

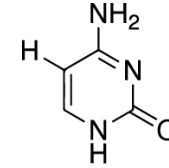
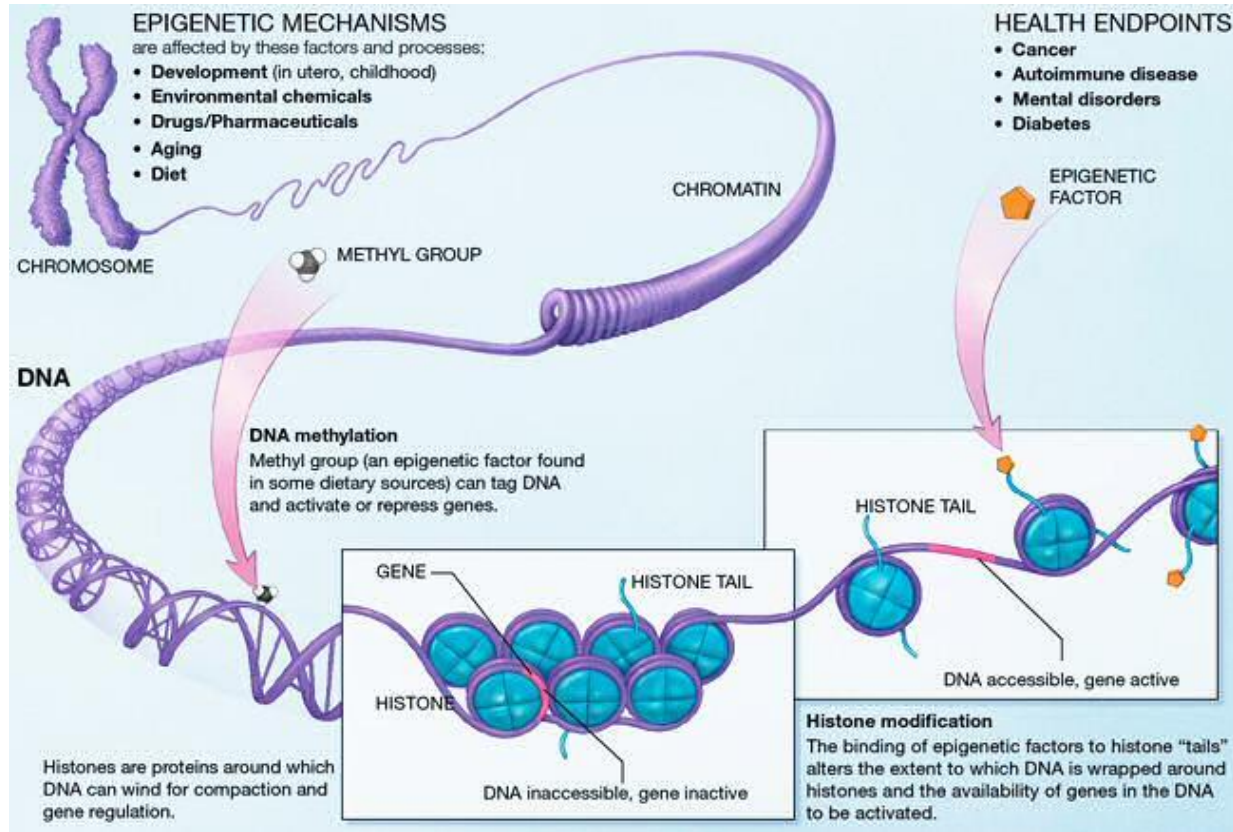
# GMS6850 – Core Concepts in Bioinformatics

## Epigenetics / Epigenomics

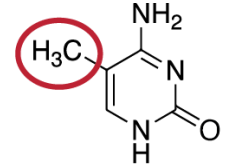
2022 Jan 19

Steve Rozen

# Epigenetics/epigenomics overview will be on the final



Cytosine



methyalted Cytosine

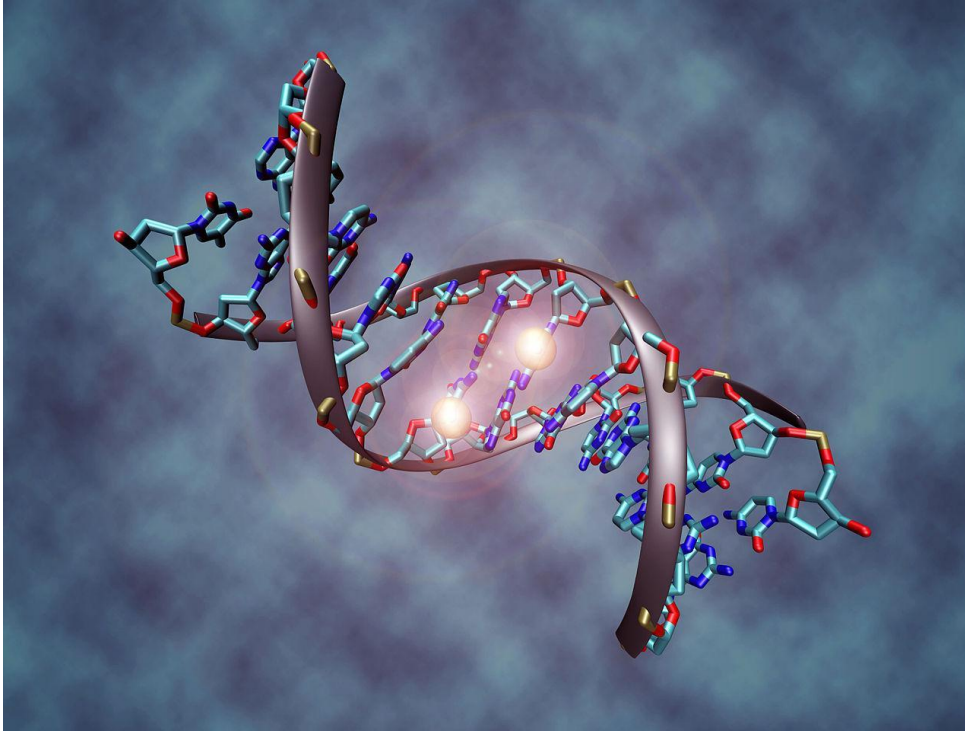
By Mariuswalter - Own work, CC BY-SA 4.0,  
<https://commons.wikimedia.org/w/index.php?curid=54318073>

