

# Bioinformatics: Genomics Part II

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## Applications of Sequencing Technology

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# Overview

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- Genomics I (Wednesday's lecture): Focus on sequencing technology and genomes.
- Genomics II: (Today's lecture): Focus on applications of sequencing technology.
  1. Annotation of the genome in chromatin
  2. Regulation of gene expression at the level of RNA

# Genomics lecture 1 summary

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## 1. Isolation of sample.

*e.g.*, Isolate DNA and shear.

## 2. Library preparation

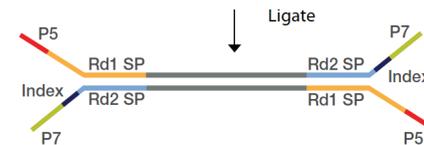
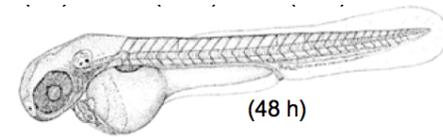
*e.g.*, Clean up and ligate Y-adaptors.

## 3. Sequencing

*e.g.*, Illumina HiSeq

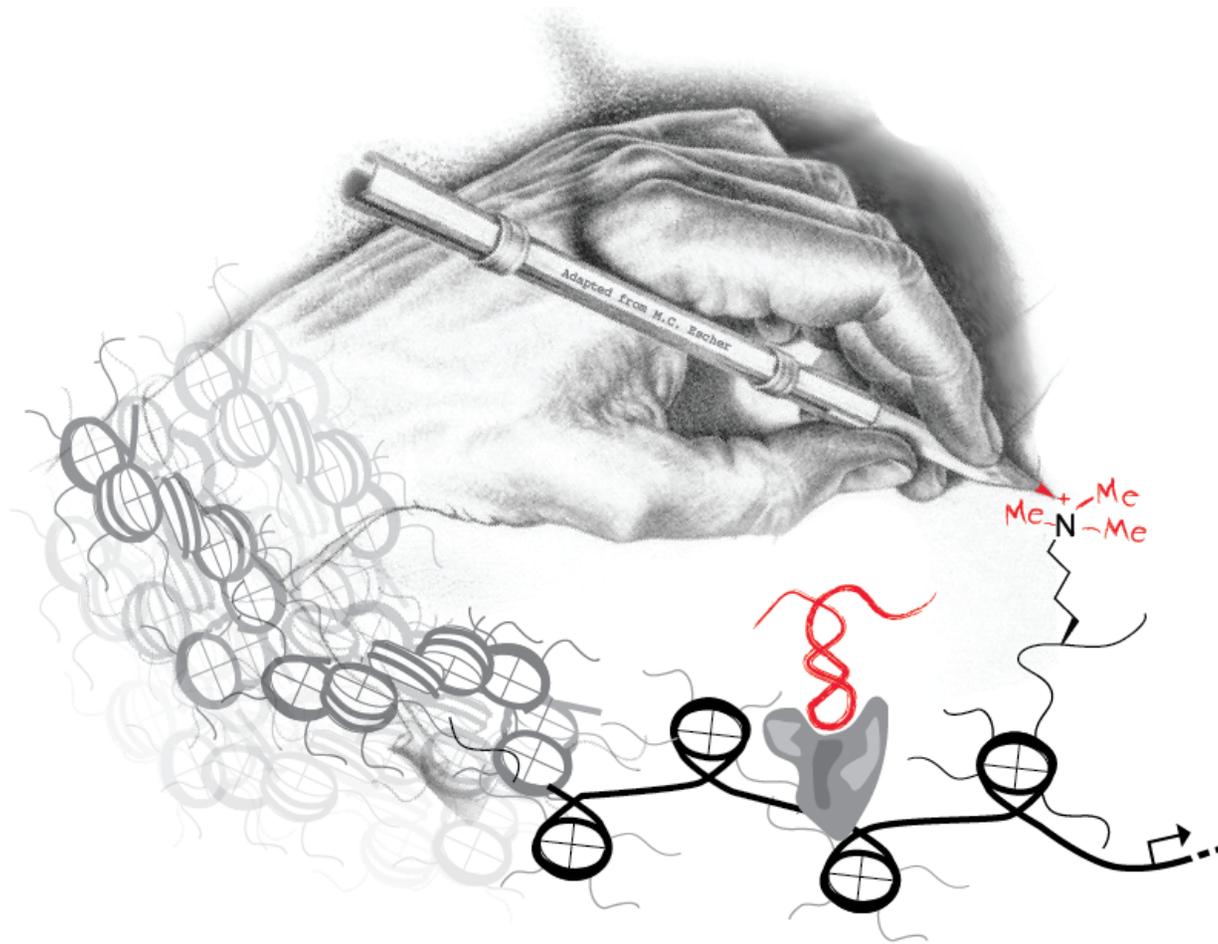
## 4. Analysis

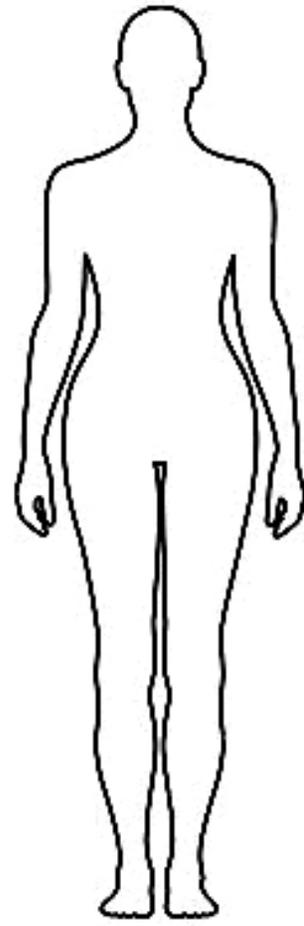
*e.g.*, Map to genome and interpret.



# Part 1. How do cells annotate their genomes?

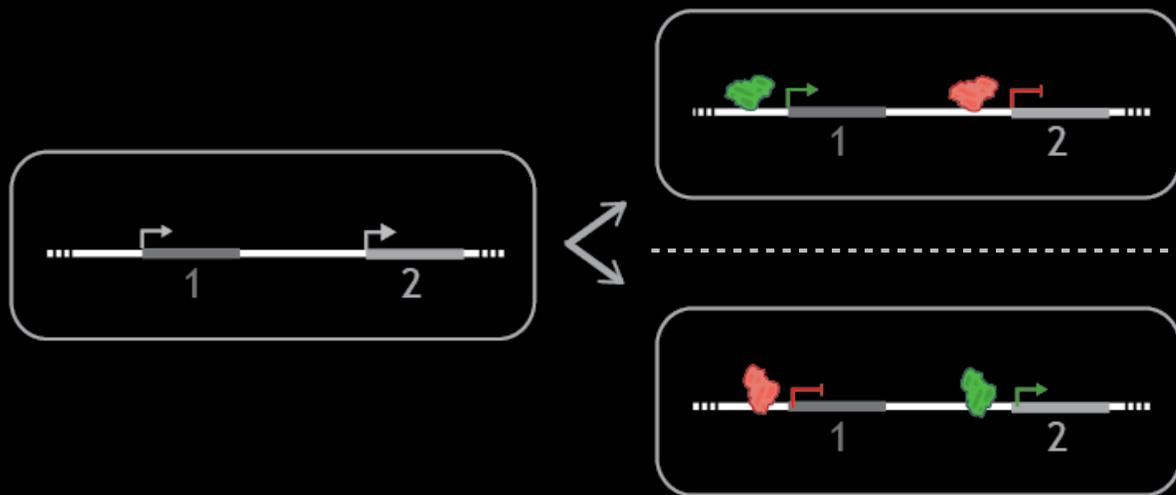
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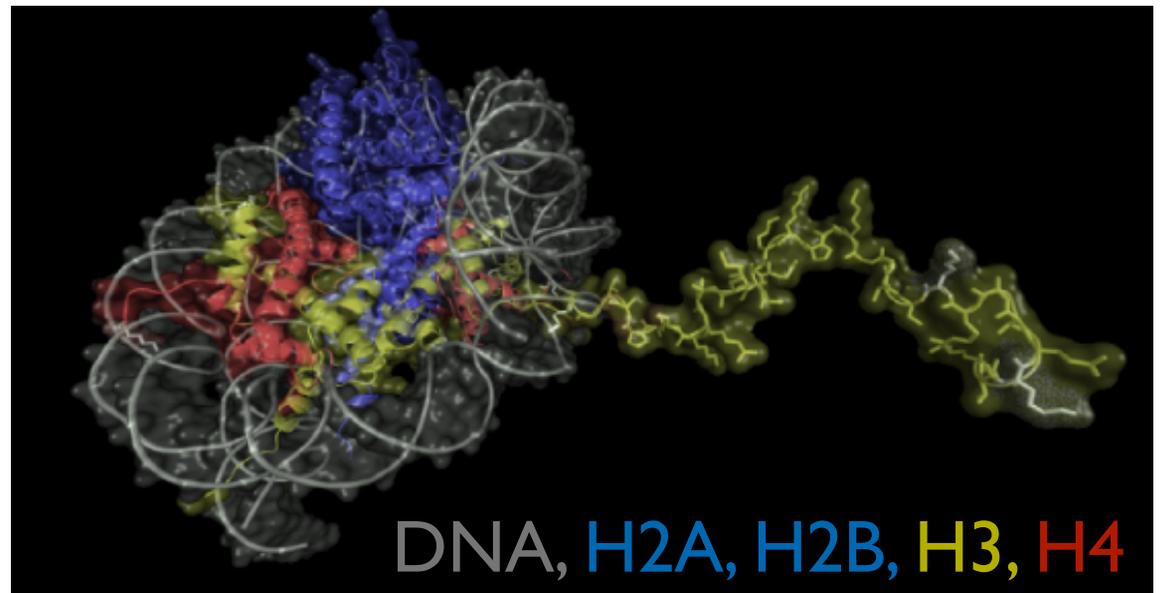
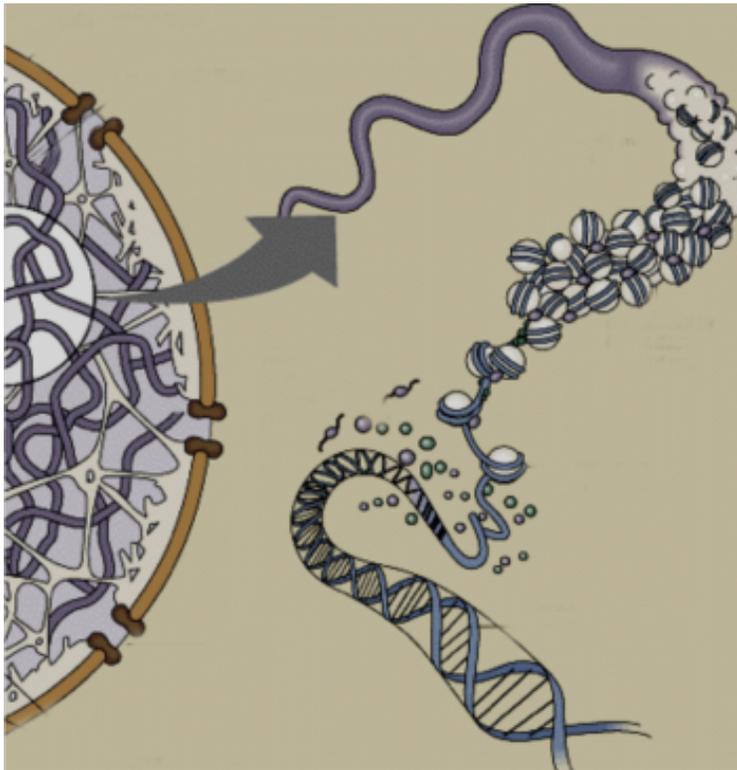
How is gene expression regulated and faithfully inherited?

