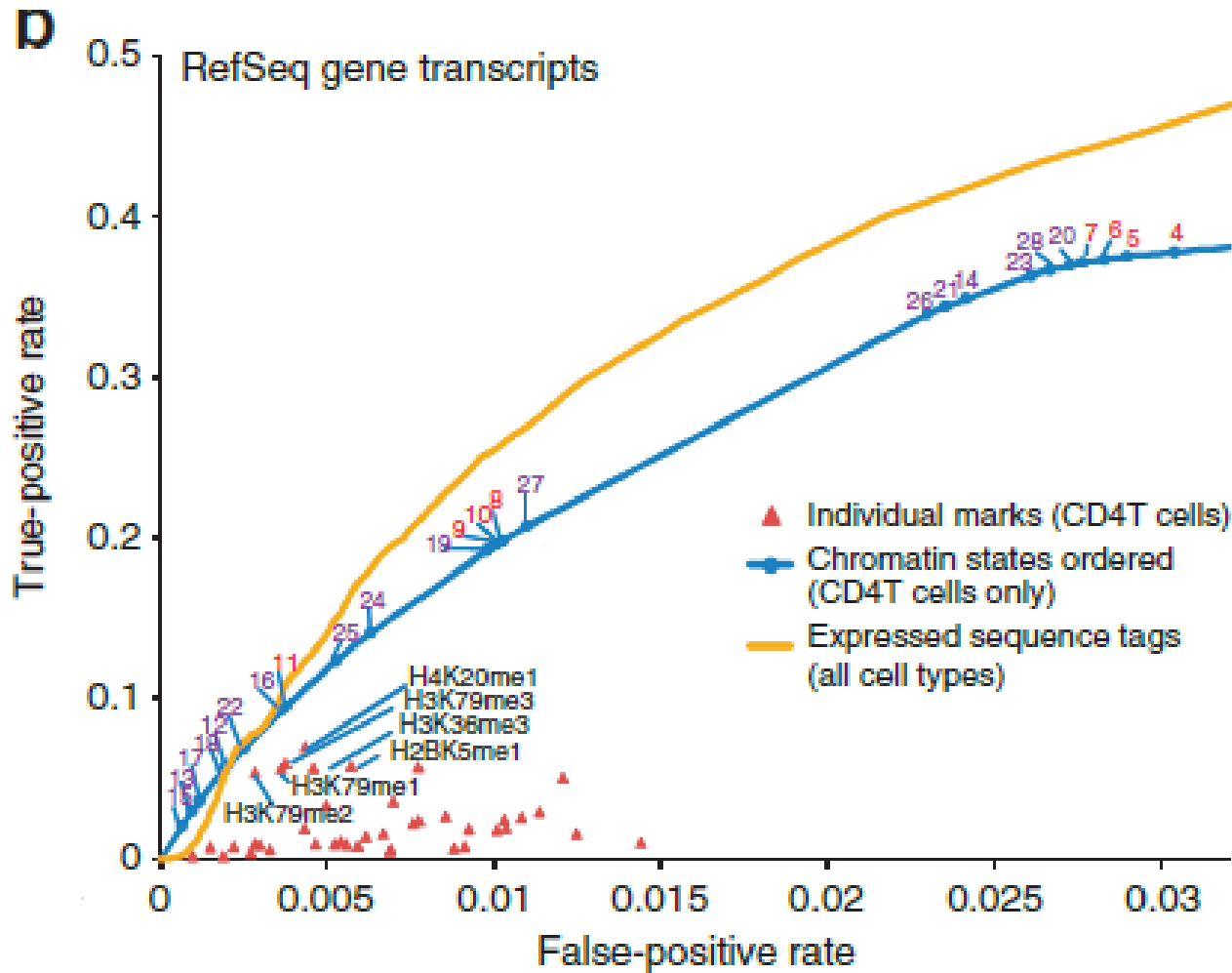


Comparisons with annotations

Gene GO category	Chromatin state at TSS of corresponding gene					
	3	4	5	6	7	8
Cell cycle phase	2.70 (10 ⁻⁷)	0.57 (1.0)	1.61 (10 ⁻³)	1.45 (1.0)	1.15 (1.0)	1.51 (1.0)
Embryonic development	1.24 (1.0)	2.82 (10 ⁻²²)	1.07 (1.0)	0.85 (1.0)	0.54 (1.0)	1.00 (1.0)
Chromatin	1.20 (1.0)	0.48 (1.0)	2.17 (10 ⁻⁷)	1.64 (1.0)	0.85 (1.0)	0.85 (1.0)
Response to DNA damage	1.20 (1.0)	0.35 (1.0)	1.55 (0.07)	2.13 (10 ⁻¹¹)	1.97 (10 ⁻⁴)	0.84 (1.0)
RNA processing	0.49 (1.0)	0.26 (1.0)	1.31 (1.0)	1.91 (10 ⁻¹¹)	2.64 (10 ⁻²⁴)	2.46 (10 ⁻⁴)
T-cell activation	0.77 (1.0)	0.88 (1.0)	1.27 (1.0)	0.70 (1.0)	0.79 (1.0)	4.72 (10 ⁻⁷)



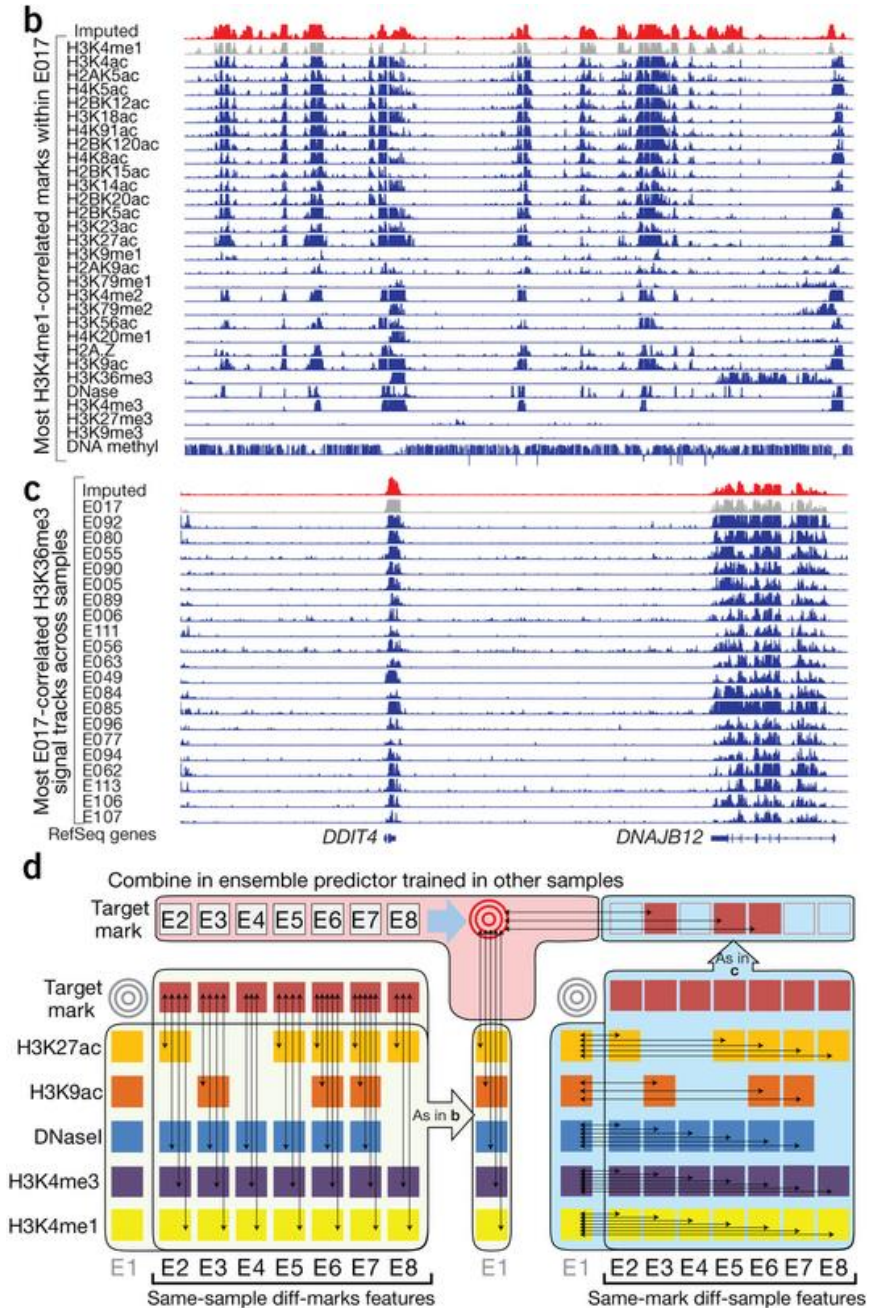
Many marks are correlated but combinatorial organization still matters