By National Institutes of Health -

<http://commonfund.nih.gov/epigenomics/figure.aspx>,

Public Domain, <https://commons.wikimedia.org/w/index.php?curid=9789221>

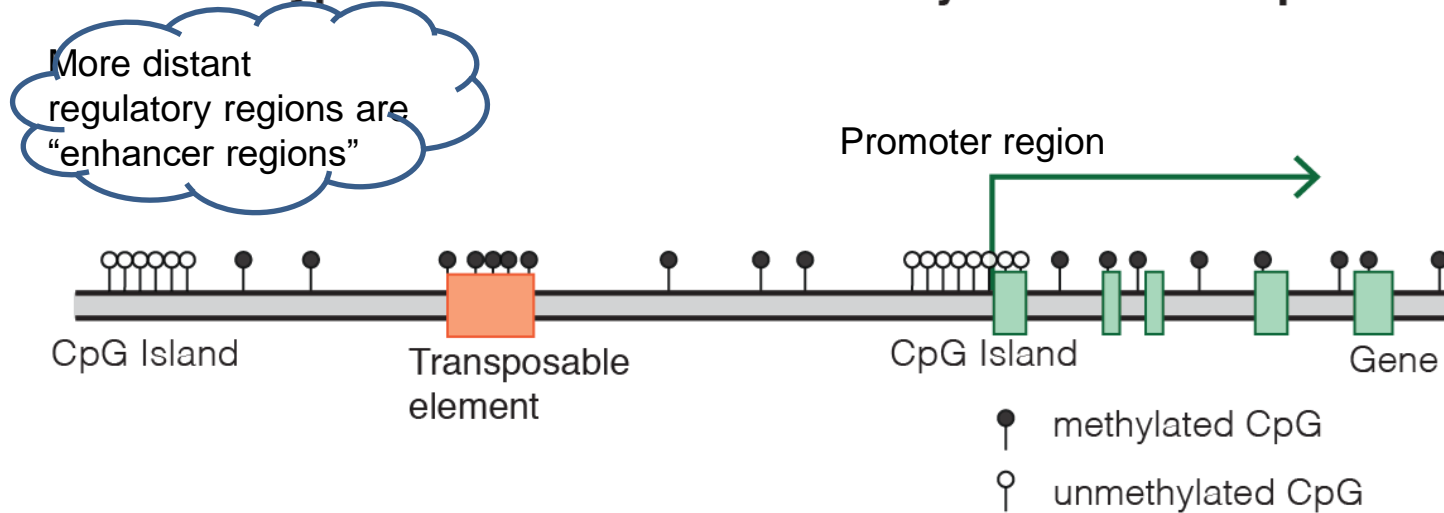
# DNA methylation



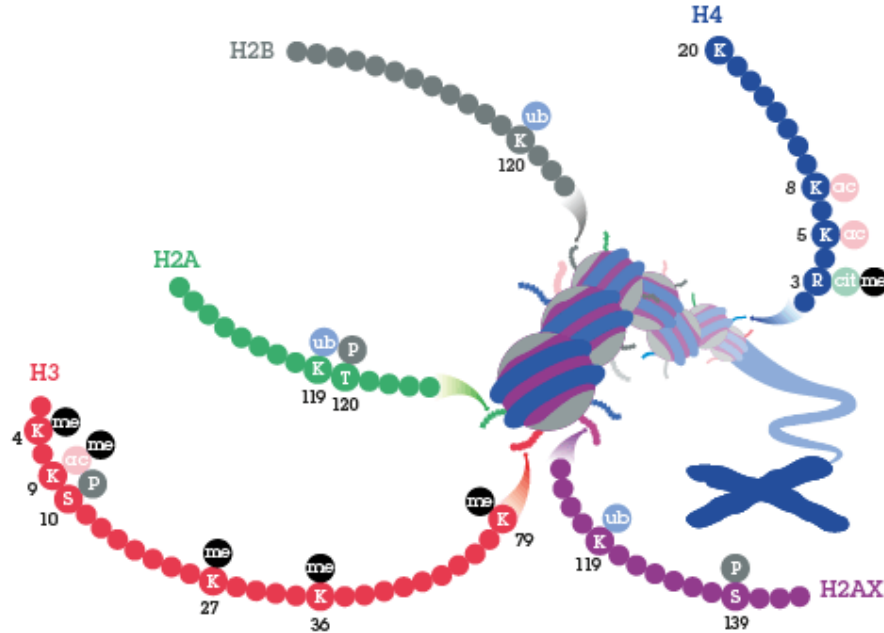
By Christoph Bock, Max Planck Institute for  
Informatics - Own work, CC BY-SA 3.0,  
[https://commons.wikimedia.org/w/index.php?c  
urid=17066877](https://commons.wikimedia.org/w/index.php?curid=17066877)

# DNA methylation

## Typical mammalian DNA methylation landscape



# Histone modifications / histone code



Go to:

[https://en.wikipedia.org/wiki/Histone\\_code](https://en.wikipedia.org/wiki/Histone_code)