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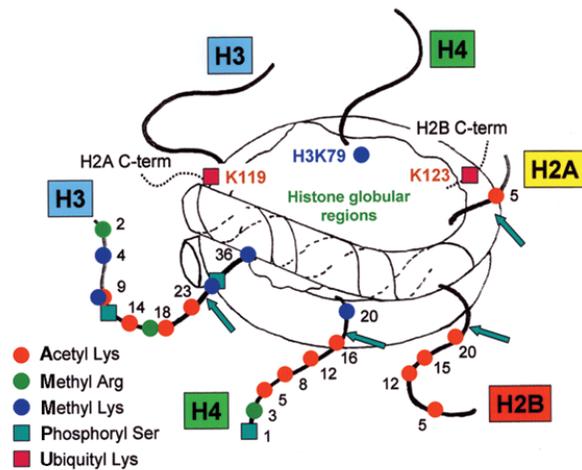
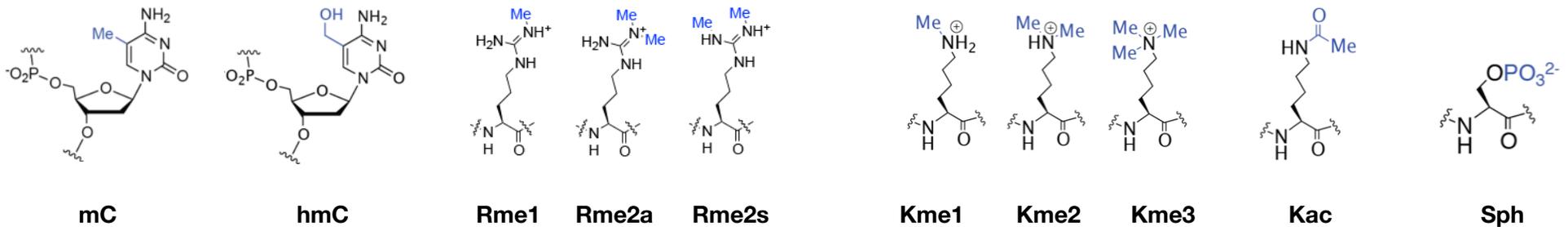
# DNA in the cell is packaged into chromatin

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Modeled nucleosome based on Luger et al., *Nature* **1997** 389, 251.

# Summary and nomenclature of common covalent modifications.



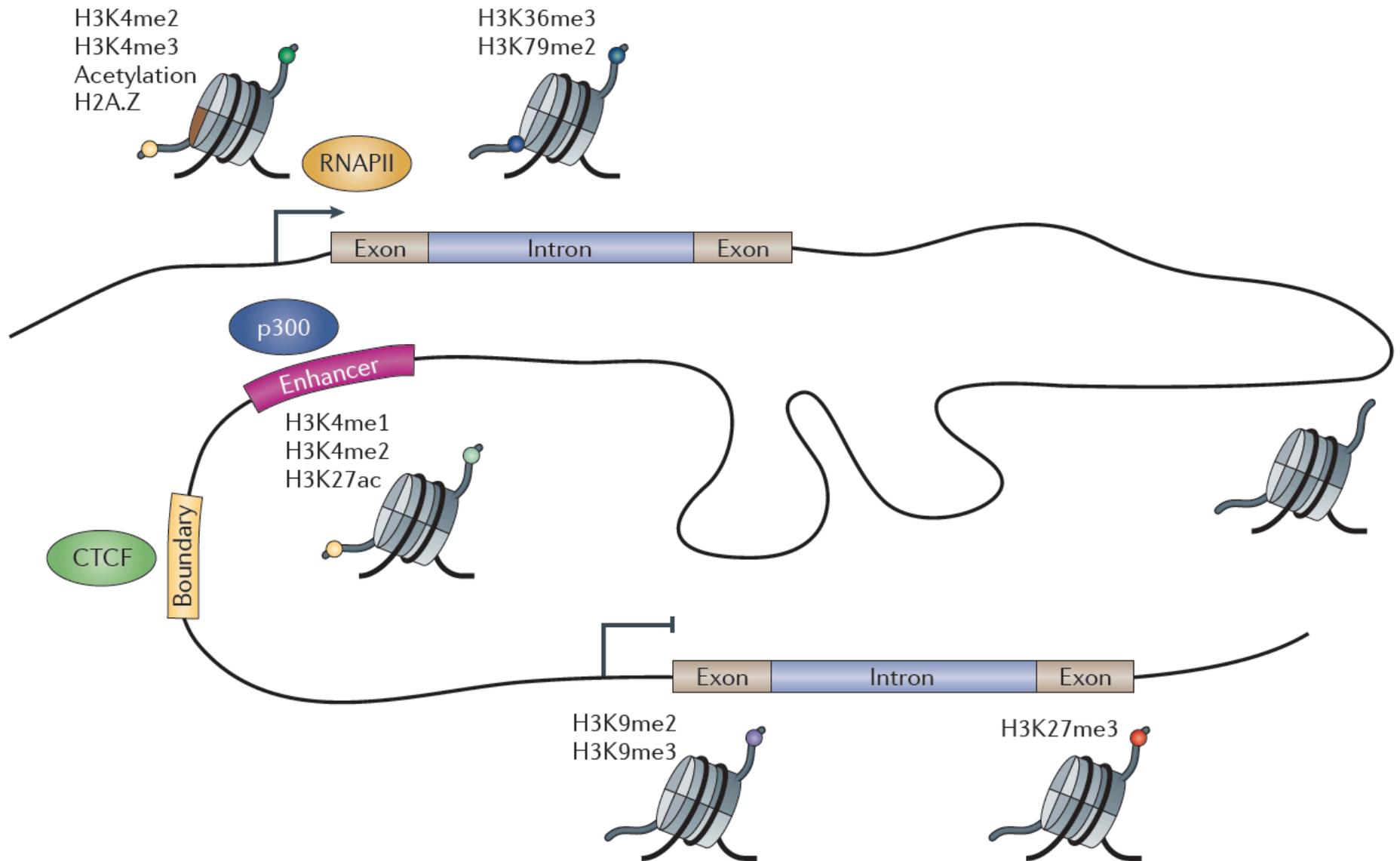
**Table 1 The Brno nomenclature for histone modifications**

Modifying group	Amino acid(s) modified	Level of modification	Abbreviation for modification <sup>a</sup>	Examples of modified residues <sup>b</sup>
Acetyl-	Lysine	mono-	ac	H3K9ac
Methyl-	Arginine	mono-	me1	H3R17me1
	Arginine	di-, symmetrical	me2s	H3R2me2s
	Arginine	di-, asymmetrical	me2a	H3R17me2a
	Lysine	mono-	me1	H3K4me1
	Lysine	di-	me2	H3K4me2
	Lysine	tri-	me3	H3K4me3
Phosphoryl-	Serine or threonine	mono-	ph	H3S10ph
Ubiquityl-	Lysine	mono- <sup>c</sup>	ub1	H2BK123ub1
SUMOyl-	Lysine	mono-	su	H4K5su <sup>d</sup>
ADP ribosyl-	Glutamate	mono-	ar1	H2BE2ar1
	Glutamate	poly-	arn	H2BE2arn <sup>d</sup>