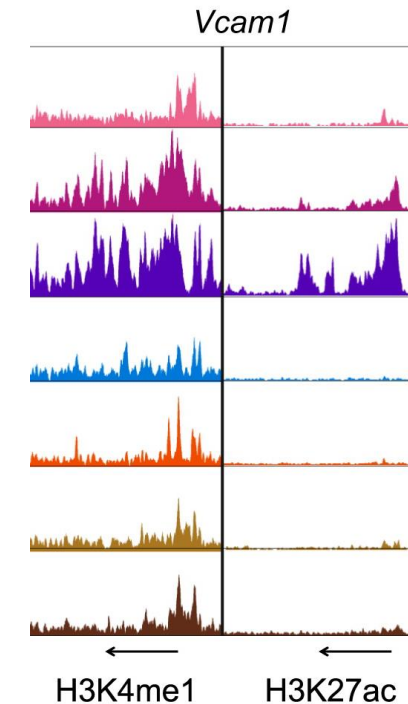
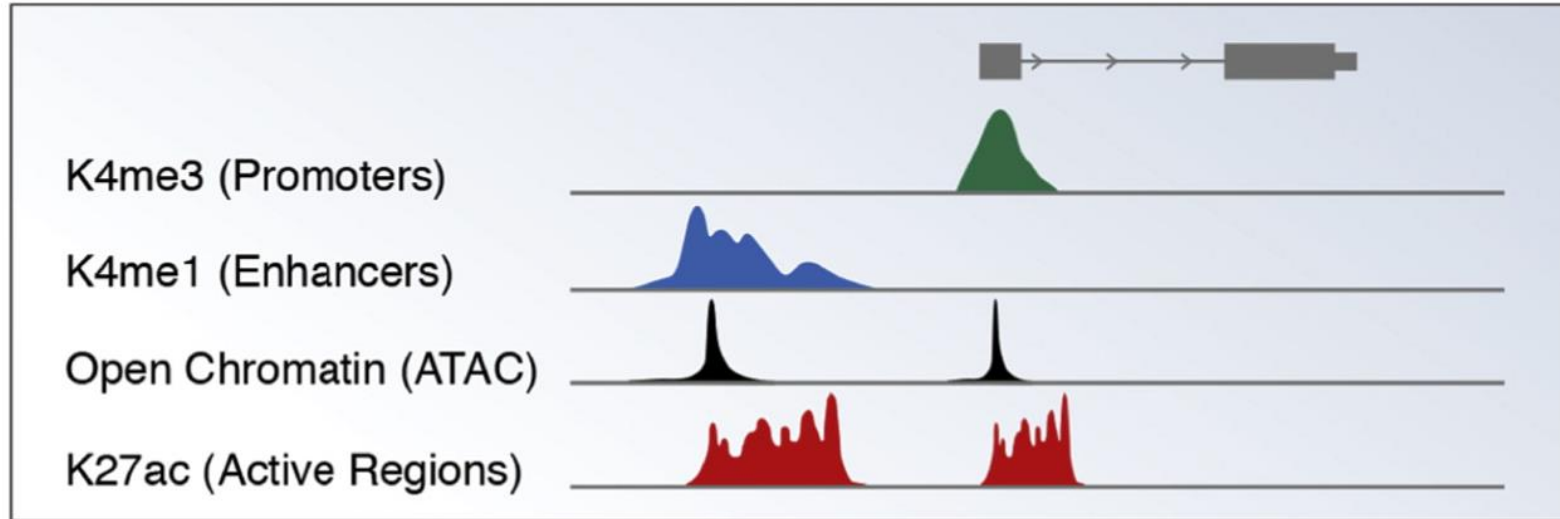
- We can predict novel transcripts from histone mark patterns
- Histone patterns are cell type specific but gene prediction is not!

ChromImpute

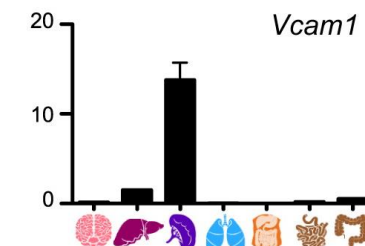
- Chromatin marks are correlated with each other and also across samples
- We don't have to measure everything
- Large-scale imputation of epigenomic datasets for systematic annotation of diverse human tissues. Jason Ernst & Manolis Kellis *Nature Biotechnology*
- Prediction methodology—regression trees
- Continuous analog of decision trees for predicting a continuous variable



Commonly used chromatin measurements



- Since chromatin profiles are highly correlated we can measure just a few marks to get a comprehensive picture



LONG NON-CODING RNA

Non-coding RNAs

- A **non-coding RNA** (ncRNA) is a functional **RNA** molecule that is transcribed from DNA but not translated into proteins
- Infrastructure/house-keeping
 - Ribosome , spliceosome, transfer RNAs
 - snoRNAs (small nucleolar RNAs) guide chemical modifications to above
- Regulatory
 - **microRNAs**-pair with complementary sequence in the UTR of coding genes to induce gene down-regulation or silencing. Processed from longer genes into small final products **Small interfering RNAs (siRNAs)**
 - **Small interfering RNAs (siRNAs)**-can also refer to a synthetic product meant to coopt the miRNA mechanism
 - **Piwi-interacting RNAs (piRNAs)**-involved in silencing of transposable elements in the germ-line
 - **Long non-coding RNAs (lncRNAs)** lncRNAs are considered as non-protein coding transcripts >200 nt in length. The majority of non-coding RNAs belong to this group. Many RNAs in the group are treated by the cell as coding genes, they have exons, are spliced and have polyA tails