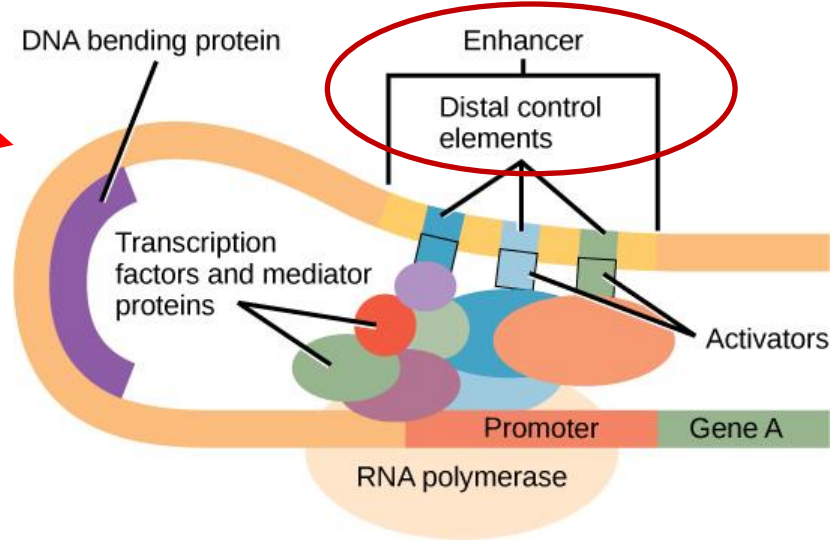
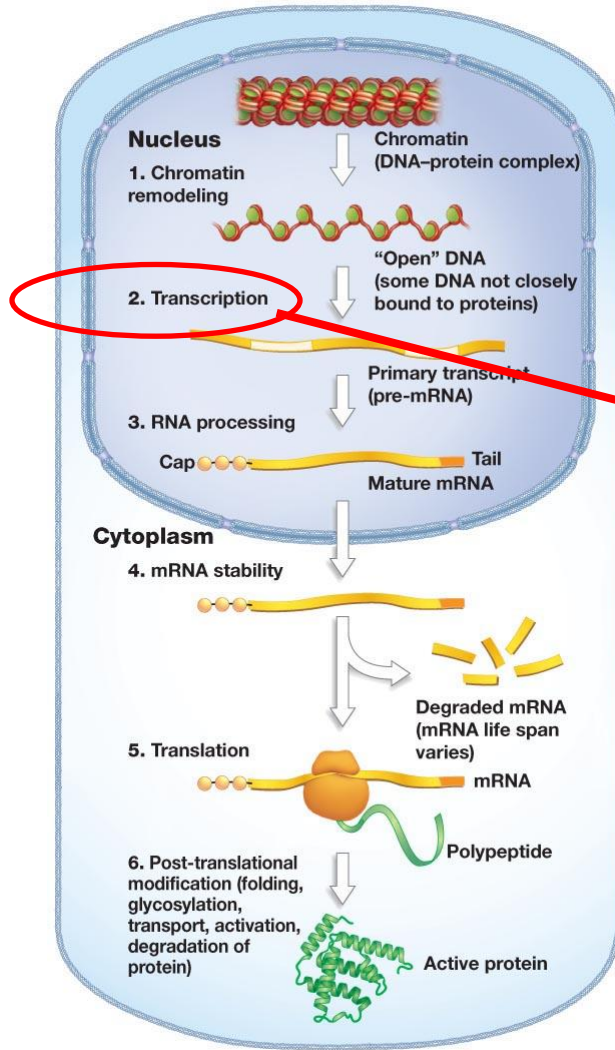
# “Histone code”

Type of modification	Histone							
	H3K4	H3K9	H3K14	H3K27	H3K79	H3K122	H4K20	H2BK5
mono-methylation	activation <sup>[7]</sup>	activation <sup>[8]</sup>		activation <sup>[8]</sup>	activation <sup>[8][9]</sup>		activation <sup>[8]</sup>	activation <sup>[8]</sup>
di-methylation	repression <sup>[10]</sup>	repression <sup>[3]</sup>		repression <sup>[3]</sup>	activation <sup>[9]</sup>			
tri-methylation	activation <sup>[11]</sup>	repression <sup>[8]</sup>		repression <sup>[8]</sup>	activation, <sup>[9]</sup> repression <sup>[8]</sup>			repression <sup>[3]</sup>
acetylation		activation <sup>[11]</sup>	activation <sup>[11]</sup>	activation <sup>[12]</sup>		activation <sup>[13]</sup>		

# “Histone code”

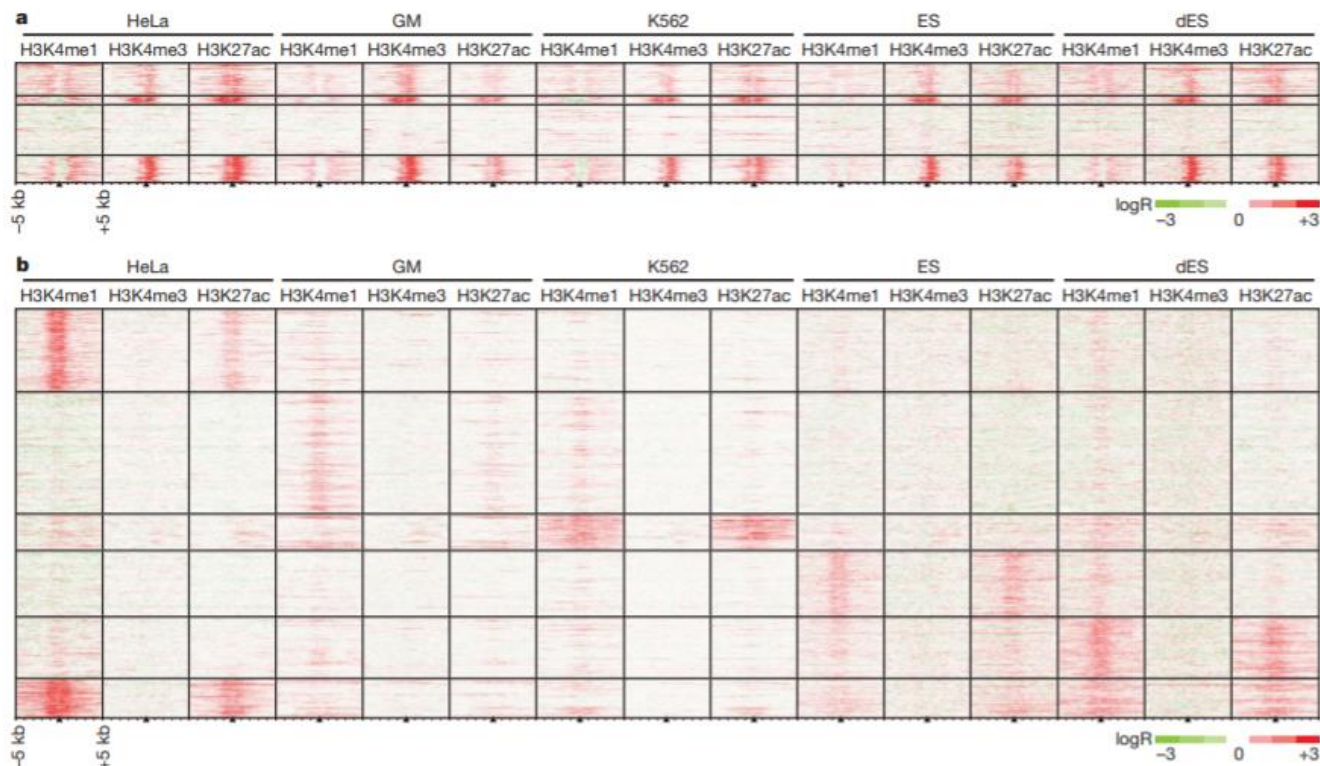
- [H3K4me1](#) - primed enhancers
- [H3K4me3](#) is enriched in transcriptionally active promoters.<sup>[14]</sup>
- [H3K9me2](#) -repression
- [H3K9me3](#) is found in constitutively repressed genes.
- [H3K27me3](#) is found in facultatively repressed genes.<sup>[8]</sup>
- [H3K36me](#)
- [H3K36me2](#)
- [H3K36me3](#) is found in actively transcribed gene bodies.
- [H3K79me2](#)
- [H3K9ac](#) is found in actively transcribed promoters.
- [H3K14ac](#) is found in actively transcribed promoters.
- [H3K23ac](#)
- [H3K27ac](#) distinguishes active enhancers from poised enhancers.
- [H3K36ac](#)
- [H3K56ac](#) is a proxy for de novo histone assembly.<sup>[15]</sup>
- [H3K122ac](#) is enriched in poised promoters and also found in a different type of putative enhancer that lacks H3K27ac.