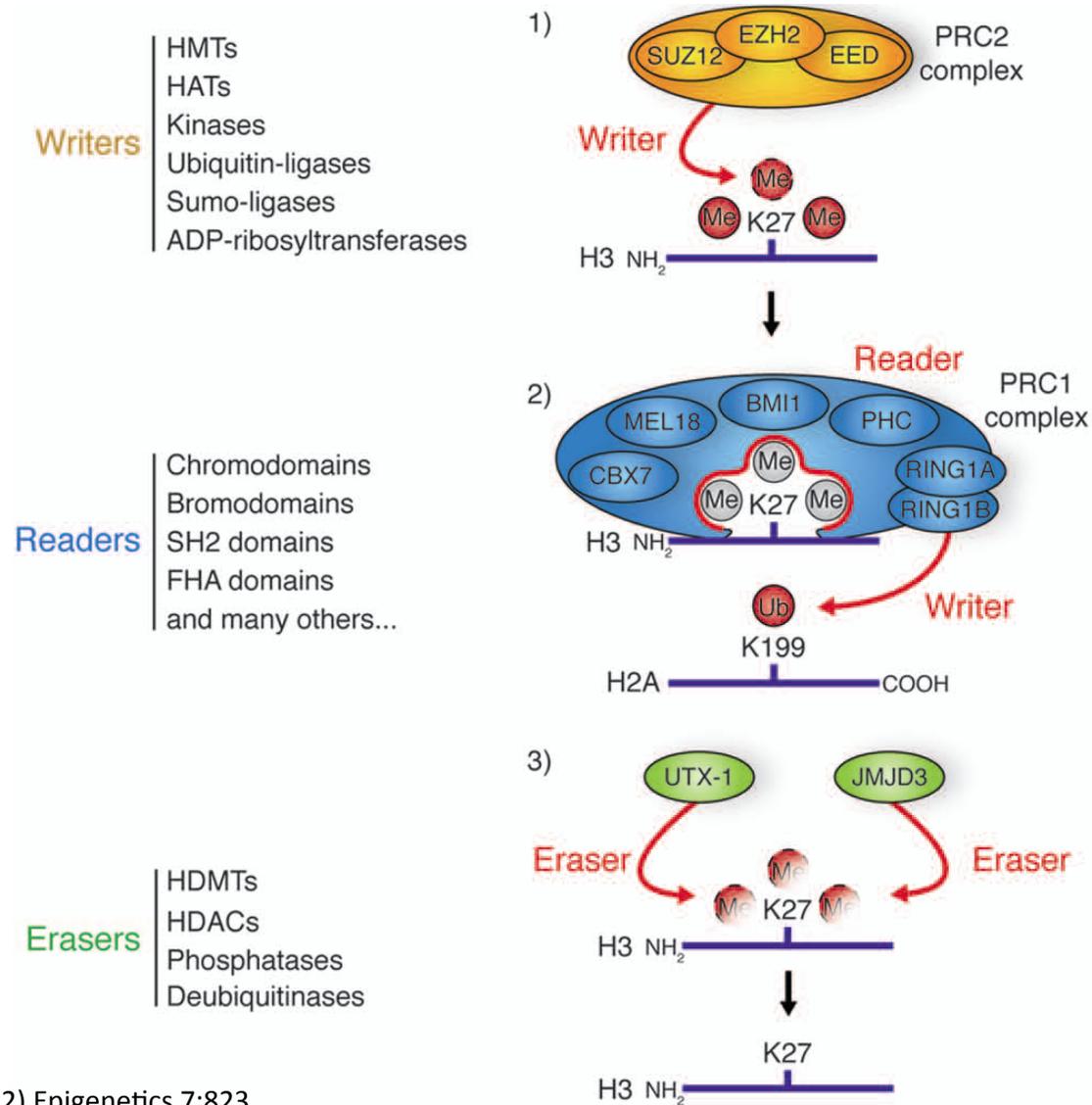
**H3**      **K27**      **ac**  
 {      {      {  
 Histone    Residue    Modification

Turner, B. M. Reading signals on the nucleosome with a new nomenclature for modified histones. *Nat Struct Mol Biol* 12, 110–112 (2005).

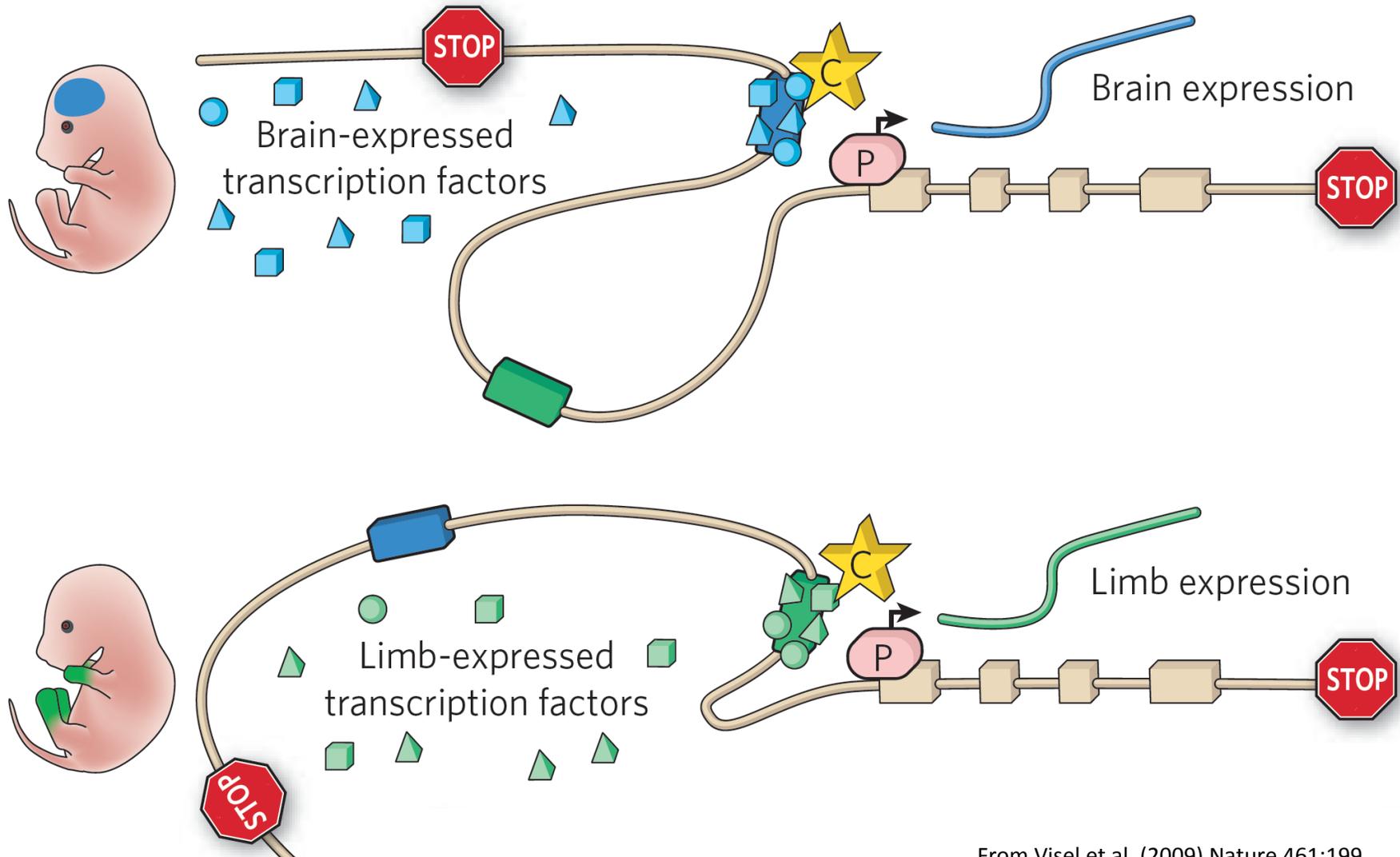
# Chromatin modifications correlate with different genomic functions.



# Installing, binding, and removing modifications



# Regulation is temporally and specially controlled



# Using sequencing to annotate the genome

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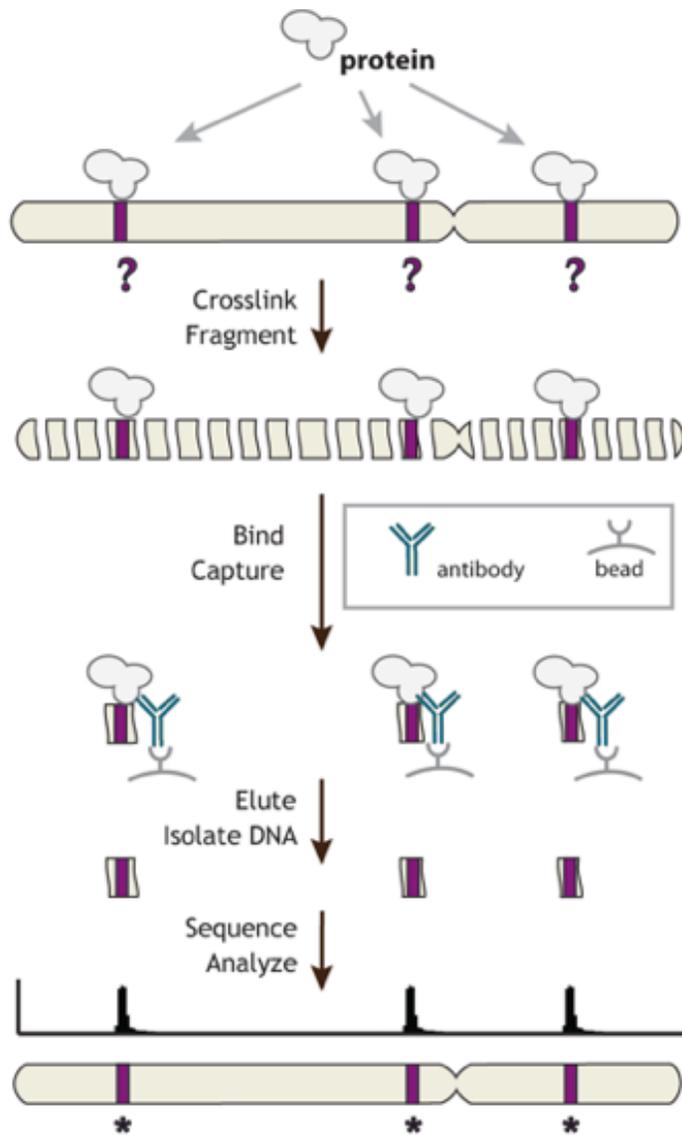
1. Where are the cis-acting regulatory elements in DNA?
  - A. DNase I hyper-sensitivity mapping (DNase-Seq).
  - B. FAIRE to map regulatory elements.
2. Where do transcription factors bind?
  - C. ChIP-seq of transcription factors (or in high res, ChIP-exo)
  - D. Nucleosome mapping (MNase-Seq).
3. Where are different histone modifications found?
  - E. ChIP-Seq of histone modifications.
  - F. ChIP-Seq of chromatin writers, readers and erasers.
4. Where is RNA polymerase transcribing?
  - G. ChIP-Seq of polymerase.
  - H. GRO-Seq, NET-Seq and TT-Seq to measure RNA in the polymerase active site..
5. How is the genome organized in 3D?
  - I. 4C/5C/Hi-C to measure chromatin conformation.

# Using sequencing to annotate the genome

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# Localization of proteins in the genome with chromatin immunoprecipitation (ChIP-Seq)



1. **Crosslink** the cells with formaldehyde to “fix” factors in place.

Exception: Native ChIP with histone antibodies.

2. **Shear chromatin** to smaller pieces.