Table 1. Classes of non-coding RNA in mammals

NcRNA class	Characteristics
<i>Established ncRNA classes</i>	
Long (regulatory) non-coding RNAs (lncRNAs)	The broadest class, lncRNAs, encompass all non-protein-coding RNA species >~200 nt, including mRNA-like ncRNAs. Their functions include epigenetic regulation, acting as sequence-specific tethers for protein complexes and specifying subcellular compartments or localization
Small interfering RNAs (siRNAs)	Small RNAs ~21–22 nt long, produced by Dicer cleavage of complementary dsRNA duplexes. siRNAs form complexes with Argonaute proteins and are involved in gene regulation, transposon control and viral defence
microRNAs (miRNAs)	Small RNAs ~22 nt long, produced by Dicer cleavage of imperfect RNA hairpins encoded in long primary transcripts or short introns. They associate with Argonaute proteins and are primarily involved in post-transcriptional gene regulation
PIWI-interacting RNAs (piRNAs)	Dicer-independent small RNAs ~26–30 nt long, principally restricted to the germline and somatic cells bordering the germline. They associate with PIWI-clade Argonaute proteins and regulate transposon activity and chromatin state
Promoter-associated RNAs (PARs)	A general term encompassing a suite of long and short RNAs, including promoter-associated RNAs (PASRs) and transcription initiation RNAs (tiRNAs) that overlap promoters and TSSs. These transcripts may regulate gene expression
Small nucleolar RNAs (snoRNAs)	Traditionally viewed as guides of rRNA methylation and pseudouridylation. However, there is emerging evidence that they also have gene-regulatory roles
<i>Other recently described classes</i>	
X-inactivation RNAs (xiRNAs)	Dicer-dependent small RNAs processed from duplexes of two lncRNAs, Xist and Tsix, which are responsible for X-chromosome inactivation in placental mammals
Sno-derived RNAs (sdRNAs)	Small RNAs, some of which are Dicer-dependent, which are processed from small nucleolar RNAs (snoRNAs). Some sdRNAs have been shown to function as miRNA-like regulators of translation
microRNA-offset RNAs (moRNAs)	Small RNAs ~20 nt long, derived from the regions adjacent to pre-miRNAs. Their function is unknown
tRNA-derived RNAs	tRNAs can be processed into small RNA species by a conserved RNase (angiogenin). They are able to induce translational repression
MSY2-associated RNAs (MSY-RNAs)	MSY-RNAs are associated with the germ cell-specific DNA/RNA binding protein MSY2. Like piRNAs, they are largely restricted to the germline and are ~26–30 nt long. Their function is unknown
Telomere small RNAs (tel-sRNAs)	Dicer-independent ~24 nt RNAs principally derived from the G-rich strand of telomeric repeats. May have a role in telomere maintenance
Centrosome-associated RNAs (crasiRNAs)	A class of ~34–42 nt small RNAs, derived from centrosomes that show evidence of guiding local chromatin modifications

Pervasive transcription

- 1.2% of the mammalian genome codes for amino acids in proteins.
- evidence over the past decade has suggested that the vast majority of the genome is transcribed, well beyond the boundaries of known genes -- **pervasive transcription**
- Functionality has to be demonstrated via a phenotype

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PLOS BIOLOGY

Most “Dark Matter” Transcripts Are Associated With Known Genes

Harm van Bakel¹, Corey Nislow^{1,2}, Benjamin J. Blencowe^{1,2}, Timothy R. Hughes^{1,2*}

¹ Banting and Best Department of Medical Research, University of Toronto, Toronto, Ontario, Canada, ² Department of Molecular Genetics, University of Toronto, Toronto, Ontario, Canada

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PLOS BIOLOGY

Perspective

The Reality of Pervasive Transcription

Michael B. Clark¹, Paulo P. Amaral^{1,3}, Felix J. Schlesinger^{2,3}, Marcel E. Dinger¹, Ryan J. Taft¹, John L. Rinn³, Chris P. Ponting⁴, Peter F. Stadler⁵, Kevin V. Morris⁶, Antonin Morillon⁷, Joel S. Rozowsky⁸, Mark B. Gerstein⁸, Claes Wahlestedt⁹, Yoshihide Hayashizaki¹⁰, Piero Carninci¹⁰, Thomas R. Gingeras^{2*}, John S. Mattick^{1*}

Human Molecular Genetics, 2010, Vol. 19, Review Issue 2 R162–R168
doi:10.1093/hmg/ddq362
Advance Access published on August 25, 2010

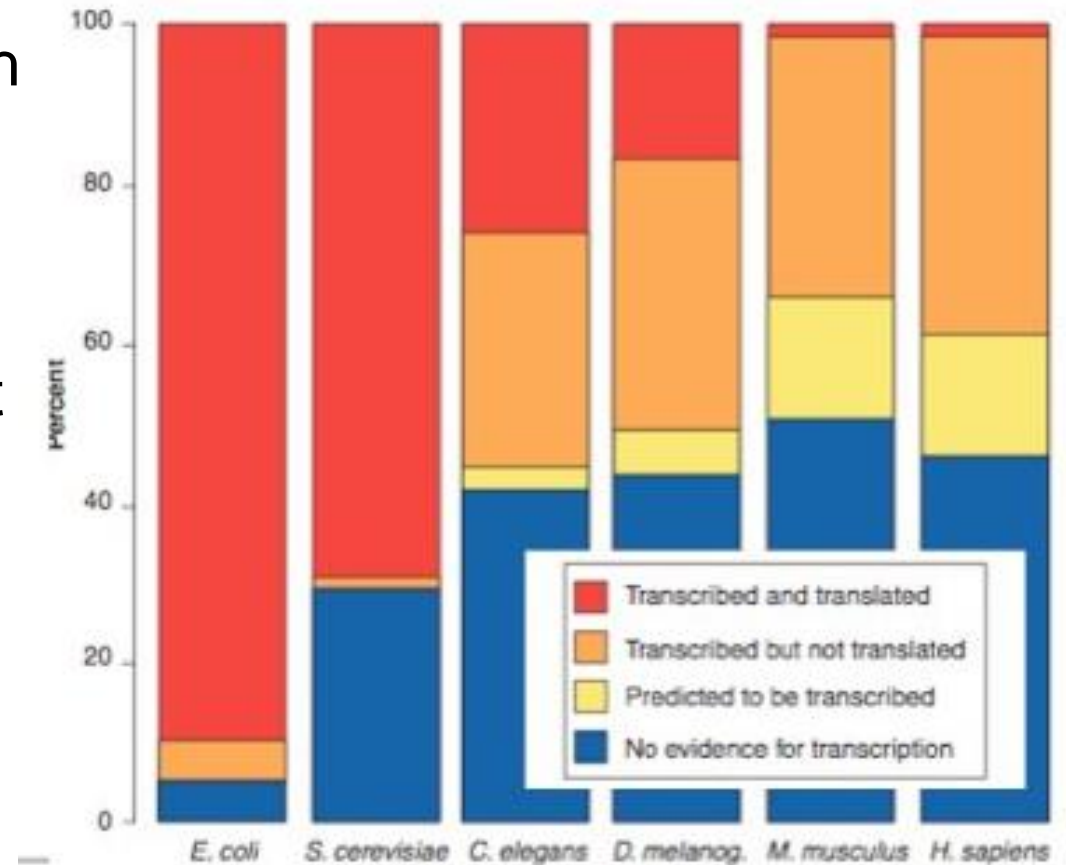
Transcribed dark matter: meaning or myth?