# Interpreting the genetic program



<https://courses.lumenlearning.com/wmopen-biology1/chapter/eukaryotic-gene-regulation/>





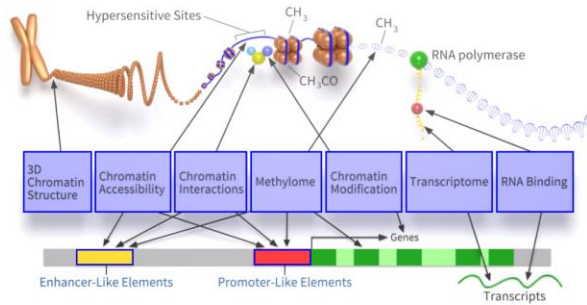
**Figure 1 | Chromatin modifications at promoters are generally cell-type-invariant whereas those at enhancers are cell-type-specific.** We used ChIP-chip to map histone modifications (H3K4me1, H3K4me3 and H3K27ac) in the ENCODE regions in five cell types (HeLa, GM, K562, ES, dES). **a**, We performed *k*-means clustering on the chromatin modifications found  $\pm 5$  kb from 414 promoters, and observe them to be generally

invariant across cell types. **b**, As in **a**, but clustering on 1,423 non-redundant enhancers predicted on the basis of chromatin signatures, revealing the cell-type-specificity of enhancers. LogR is the log ratio of enrichment of each marker as determined by ChIP-chip. Promoters and predicted enhancers are located at the centre of 10-kb windows as indicated by black triangles.

[http://compbio.mit.edu/publications/33\\_Heintzman\\_Nature\\_09.pdf](http://compbio.mit.edu/publications/33_Heintzman_Nature_09.pdf)

## Histone modifications a global cell-type-specific

Nathaniel D. Heintzman<sup>1,2\*</sup>, Gary C. Hon<sup>1,3\*</sup>, R. David A. Lindsey F. Harp<sup>1</sup>, Zhen Ye<sup>1</sup>, Leonard K. Lee<sup>1</sup>, Rhonda S. Tsai<sup>1</sup>, Jessica E. Antosiewicz-Bourget<sup>7</sup>, Hui Liu<sup>8</sup>, Xinmin Zhang<sup>9</sup>, James A. Thomson<sup>7,10</sup>, Gregory E. Crawford<sup>11</sup>, Manolis Kellis<sup>4</sup>



Based on an image by Darryl Leja (NHGRI), Ian Dunham (EBI), Michael Pazin (NHGRI)

[About ENCODE Project](#) [Getting Started](#) [Experiments](#)

Search ENCODE portal ?

ENCODE Q

[Functional Characterization Experiments](#)

[About ENCODE Encyclopedia](#)

[candidate Cis-Regulatory Elements](#)

Search for candidate Cis-Regulatory Elements ?

Hosted by SCREEN

Human GRCh38 Q

Mouse mm10 Q

[Visit hg19 site](#)

[HUMAN](#) [MOUSE](#) [WORM](#) [FLY](#)

<https://www.encodeproject.org/data/annotations/v4/>

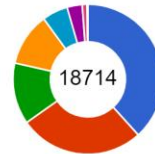
[Data Matrix](#)

Project



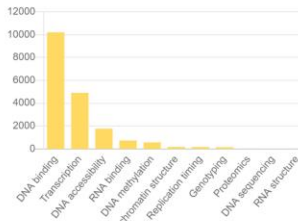
- ENCODE
- Roadmap
- modERN
- modENCODE
- GGR
- community