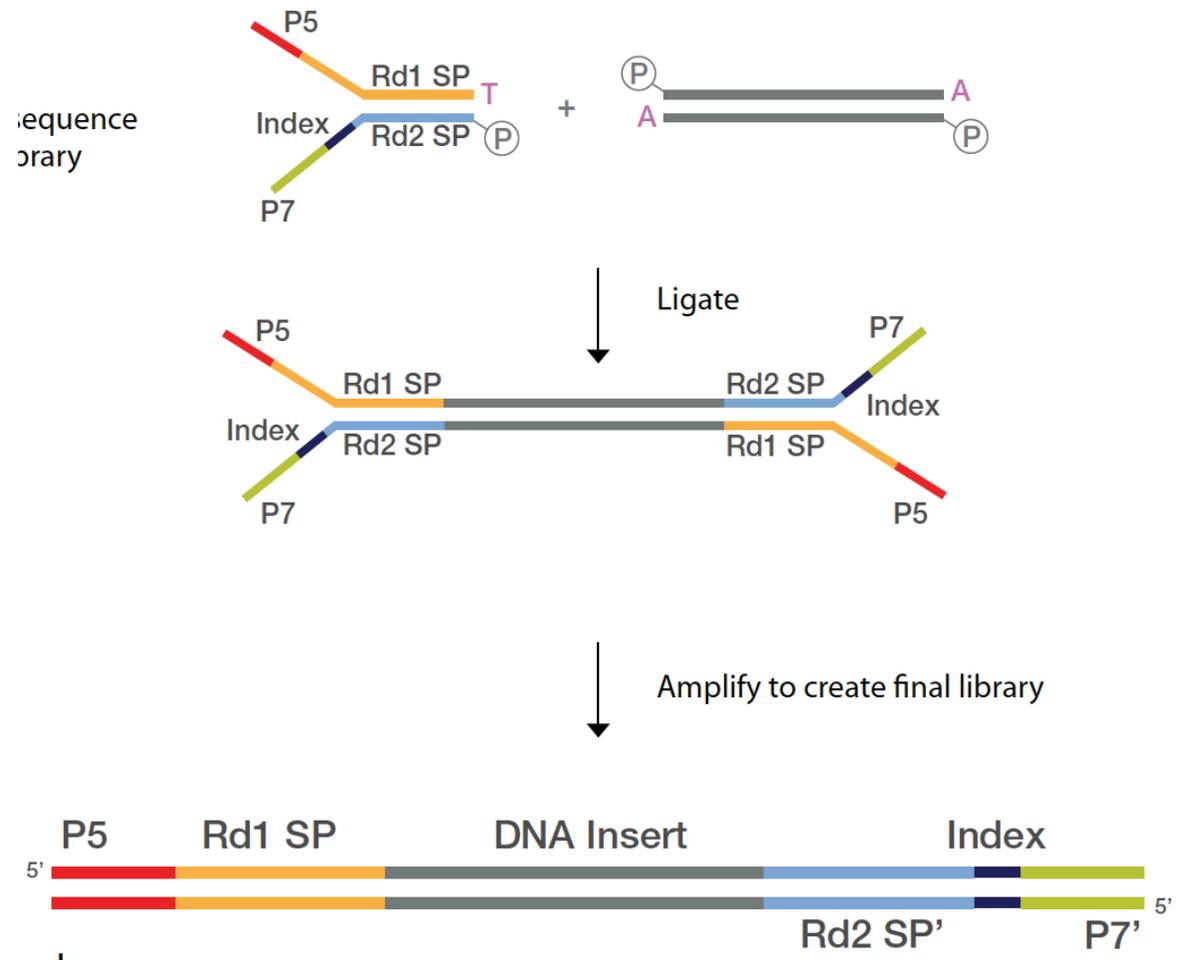
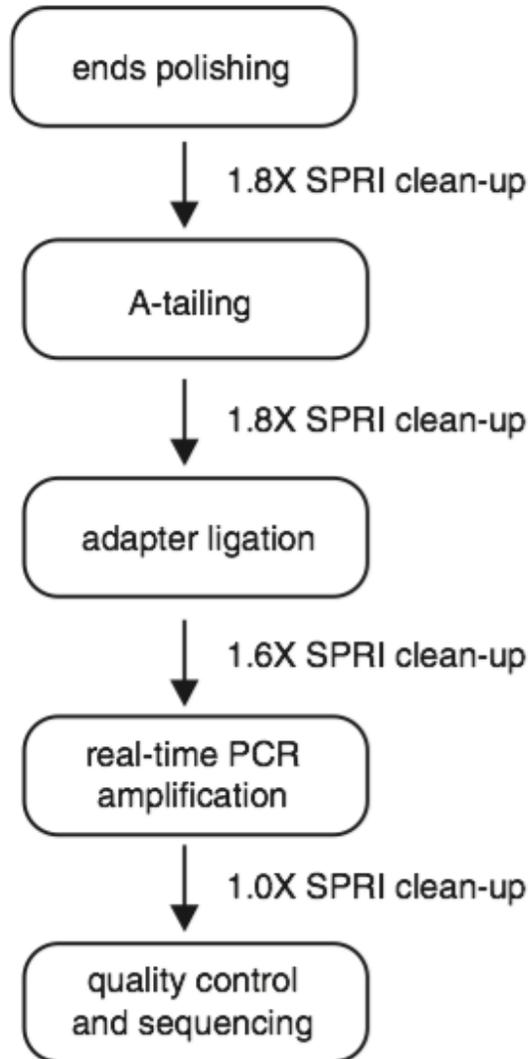
Shear size determines resolution.

Note: ChIP-exo uses an exonuclease at a later step to increase resolution.

3. **Enrich** target using an antibody.

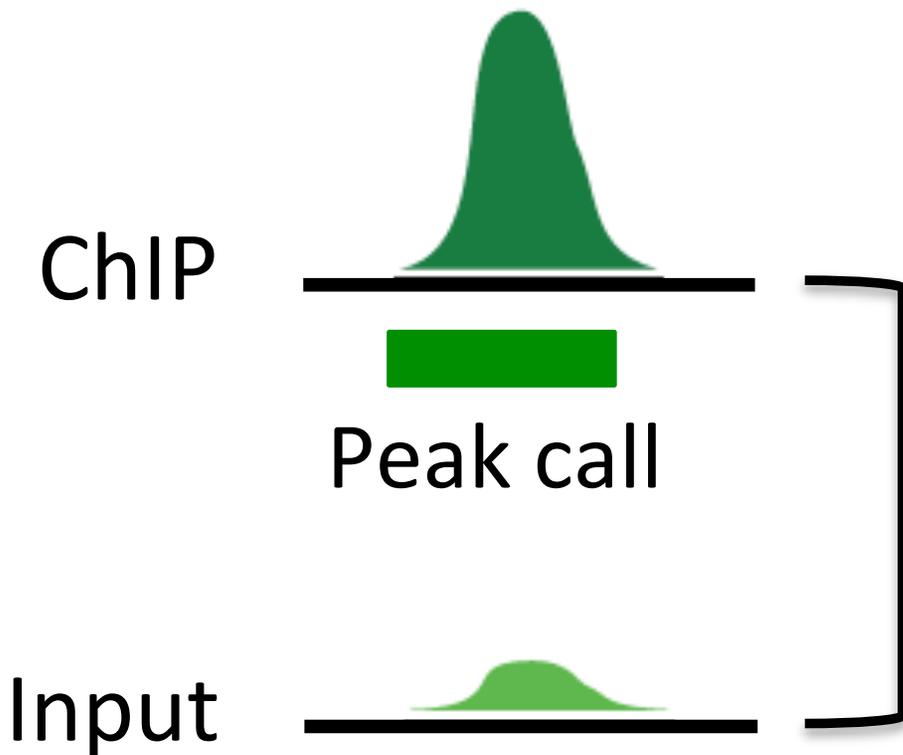
Enrichment is only as good as the antibody.

# Preparing a Seq library using ChIP-enriched DNA.



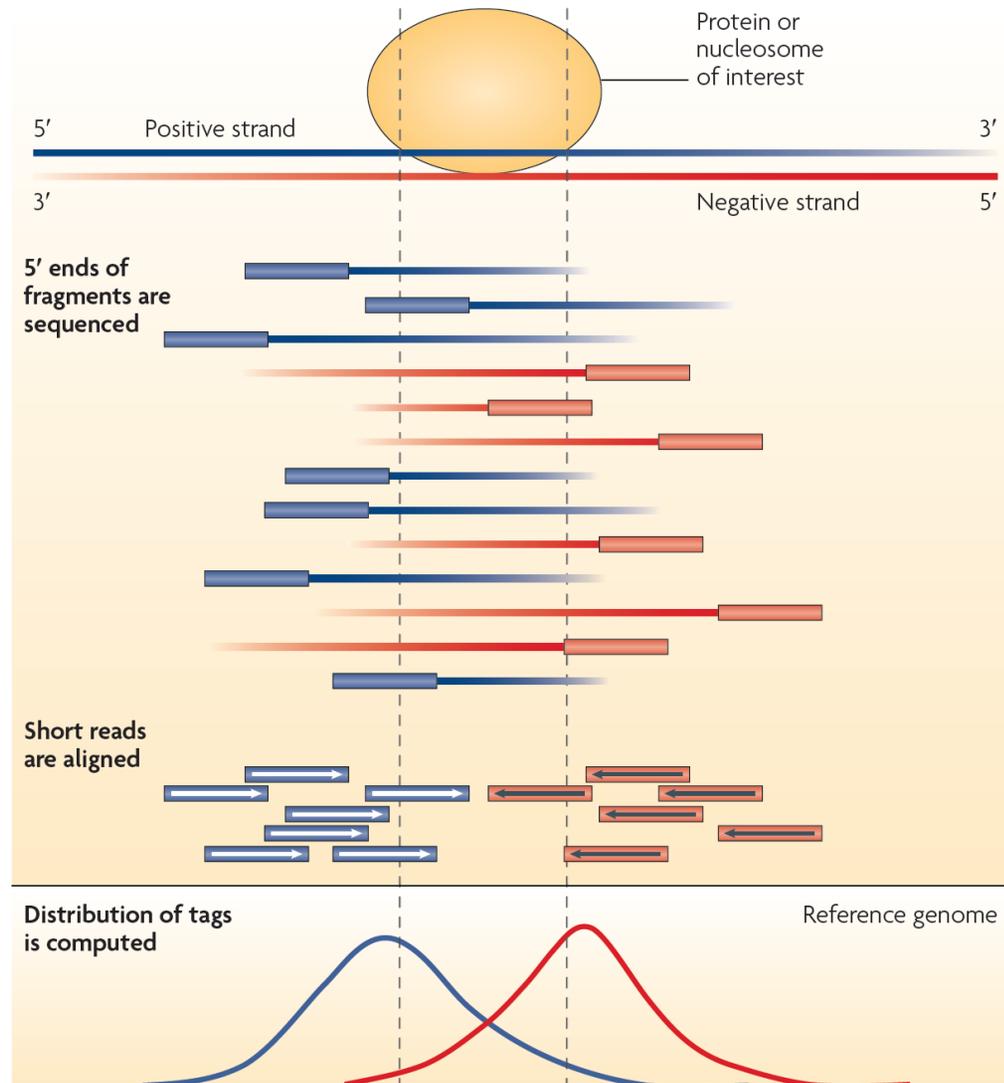
# Determining sites of enrichment from ChIP-Seq