Chris P. Ponting* and T. Grant Belgard

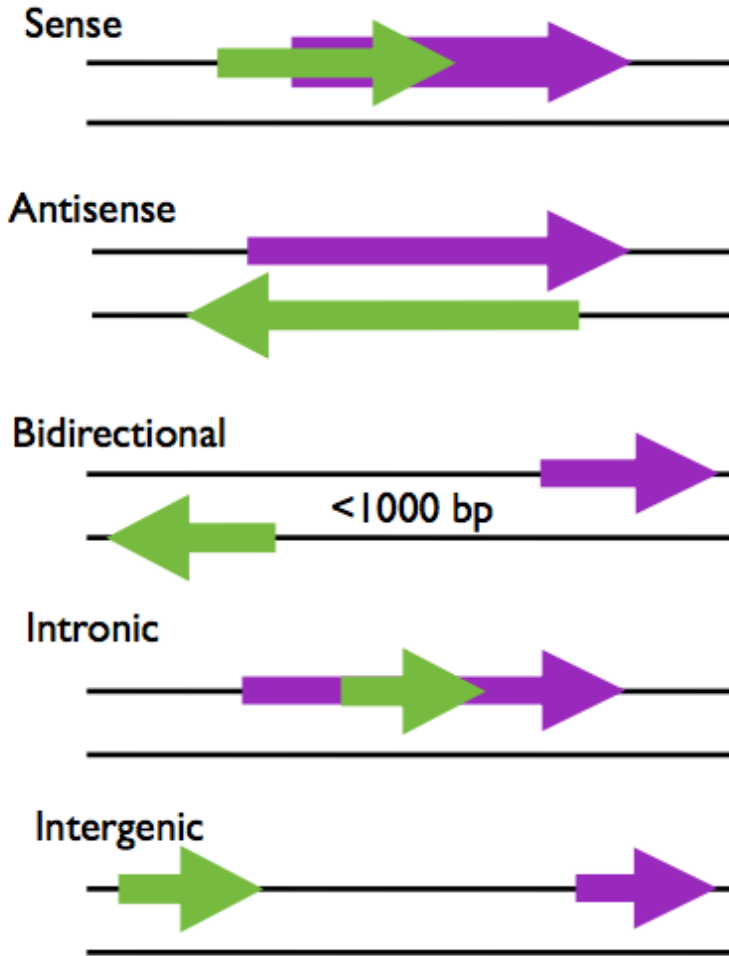
MRC Functional Genomics Unit, Department of Physiology, Anatomy and Genetics, University of Oxford, South Parks Road, Oxford OX1 3QX, UK

Long non-coding RNA

- 80% of the transcription in mammalian genomes is exclusively associated with long non-coding RNAs (lncRNAs)
- >2 (some >100) kb in length, spliced and could contain polyA signals
- No obvious open reading frame—can't get a long protein sequence without hitting a stop codon
- Mouse transcriptome (~180,000)
 - ~20,000 protein coding genes
 - ~160,000 lncRNAs