Biosample Type

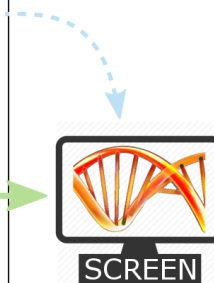
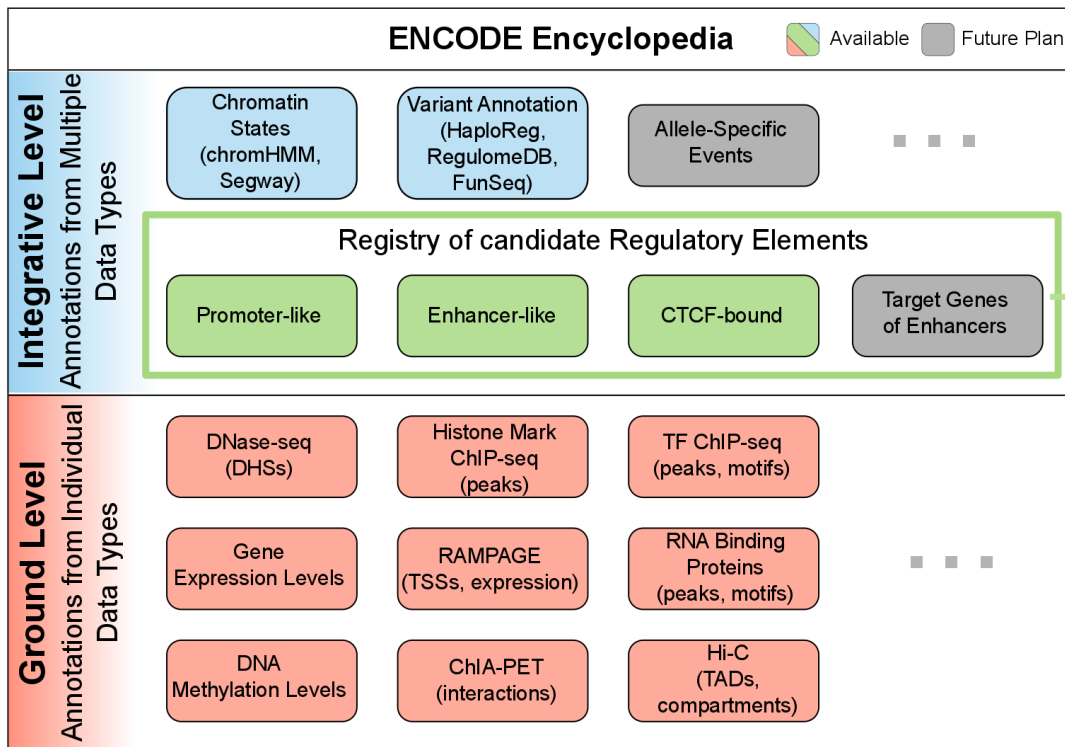


- cell line
- tissue
- whole organisms
- primary cell
- single cell
- in vitro differentiated cells
- cell-free sample
- organoid

Assay Categories

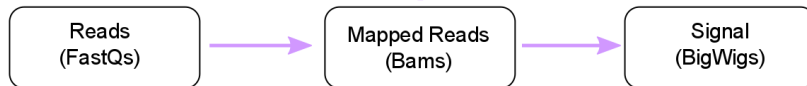


? Help



**Raw Data  
& Metadata**

Uniform Processing Pipelines



<https://www.encodeproject.org/data/annotations/v4/>

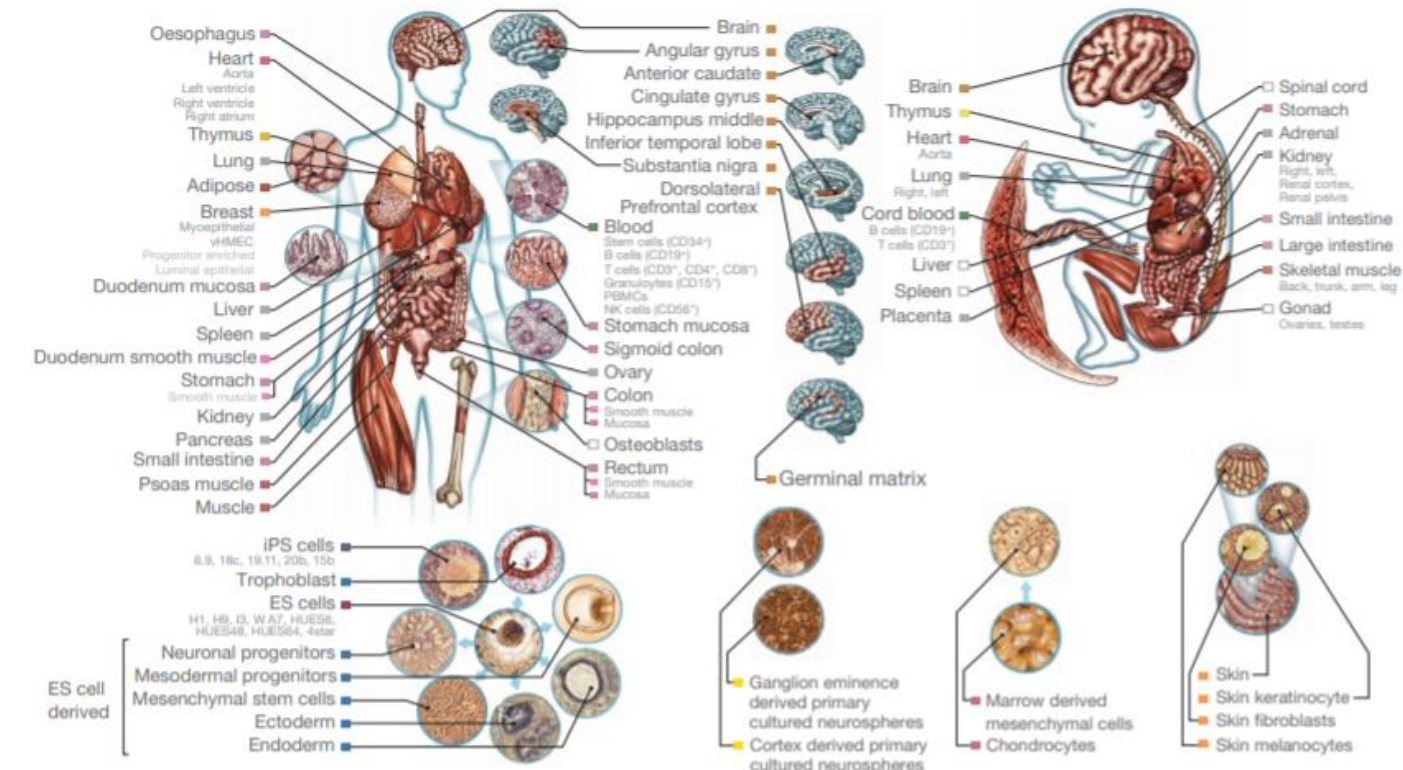
<http://genome.encode-roadmap.org/ENCODE/>