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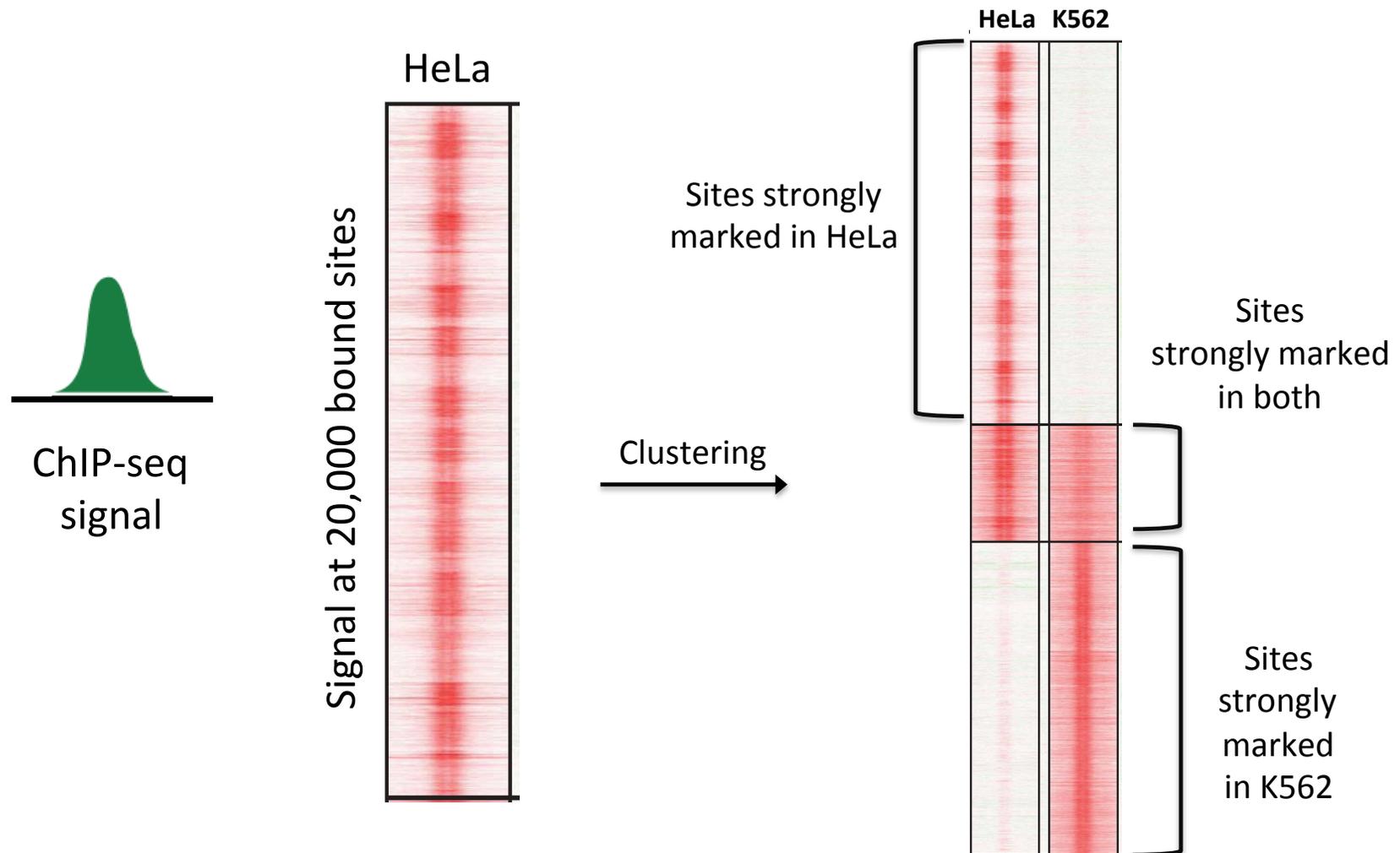
1. **Align** reads to the genome.
2. **Compare to input** to look for enrichment.  
Input coverage is not even.
3. **Call peaks** to determine statistically significant sites of enrichment.

# Avoiding artifacts using features in Seq data

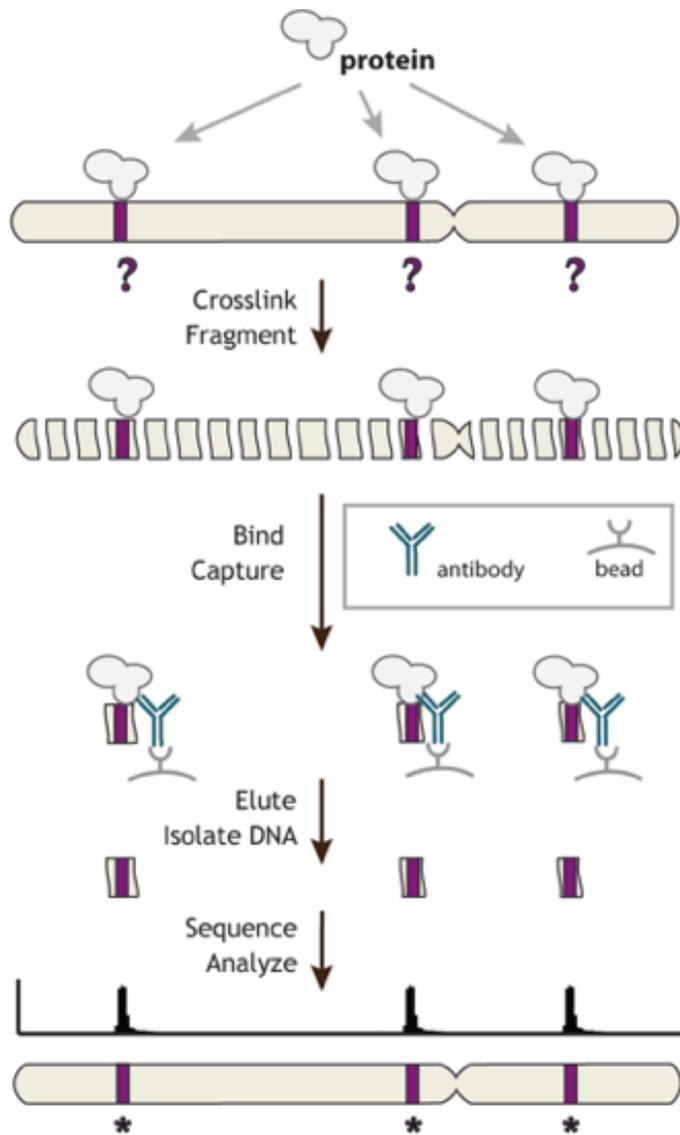


# ChIP-Seq signals reveal difference between cells

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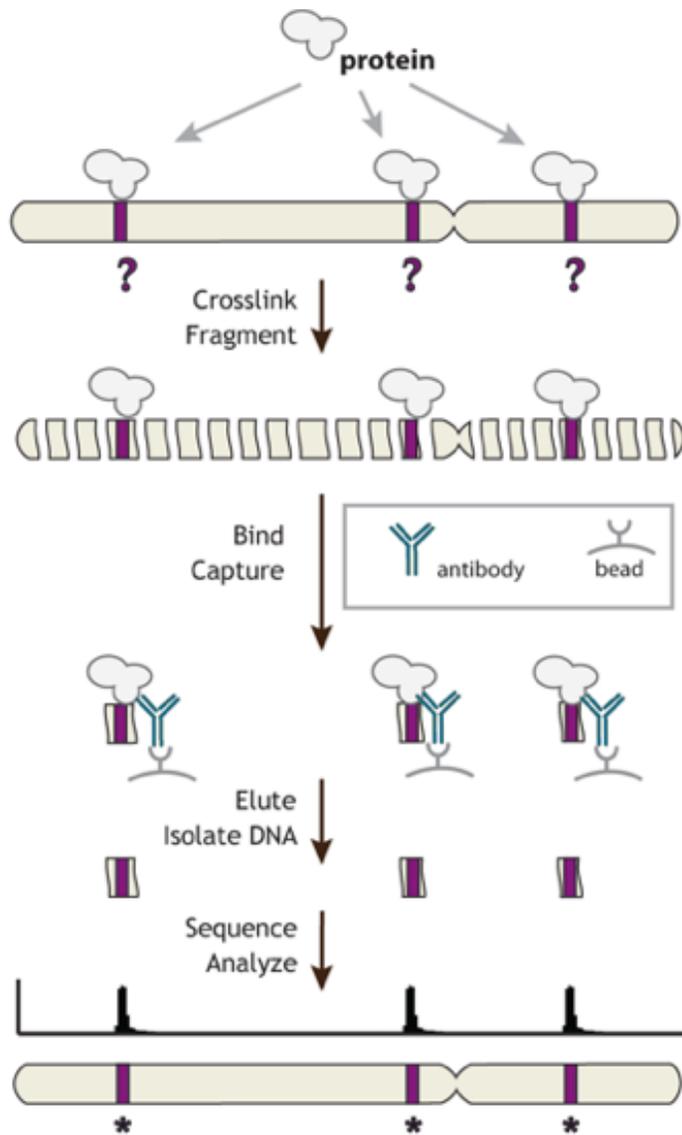