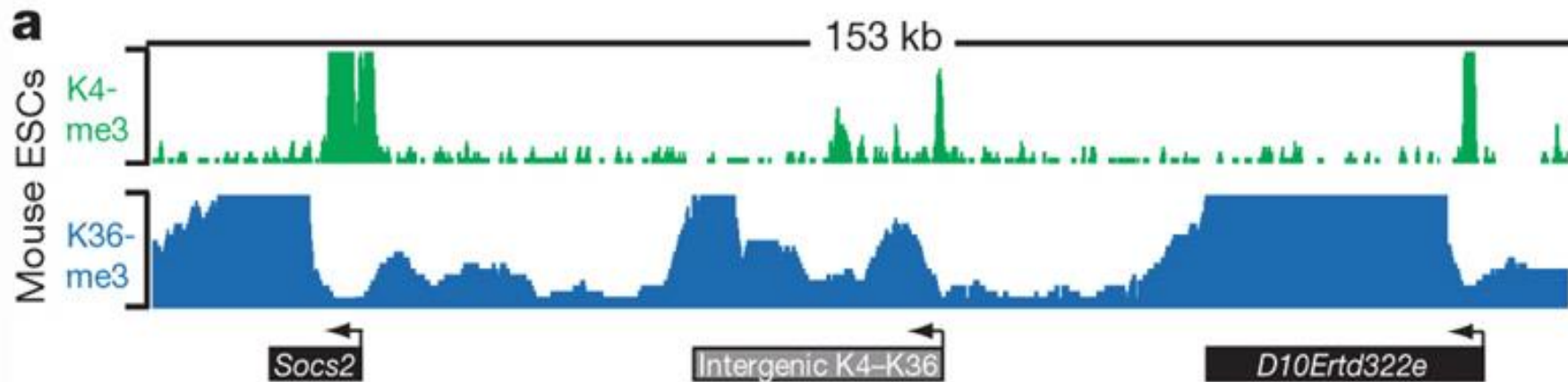
Coding gene proximity categorization



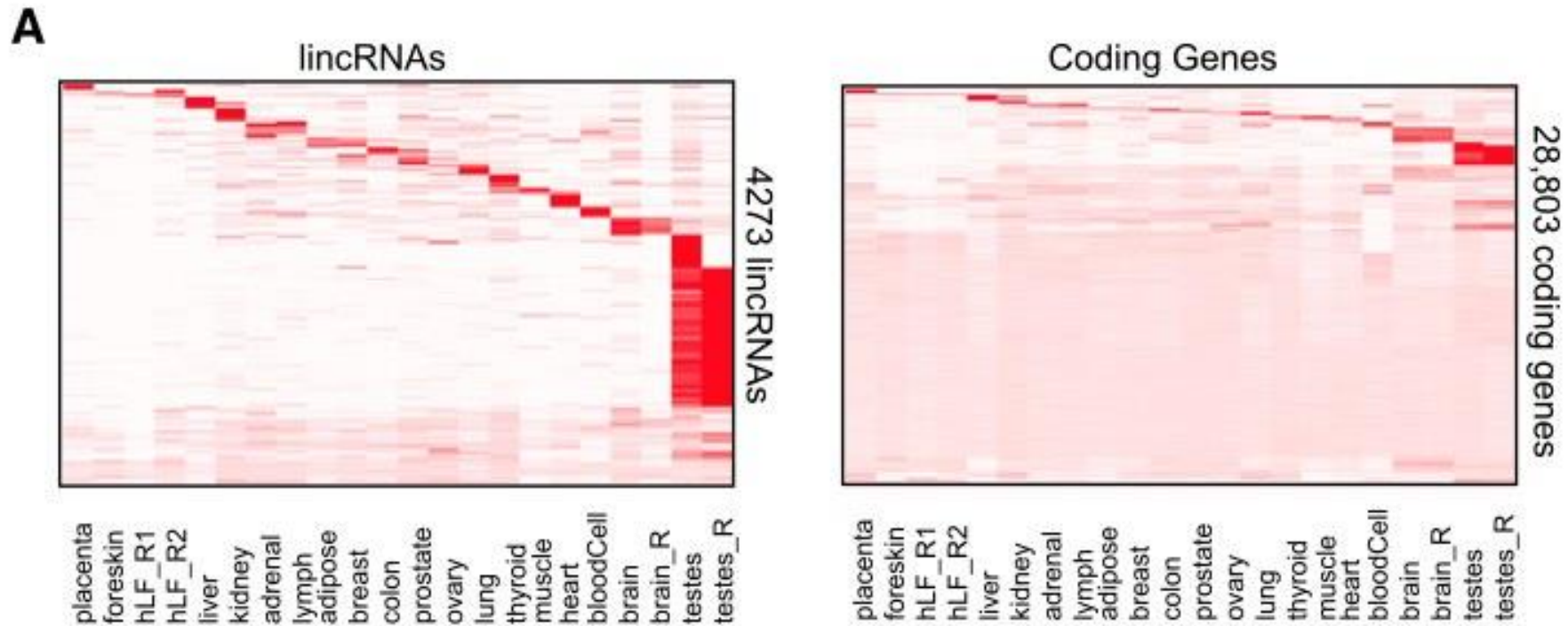
Legend:
Green = lncRNA,
Purple = Protein
Coding Gene

Non-coding RNAs have an epigenetic profile similar to coding genes

Guttman M, Amit I, Garber M, French C, Lin M, Feldser D, Huarte M, Cabili M, Carey BW, Cassady J, Jaenisch R, Mikkelsen T, Jacks T, Hacohen N, Bernstein BE, Kellis M, Regev A, Rinn JL, Lander ES. (2009) Chromatin Structure Reveals Over a Thousand Highly Conserved, Large Non-coding RNAs in Mammals. *Nature*. 458(7235):223-7. PMID:



Cell and tissue specific expression



Cabili MN. Integrative annotation of human large intergenic noncoding RNAs reveals global properties and specific subclasses. *Genes Dev.* 2011 Sep 15;25(18):1915-27

Functionality controversy

- **Transcriptional Noise**

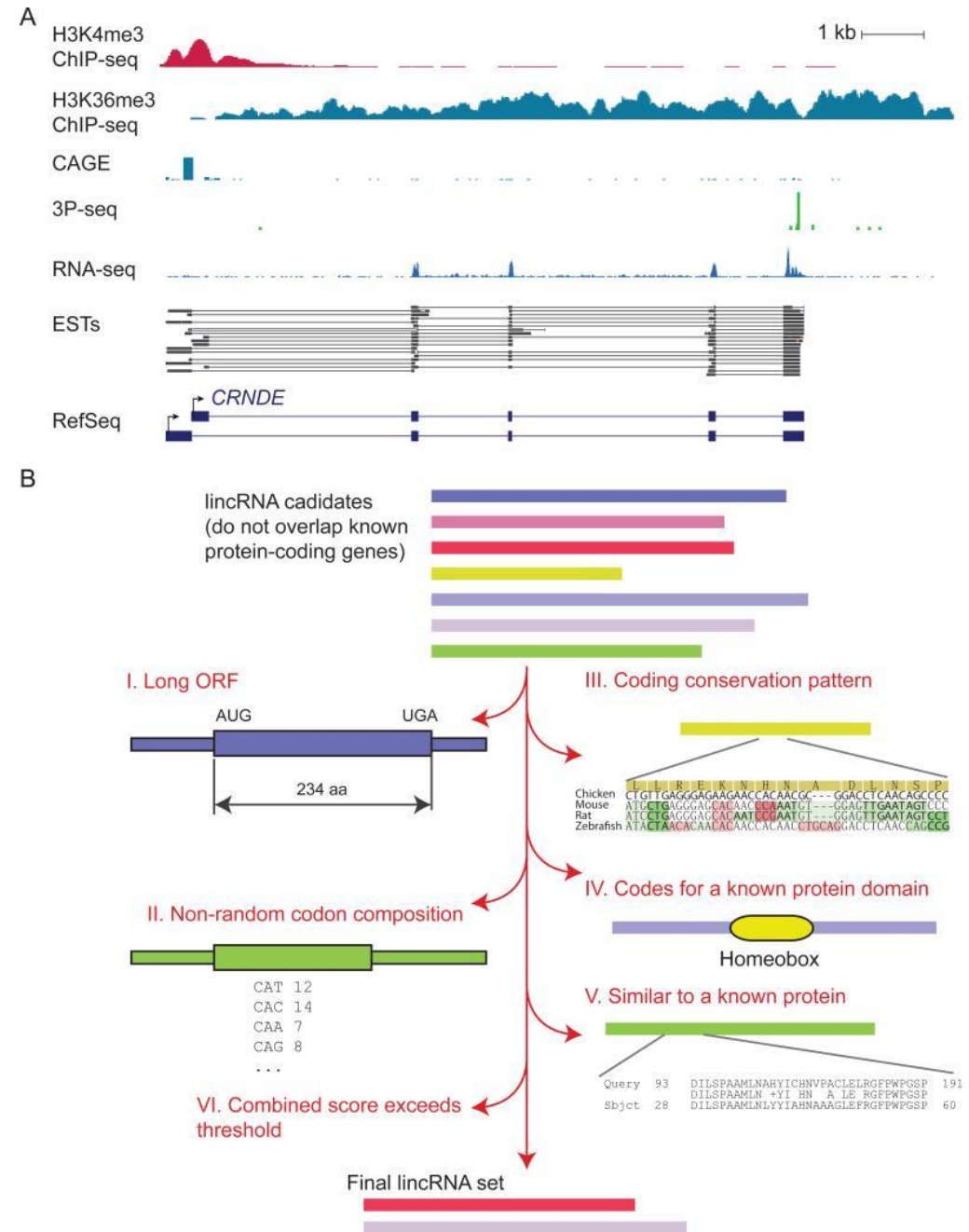
- Low affinity binding of RNA polymerase to randomly generated promoter sequences.
- More efficient to allow random transcripts than to downregulate nonspecific transcription.
- LncRNAs are generally expressed at low levels
- LncRNA sequences are not well conserved between species.
- Sequencing with splicing/polyadenylation signals can occur by chance-regional chromatin state would direct tissue specific transcription