# Integrative analysis of 111 reference human epigenomes

Roadmap Epigenomics Consortium†, Anshul Kundaje<sup>1,2,3\*</sup>, Wouter Meuleman<sup>1,2\*</sup>, Jason Ernst<sup>1,2,4\*</sup>, Misha Bilenky<sup>5\*</sup>, Angela Yen<sup>1,2</sup>, Alireza Heravi-Moussavi<sup>5</sup>, Pouya Kheradpour<sup>1,2</sup>, Zhizhuo Zhang<sup>1,2</sup>, Jianrong Wang<sup>1,2</sup>, Michael J. Ziller<sup>2,6</sup>, Viren Amin<sup>7</sup>, John W. Whitaker<sup>8</sup>, Matthew D. Schultz<sup>9</sup>, Lucas D. Ward<sup>1,2</sup>, Abhishek Sarkar<sup>1,2</sup>, Gerald Quon<sup>1,2</sup>, Richard S. Sandstrom<sup>10</sup>, Matthew L. Eaton<sup>1,2</sup>, Yi-Chieh Wu<sup>1,2</sup>, Andreas R. Pfenning<sup>1,2</sup>, Xinchun Wang<sup>1,2,11</sup>, Melina Claussnitzer<sup>1,2</sup>, Yaping Liu<sup>1,2</sup>, Cristian Coarfa<sup>7</sup>, R. Alan Harris<sup>7</sup>, Noam Shores<sup>2</sup>, Charles B. Epstein<sup>2</sup>, Elizabeta Gjoneska<sup>2,12</sup>, Danny Leung<sup>8,13</sup>, Wei Xie<sup>8,13</sup>, R. David Hawkins<sup>8,13</sup>, Ryan Lister<sup>9</sup>, Chibo Hong<sup>14</sup>, Philippe Gascard<sup>15</sup>, Andrew J. Mungall<sup>5</sup>, Richard Moore<sup>5</sup>, Eric Chuah<sup>5</sup>, Angela Tam<sup>5</sup>, Theresa K. Canfield<sup>10</sup>, R. Scott Hansen<sup>16</sup>, Rajinder Kaul<sup>16</sup>, Peter J. Sabo<sup>10</sup>, Mukul S. Bansal<sup>1,2,17</sup>, Annaick Carles<sup>18</sup>, Jesse R. Dixon<sup>8,13</sup>, Kai-How Farh<sup>2</sup>, Soheil Feizi<sup>1,2</sup>, Rosa Karlic<sup>19</sup>, Ah-Ram Kim<sup>1,2</sup>, Ashwinikumar Kulkarni<sup>20</sup>, Daofeng Li<sup>21</sup>, Rebecca Lowdon<sup>21</sup>, GiNell Elliott<sup>21</sup>, Tim R. Mercer<sup>22</sup>, Shane J. Neph<sup>10</sup>, Vitor Onuchic<sup>7</sup>, Paz Polak<sup>2,23</sup>, Nisha Rajagopal<sup>8,13</sup>, Pradipta Ray<sup>20</sup>, Richard C. Sallari<sup>1,2</sup>, Kyle T. Siebenthall<sup>10</sup>, Nicholas A. Sinnott-Armstrong<sup>1,2</sup>, Michael Stevens<sup>21,42</sup>, Robert E. Thurman<sup>10</sup>, Jie Wu<sup>24,25</sup>, Bo Zhang<sup>21</sup>, Xin Zhou<sup>21</sup>, Arthur E. Beaudet<sup>26</sup>, Laurie A. Boyer<sup>11</sup>, Philip L. De Jager<sup>2,23,27</sup>, Peggy J. Farnham<sup>28</sup>, Susan J. Fisher<sup>29</sup>, David Haussler<sup>30</sup>, Steven J. M. Jones<sup>5,31,32</sup>, Wei Li<sup>33</sup>, Marco A. Marra<sup>5,32</sup>, Michael T. McManus<sup>34</sup>, Shamil Sunyaev<sup>2,23,27</sup>, James A. Thomson<sup>35,41</sup>, Thea D. Tlsty<sup>15</sup>, Li-Huei Tsai<sup>2,12</sup>, Wei Wang<sup>8</sup>, Robert A. Waterland<sup>36</sup>, Michael Q. Zhang<sup>20,37</sup>, Lisa H. Chadwick<sup>38</sup>, Bradley E. Bernstein<sup>2,39,40</sup>§, Joseph F. Costello<sup>14</sup>§, Joseph R. Ecker<sup>9</sup>§, Martin Hirst<sup>3,18</sup>§, Alexander Meissner<sup>2,6</sup>§, Aleksandar Milosavljevic<sup>7</sup>§, Bing Ren<sup>8,13</sup>§, John A. Stamatoyannopoulos<sup>10</sup>§, Ting Wang<sup>21</sup>§ & Manolis Kellis<sup>1,2</sup>§

The reference human genome sequence set the stage for studies of genetic variation and its association with human disease, but epigenomic studies lack a similar reference. To address this need, the NIH Roadmap Epigenomics Consortium generated the largest collection so far of human epigenomes for primary cells and tissues. Here we describe the integrative analysis of 111 reference human epigenomes generated as part of the programme, profiled for histone modification patterns, DNA accessibility, DNA methylation and RNA expression. We establish global maps of regulatory elements, define regulatory modules of coordinated activity, and their likely activators and repressors. We show that disease- and trait-associated genetic variants are enriched in tissue-specific epigenomic marks, revealing biologically relevant cell types for diverse human traits, and providing a resource for interpreting the molecular basis of human disease. Our results demonstrate the central role of epigenomic information for understanding gene regulation, cellular differentiation and human disease.





# FANTOM

FANTOM is an international research consortium established by Dr. Hayashizaki and his colleagues in 2000 to assign functional annotations to the full-length cDNAs that were collected during the Mouse Encyclopedia Project at RIKEN. FANTOM has since developed and expanded over time to encompass the fields of transcriptome analysis. The object of the project is moving steadily up the layers in the system of life, progressing thus from an understanding of the 'elements' - the transcripts - to an understanding of the 'system' - the transcriptional regulatory network, in other words the 'system' of an individual life form.