# Limitations of ChIP-Seq



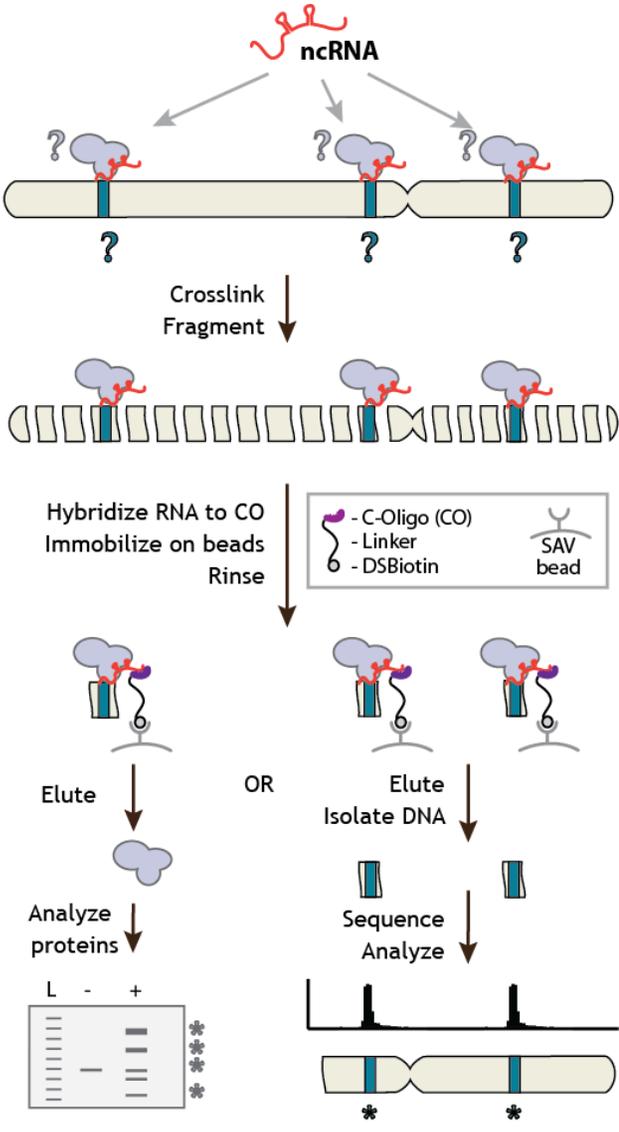
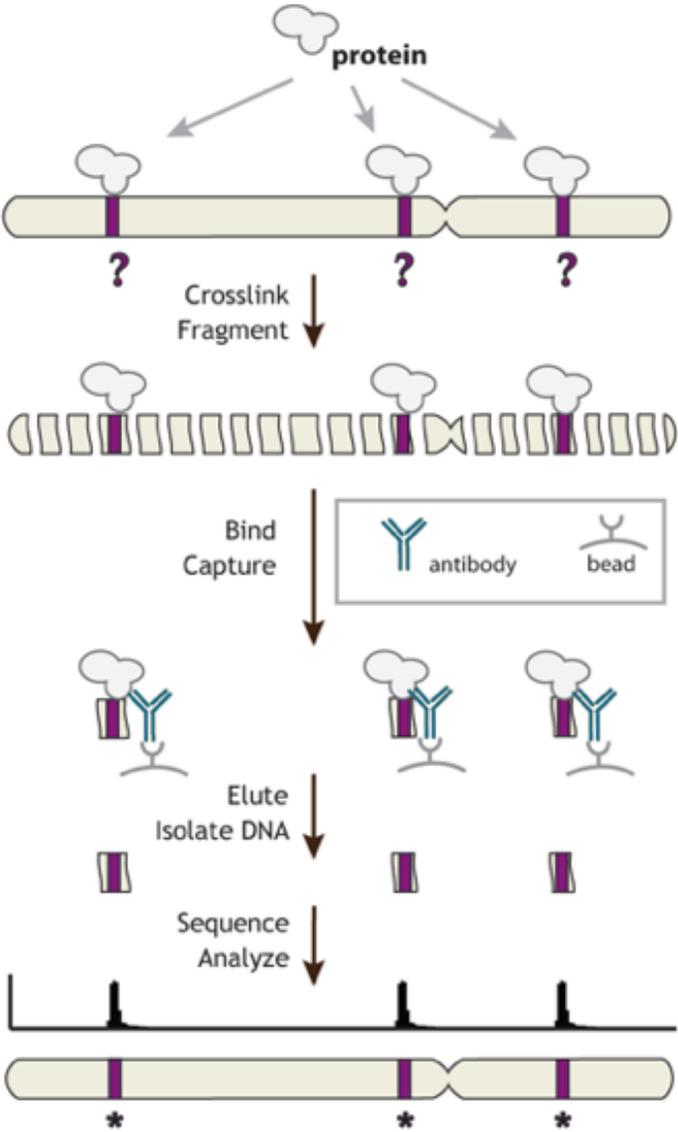
1. **Cross linking** efficiency is not necessarily uniform.
2. Enrichment is dependent on the **quality of antibody**.  
e.g., Site and degree of histone modifications.
3. Enrichment is dependent on the **accessibility of the epitope**.  
Comparing different sites to each other in the genome can be problematic.
4. Output is **descriptive**.  
Hard to infer function without more experimentation.

# Extensions of ChIP



1. Using a nuclease to achieve **higher resolution** (ChIP-exo).
2. Analysis of **nucleosome turnover** and exchange.
3. Extension to **RNA factors**.

# Extension to RNA factors: CHART, ChIRP and RAP



# Using sequencing to annotate the genome

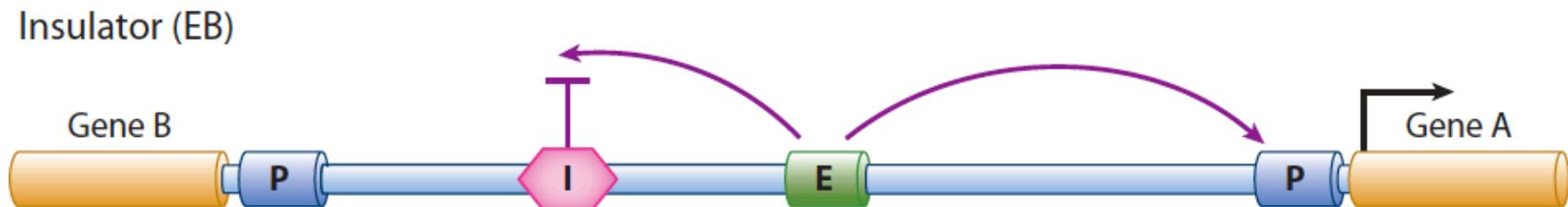
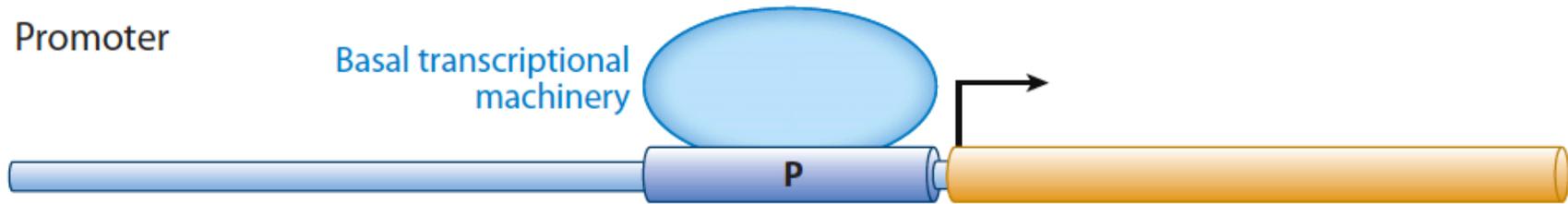
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**Targeted** approaches v **Global** approaches

# How do we identify regulatory elements in the genome?

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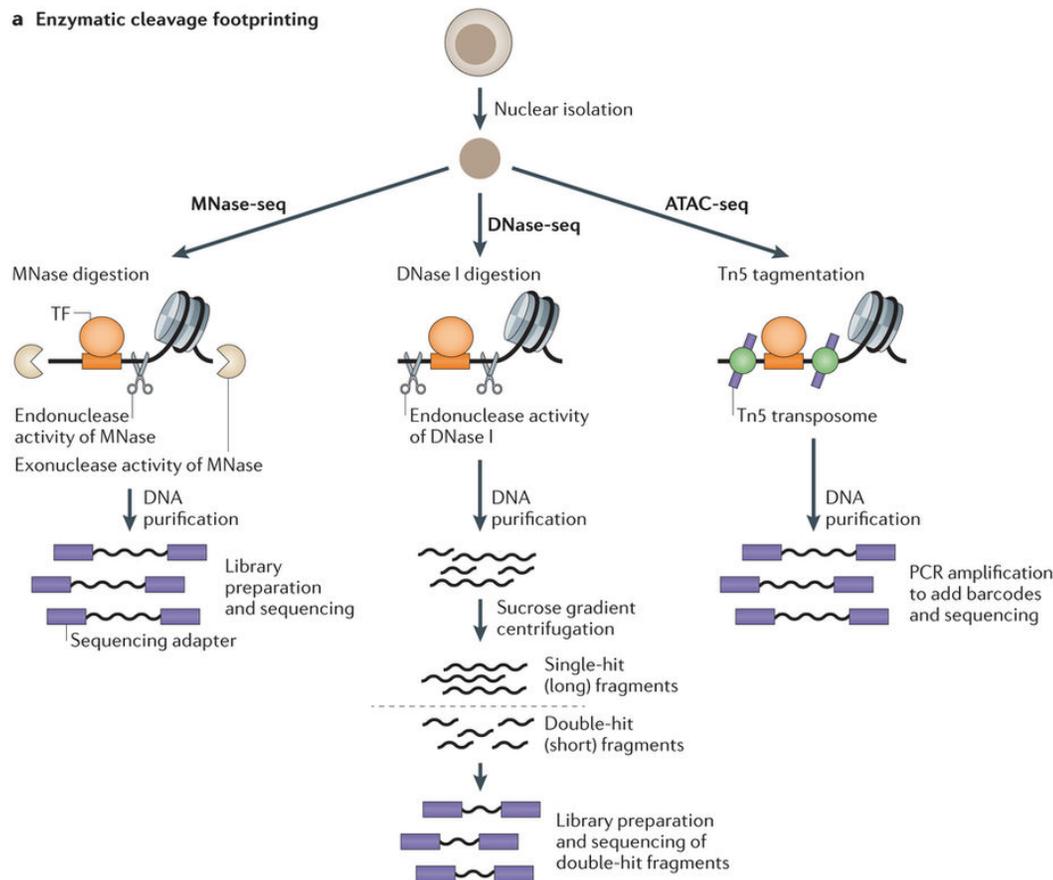