- **LncRNAs are Functional**

- LncRNAs do not have the strict sequence conservation restraints that protein-coding genes do.
 - LncRNAs may be more plastic than protein coding genes and thus can evolve rapidly.
 - LncRNA promoter sequences are very well conserved.
- General consensus: some are functional and some are not but disagreement over relative frequency

lincRNA annotation

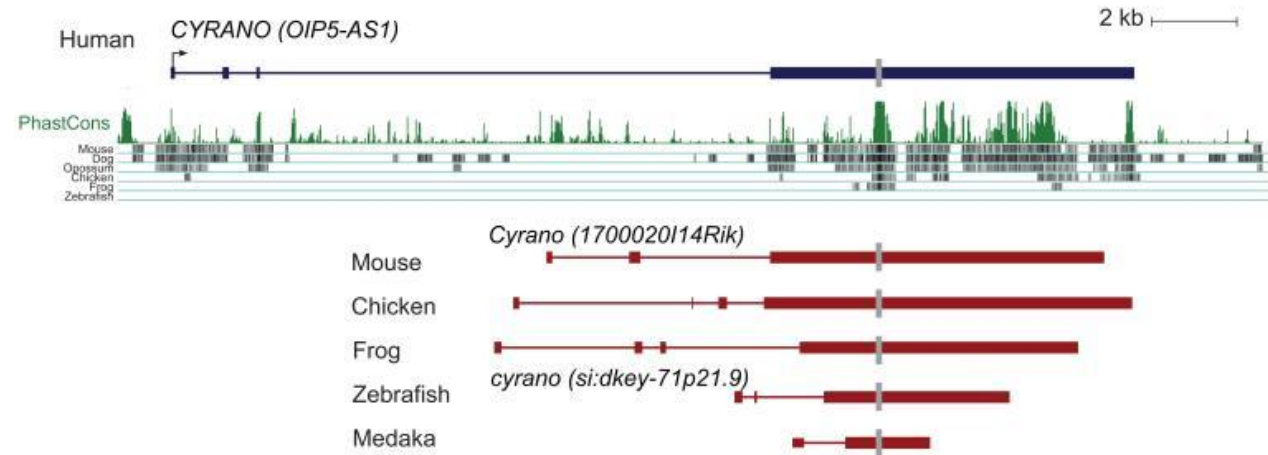
- Chromatin profiles
- ESTs-expressed sequence tag-short cDNA sequences—older technology used in gene discovery
- Cap analysis gene expression (CAGE) snapshot of the 5' end of the messenger RNA



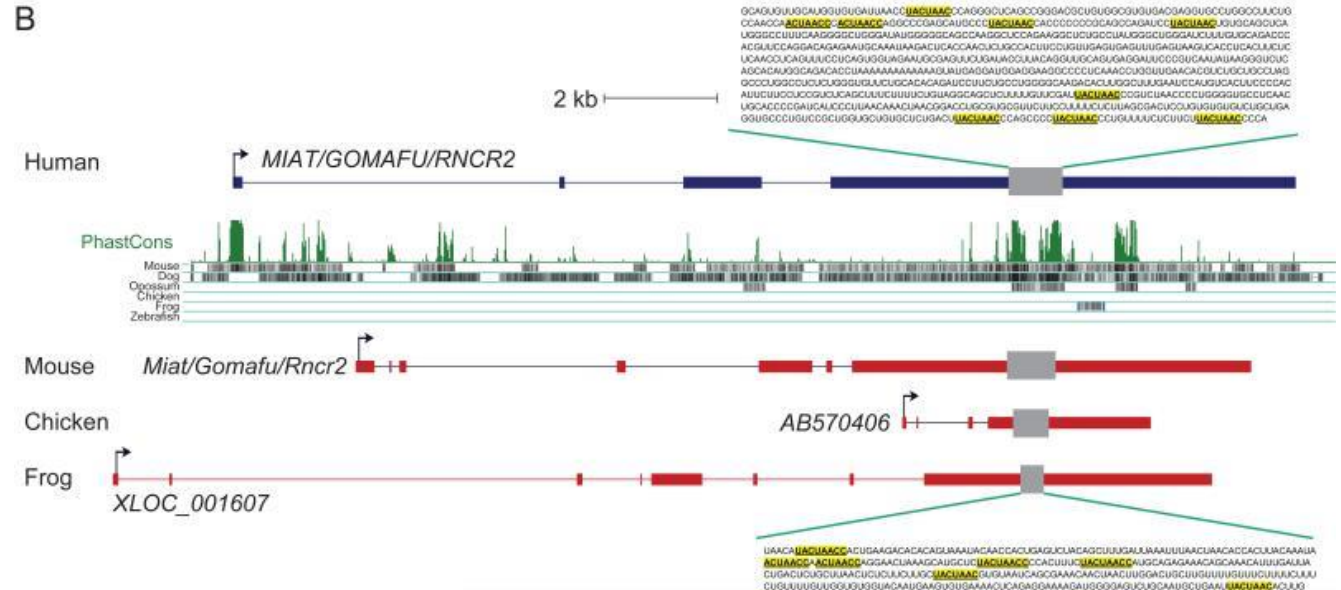
What about conservation?

- Xist is a functional lincRNA with poor sequence conservation but significant exon structure conservation
- The *Cyrano* lincRNA is
 - conserved in vertebrates
 - required for proper morphogenesis and neurogenesis in zebrafish
- *Megamind*
 - conserved in vertebrates
 - required for proper brain development in zebrafish
 - No sequence level conservation
 - Cannot be identified via blastn alignment –but can be identified with HMM