FANTOM is now in the 6th edition of the project. Project page of each edition is available below:

- [FANTOM6 - Functional analysis of non-coding RNAs](#)
- [FANTOM5 - Atlases of mammalian promoters, enhancers, lncRNAs and miRNAs](#)
- [FANTOM4 - Understanding the transcriptional regulatory network](#)
- [FANTOM3 - Transcriptional landscape of mammalian genome](#)
- [FANTOM2 - Functional annotation of ~60,000 mouse full-length cDNA collection](#)
- [FANTOM1 - Initial functional annotation of ~20,000 mouse cDNA collection](#)

Mouse over the image below for information on FANTOM [history](#) and [publications](#).



The Fantom (Functional Annotation of the mouse) aims at providing the ultimate characterization of the mouse transcriptome. On biological problems and bioinformatics. After the development of original technologies (such as full-length cDNA libraries, CAGE) The combination of original RIKEN full-length cDNAs, CAGE tags and GSC ditags allowed providing the most extensive description of the mouse transcriptome. This project was a milestone in the history of genomics. The issue of Science, another milestone one in Nature Genetics, the Genome N All data and resources used in this project are available to the community from <http://fantom.gsc.riken.go.jp/>. In general, hard to find the 5'

[HOME](#)[Download](#)

## FANTOM3 papers

## History

## Contact

## FAQ

## Photos

## RELATED WORKS

FANTOM portal

## Databases

## References

## Announcements

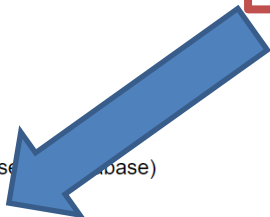
- [Notice] FANTOM servers, including the cDNA viewer and the CAGE database
- [FANTOM3 Satellite papers](#) are published in the [Genome Network/FANTOM3](#)
- Another milestone paper is [published](#) in [Nature Genetics](#). Its support is from the [FANTOM3](#) consortium
- [Photo gallery](#) is updated. [2006.01.27]
- Publishing of [two milestone papers](#) (Main and [extended](#) press release)

## Databases

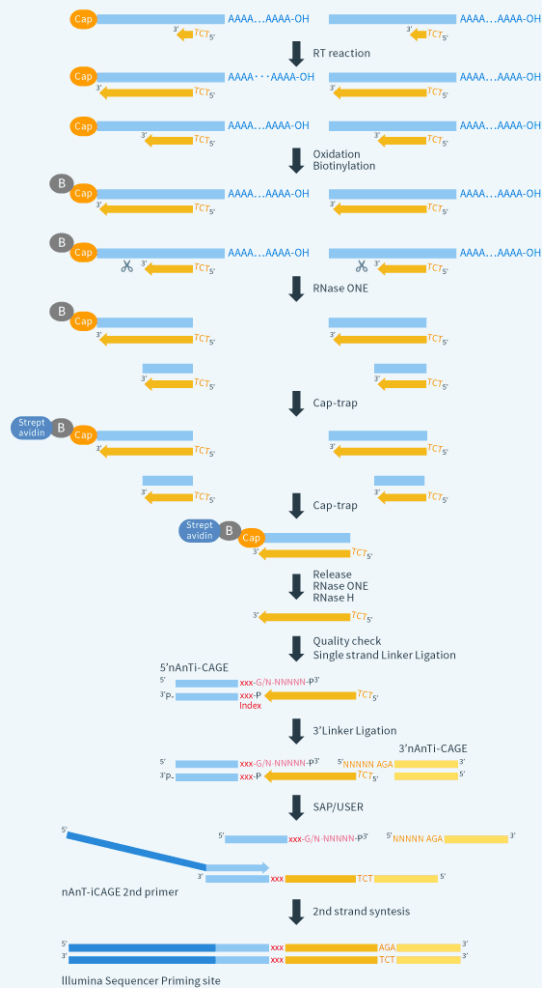
- cDNA Annotation ( [Annotation strategy](#) )
  - [RIKEN cDNA Annotation Viewer](#)
  - [Public cDNA Viewer](#)
- Sense/Antisense
  - [SADB](#) (Archive files in the Sense/Antisense Database)
- CAGE (Cap-Analysis Gene Expression)
  - CAGE Basic Viewer (CAGE primary Database)  
[\[mouse | human \(current\) | human \(Previous ver. of September 2005\)\]](#)
  - CAGE Analysis Viewer (Promoter Database)  
[\[mouse | human \(current\) | human \(Previous ver. of September 2005\)\]](#)
  - CAGE Tree Viewer (Expression clusters)  
[\[mouse | human\]](#)
- Genomic Elements Viewer  
[\[mouse | human\]](#)

In general, hard to find the 5' ends of transcripts, but this is important to find genes with alternative 5' exons, which start transcript variants with different promoter regions and different regulation