# Using differences in biochemical properties of regulatory elements to identify them by Seq

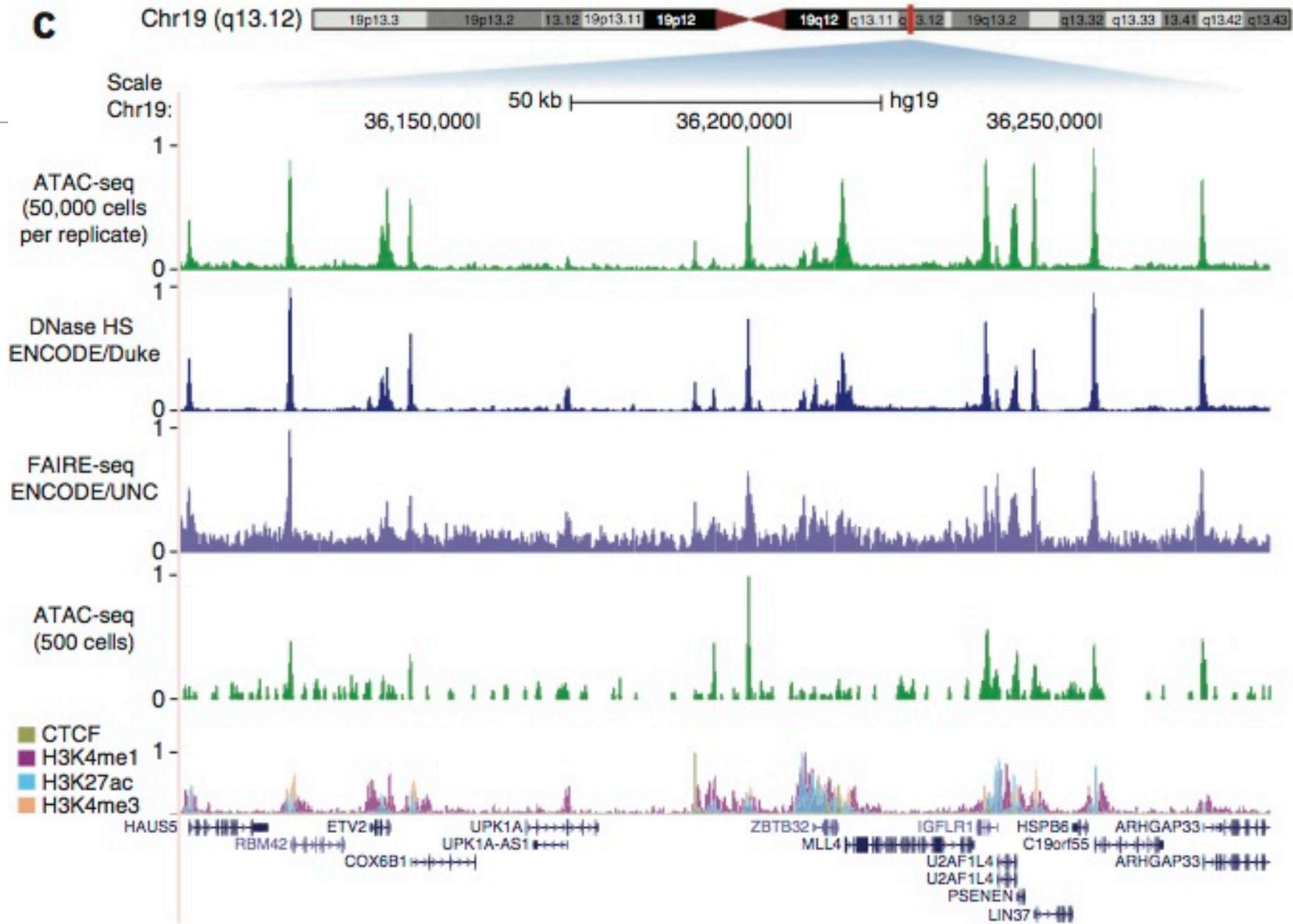
## 1. **Transcription factor binding** frequently deforms the B-form DNA, making it hypersensitive to DNase I and transposases.

Changes in **accessibility of chromatin** can provide information about regulation

- ATAC-seq (shown)
- MNase-Seq (shown).
- DNase-Seq (shown).
- FAIRE-Seq (not shown).

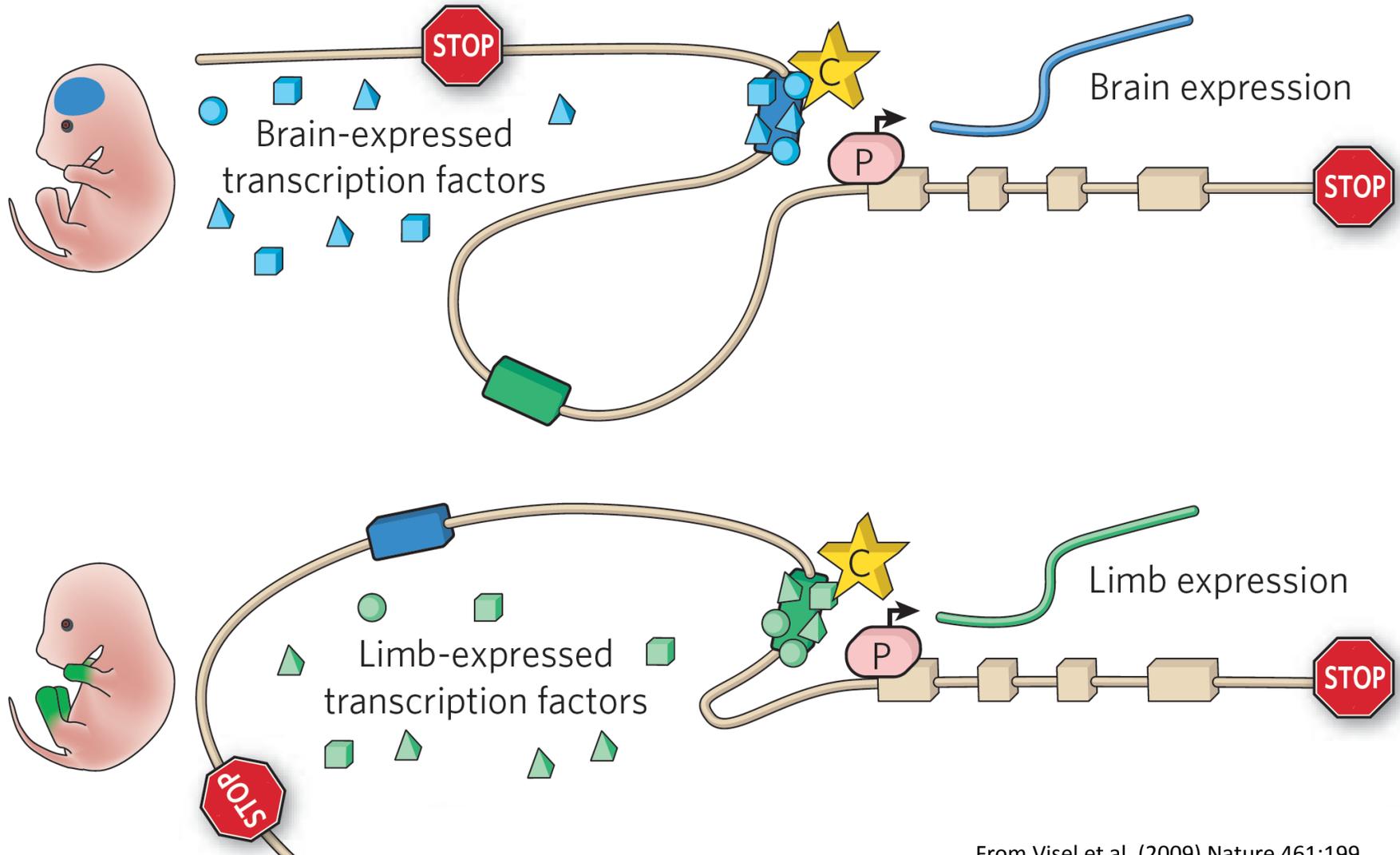


Zentner GE, Henikoff S. High-resolution digital profiling of the epigenome. Nat Rev Genet. 2014;15: 814–827. doi:10.1038/nrg3798



Buenrostro JD, Giresi PG, Zaba LC, Chang HY, and Greenleaf WJ. (2013) "Transposition of native chromatin for fast and sensitive epigenomic profiling of open chromatin, DNA-binding proteins and nucleosome position." *Nature Methods*