A



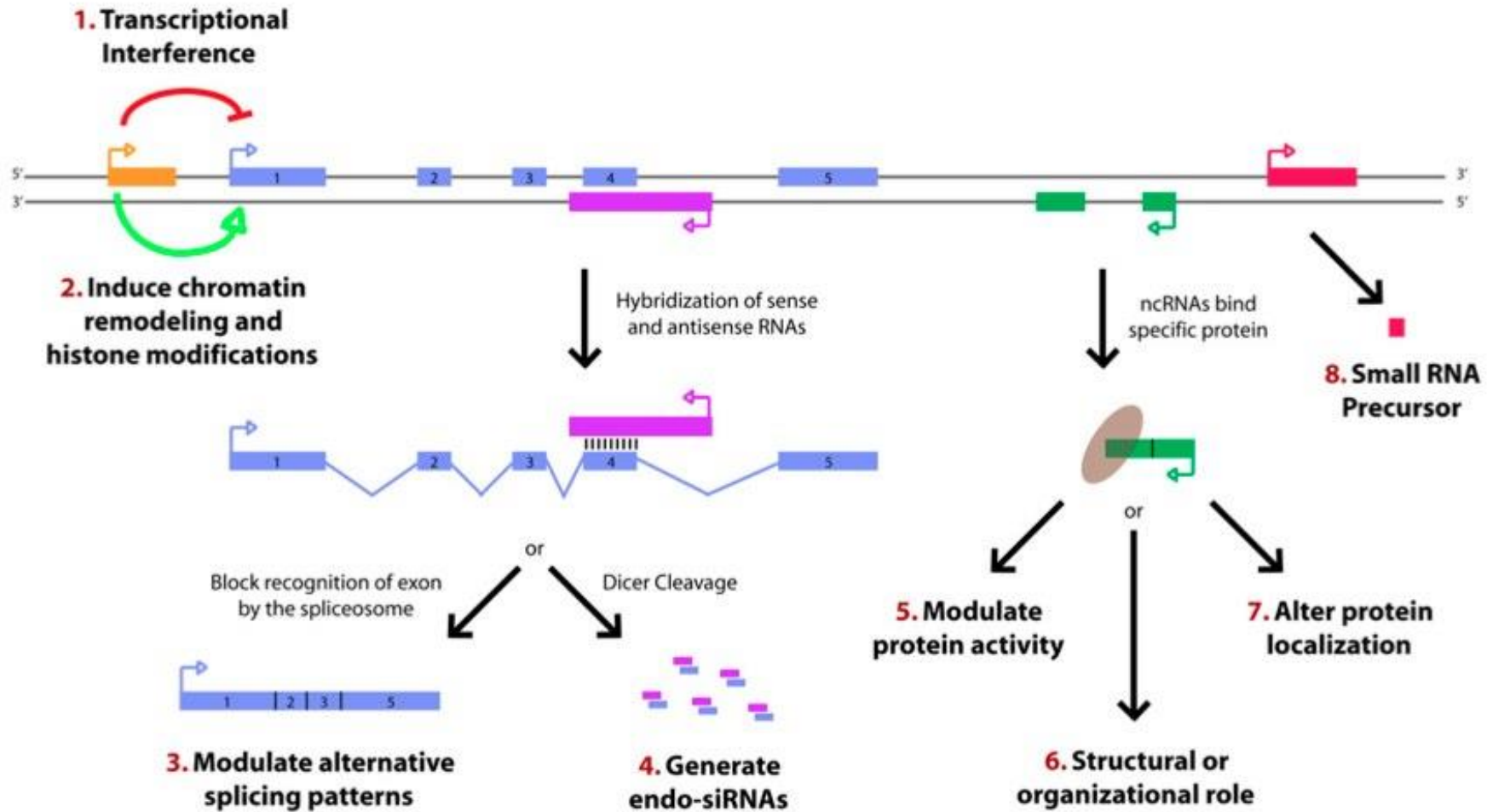
B



lincRNA functional mechanisms

- Cis-acts on nearby gene only, depends on the site of transcription
 - Requires transcription only
 - Requires a processed transcript
- Trans-acts elsewhere in the genome
 - Does not depend on the site of transcription

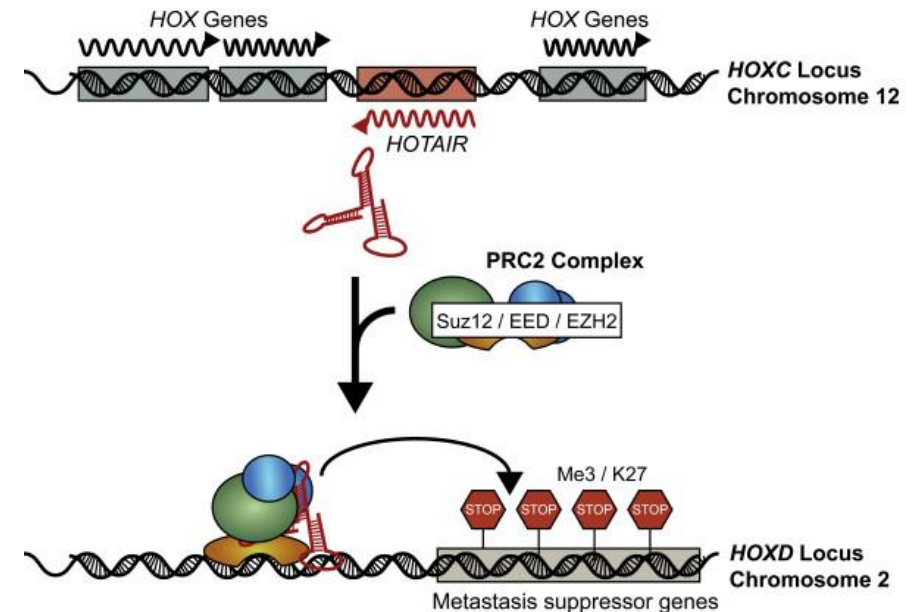
Potential functions of lncRNA



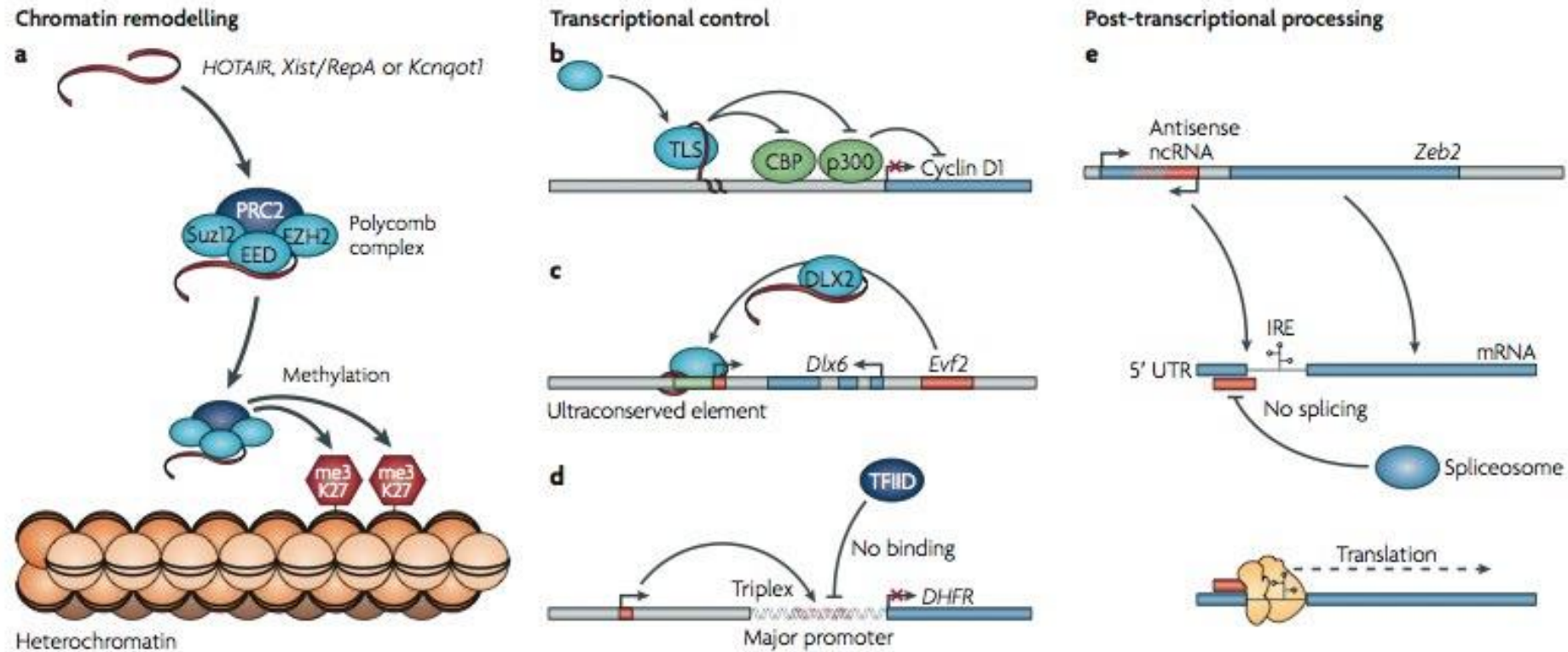
Wilusz JE, Sunwoo H, Spector DL. Long noncoding RNAs: functional surprises from the RNA world. *Genes Dev.* 2009 23(13):1494-504.