“CAGE” deals with this

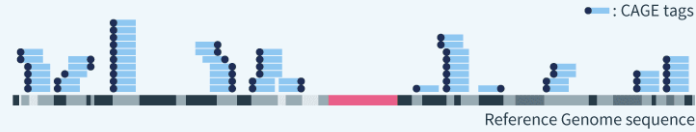


## CAGE library preparation

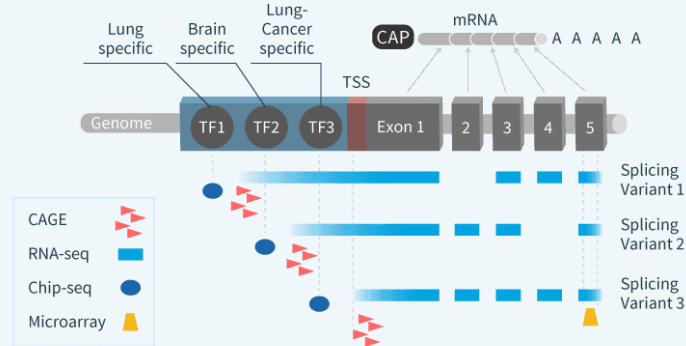


## Sequencing, Visualization & Analysis of data

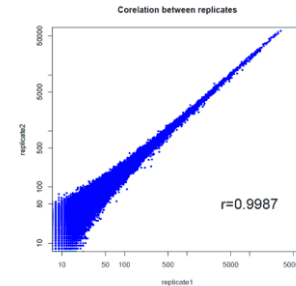
### Expression Profiling



### Comparison among major gene expression analysis techniques



### High reproducibility



<https://dnaform.jp/>



# Misuse of the term “epigenetics”

**Meaningless advertising gimmicks**

<https://perma.cc/U2CG-896G>

**Obsession with transgenerational epigenetic inheritance:** <https://perma.cc/Z2AZ-RJXZ>

**More nonsense:** <https://perma.cc/HPQ8-LBSL>

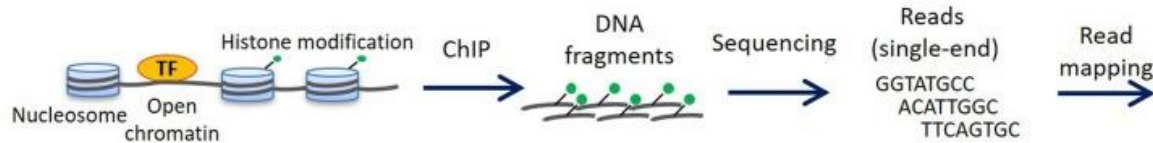
**Bottom line:** Be more specific, use terms like “chromatin state” (or, more specifically, “DNA methylation”, “histone marks”, “binding of specific transcription factors or regulatory complexes”, “open versus closed chromatin”, etc.)

# Methods for ChIP-seq analysis: A practical workflow and advanced applications

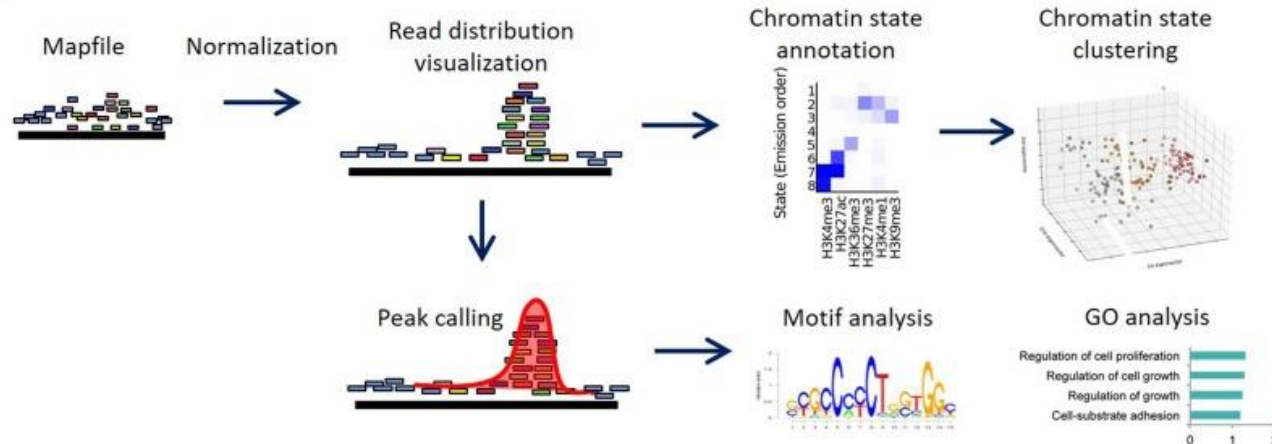
Ryuichiro Nakato Toyonori Sakata

<https://www.sciencedirect.com/science/article/pii/S1046202320300591>

## (A) Sample preparation and sequencing



## (B) Computational analysis



# Bioinformatics for analyzing ChIP-seq

For those with more computational and less genomics background, see <https://www.youtube.com/watch?v=nkWGmaYRues> for an easy intro to ChIP-seq

There is a ChIP-seq bioinformatics pipeline / recipes here:

<https://www.bioconductor.org/packages/devel/data/experiment/vignettes/systemPipeRdata/inst/doc/systemPipeChIPseq.html>

(To review in class)

# Bisulfite conversion for assaying (5 methylcytosine) DNA methylation

Watson >>**AC<sup>m</sup>GTT**CG**CTTGAG**>>

Crick <<**TG**C<sup>m</sup>**AAG**CG**A**ACTC****<<

<sup>m</sup> methylated

C Un-methylated

1) Denaturation



Watson >>**AC<sup>m</sup>GTT**CG**CTTGAG**>>

Crick <<**TG**C<sup>m</sup>**AAG**CG**A**ACTC****<<

2) Bisulfite Treatment



BSW >>**AC<sup>m</sup>GTT**UG**U**TTGAG****>>

BSC <<**TG**C<sup>m</sup>**AAG**UG**A**U**TU******<<

3) PCR Amplification



BSW >>**AC<sup>m</sup>GTT**TG**T**TTGAG****>>

BSC <<**TG**C<sup>m</sup>**AAG**TGA**A**TTT****<<

BSWR <<**TG CAAACAAACTC**<<

BSCR >>**ACG TTC**ACTTAA****>>

From Xi and Li, 2009,

<https://bmcbioinformatics.biomedcentral.com/articles/10.1186/1471-2105-10-232>

Pipeline of bisulfite sequencing. 1) Denaturation: separating Watson and Crick strands; 2) Bisulfite treatment: converting un-methylated cytosines (blue) to uracils; methylated cytosines (red) remain unchanged; 3) PCR amplification of bisulfite-treated sequences resulting in four distinct strands: Bisulfite Watson (BSW), bisulfite Crick (BSC), reverse complement of BSW (BSWR), and reverse complement of BSC (BSCR).

# Analyzing (5 methyl cytosine) methylation data

## Technologies

1. Methylation arrays (older and cheaper):

<https://www.bioconductor.org/packages/devel/workflows/vignettes/methylationArrayAnalysis/inst/doc/methylationArrayAnalysis.html>

1. Bisulfite sequencing -- not that widely used (?); will not discuss in detail

2.1 Special aligner: <http://www.bioinformatics.babraham.ac.uk/projects/bismark/> or <https://bmcbioinformatics.biomedcentral.com/articles/10.1186/1471-2105-10-232>

2.2 Downstream analysis:

<https://www.bioconductor.org/packages/devel/workflows/vignettes/methylationArrayAnalysis/inst/doc/methylationArrayAnalysis.html>