Example: HOTAIR

- HOTAIR (for HOX transcript antisense RNA) is first example of an RNA expressed on one chromosome that has been found to influence transcription on another chromosome
- It is required for gene-silencing of the HOXD locus
- It is hypothesized to be important for epigenetic differentiation of skin over the surface of the body.
- HOTAIR was shown to contain distinct protein interaction domains that can associate with polycomb repressive complex 2 (PRC2) and the CoREST–LSD1 complex, which together are required for correct function

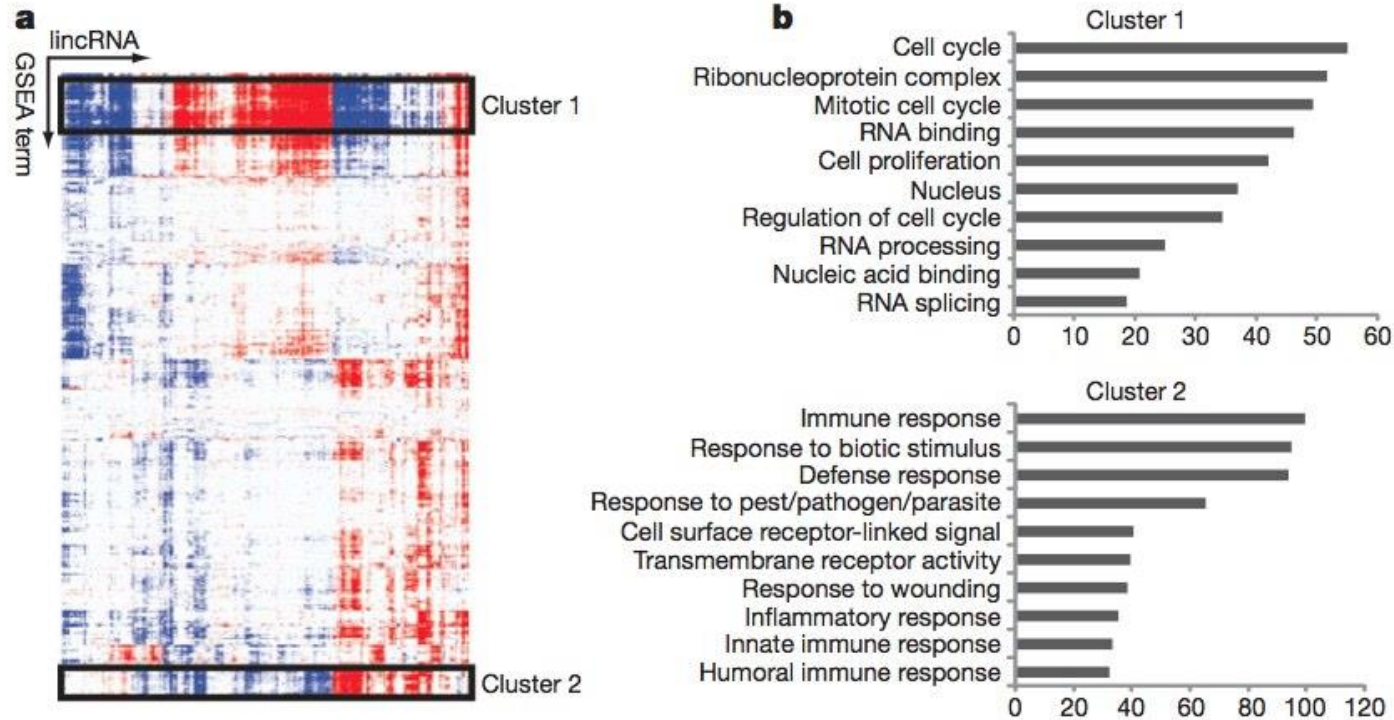


Known Examples



Mercer TR, Dinger ME, Mattick JS. Long non-coding RNAs: insights into functions. Nat Rev Genet. 2009 Mar;10(3):155-9

Functional assignment based on gene expression correlation



Guttman M. Chromatin signature reveals over a thousand highly conserved large non-coding RNAs in mammals. *Nature*. 2009 458(7235):223-7

Knock-out studies

- Selected 18 lincRNAs based on
 - Conservation
 - Chromatin features
 - Low protein-coding potential
 - Sequence based filter
 - Mass-spec based filter
- postnatal lethal phenotypes in three mutant strains (*Fendrr*, *Peril*, and *Mdgt*), the latter two exhibiting incomplete penetrance and growth defects in survivors
- growth defects for two additional mutant strains (*linc-Brn1b* and *linc-Pint*)

Multiple knockout mouse models reveal lincRNAs are required for life and brain development

Strain	+/+	+/-	-/-	Total	p-value
<i>linc-Brn1a</i>	12 (13)	32 (26)	7 (13)	51	0.1168
<i>linc-Brn1b</i>	16 (17)	39 (33)	11 (17)	66	0.1952
<i>linc-Cox2</i>	10 (10)	19 (20)	11 (10)	40	0.9277
<i>Fabl</i>	18 (23)	52 (45)	20 (23)	90	0.3220
<i>linc-Enc1</i>	16 (12)	17 (23)	13 (12)	46	0.2252
<i>Manr</i>	21 (20)	37 (40)	22 (20)	80	0.7886
<i>Fendrr</i>	36 (23)	57 (47)	0 (23)	93	8.9 E-8
<i>Haunt</i>	20 (19)	44 (39)	13 (19)	77	0.2741
<i>Hottip</i>	8 (8)	16 (17)	9 (8)	33	0.9122
<i>Mdgt</i>	25 (17)	37 (34)	6 (17)	68	0.0038
<i>Celr</i>	11 (19)	43 (38)	21 (19)	75	0.1202
<i>Cnde</i>	20 (19)	41 (39)	16 (19)	77	0.7302
<i>Spasm</i> [†]	13 (22)	29 (22)	47 (45)	89	0.0498
<i>linc-Pint</i>	14 (12)	23 (23)	9 (12)	46	0.5818
<i>linc-p21</i>	19 (20)	40 (39)	19 (20)	78	0.9391
<i>linc-Ppara</i>	13 (14)	35 (28)	8 (14)	56	0.1112
<i>Peril</i>	34 (32)	79 (63)	13 (32)	126	0.0005
<i>Tug1</i>	15 (11)	19 (21)	8 (11)	42	0.2574

lincRNA summary

- Many are not functional but some are
- Sequence conservation is poor but we can look for
 - Small conserved regions
 - Promoter conservation
 - Exon-intron structure
 - Synteny
 - Non-alignable conserved feature
- lincRNAs most likely come from different classes that differ
 - Functionality
 - Mechanism
 - Gene proximity
 - Conservation