# The 3D organization of the genome is important



# Ligation-based methods to study 3D conformation



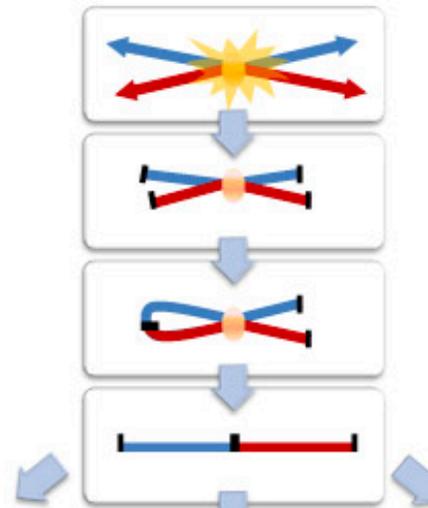
Image: David Goodsell

**Cross-link  
DNA**

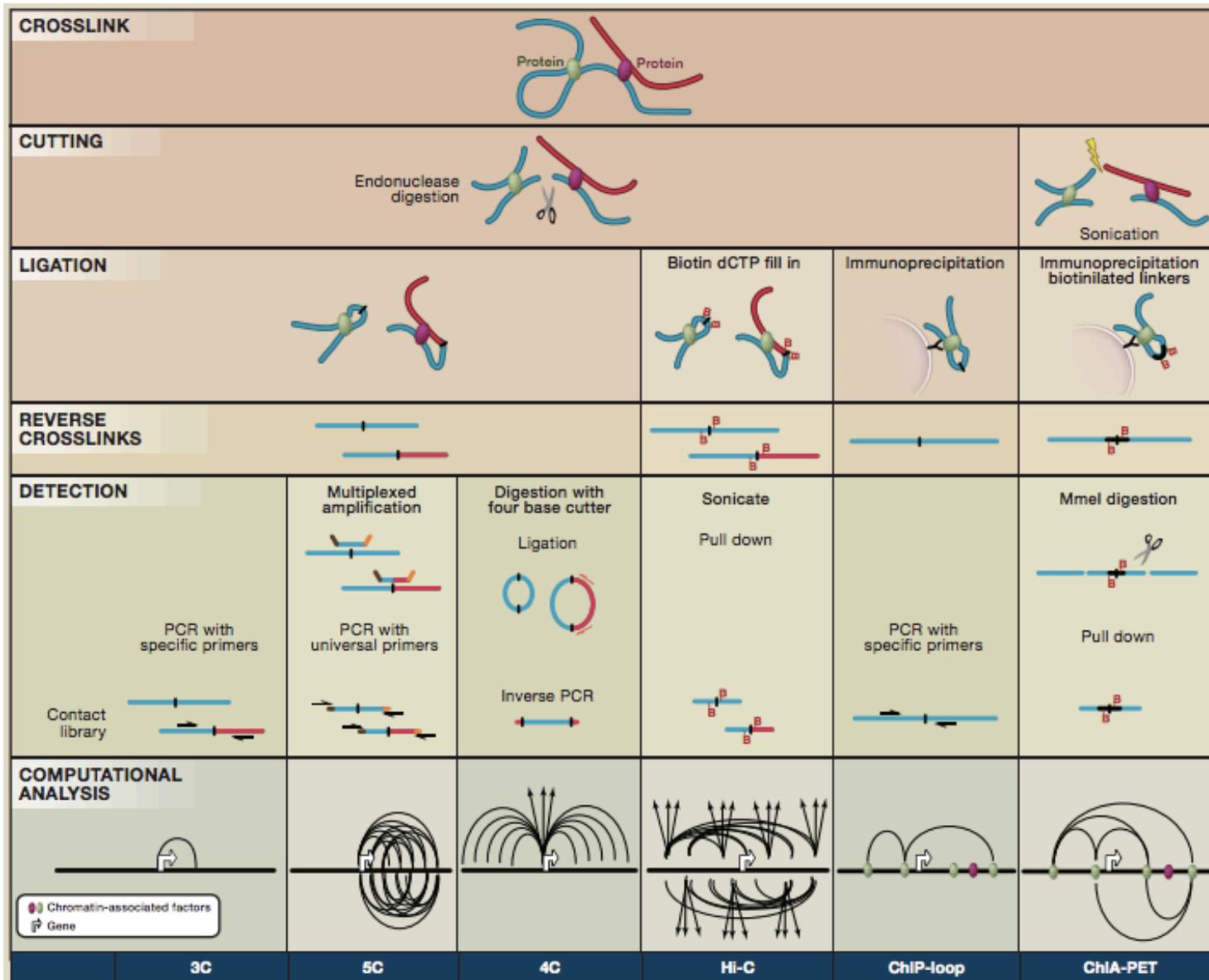
**Restriction  
Digest**

**Intramolecular  
Ligation**

**Reverse  
Cross-link**

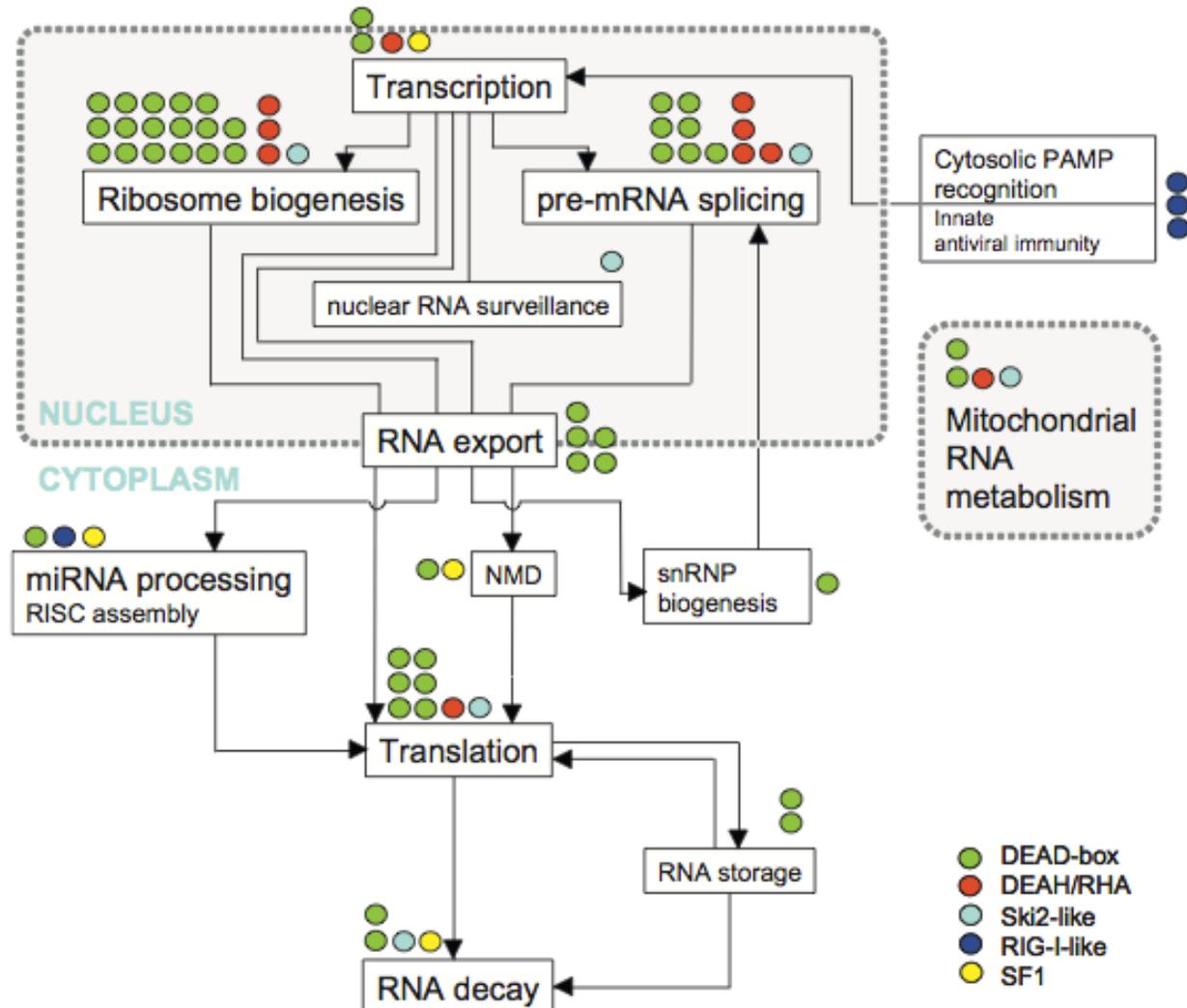


# Many techniques to analyze chromatin conformation



Hakim & Misteli,  
Cell (2012)

# Gene expression is also controlled at the level of RNA



## Part 2: RNA-Seq and applications of RNA-Seq

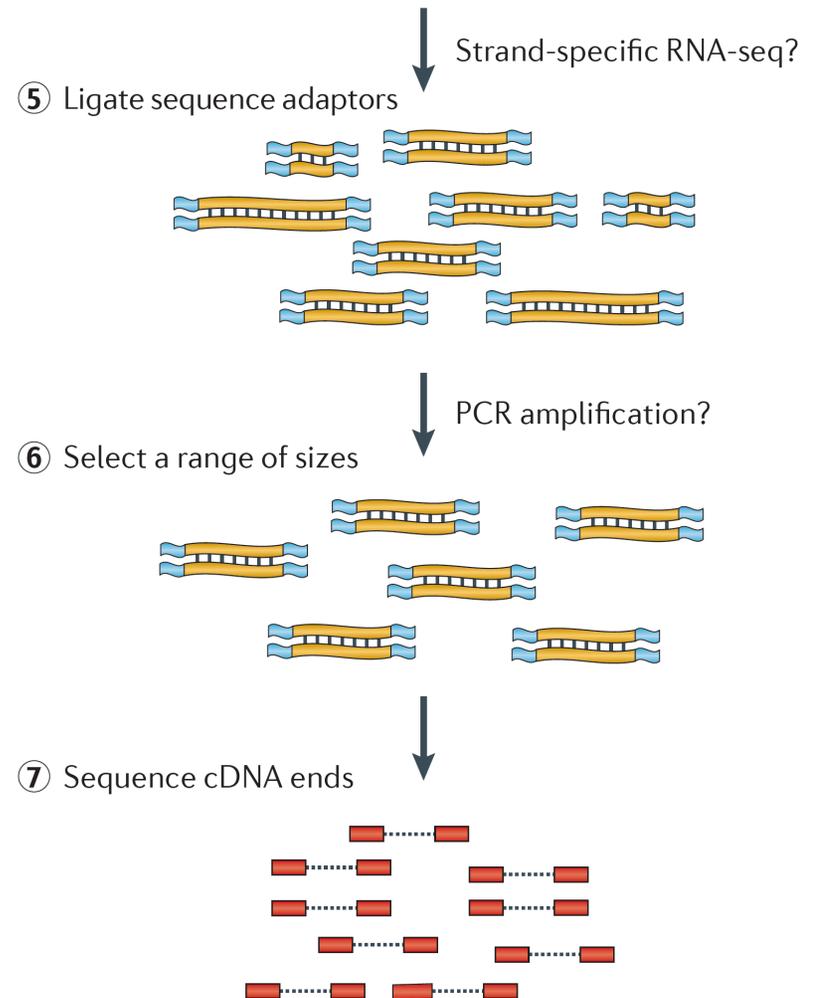
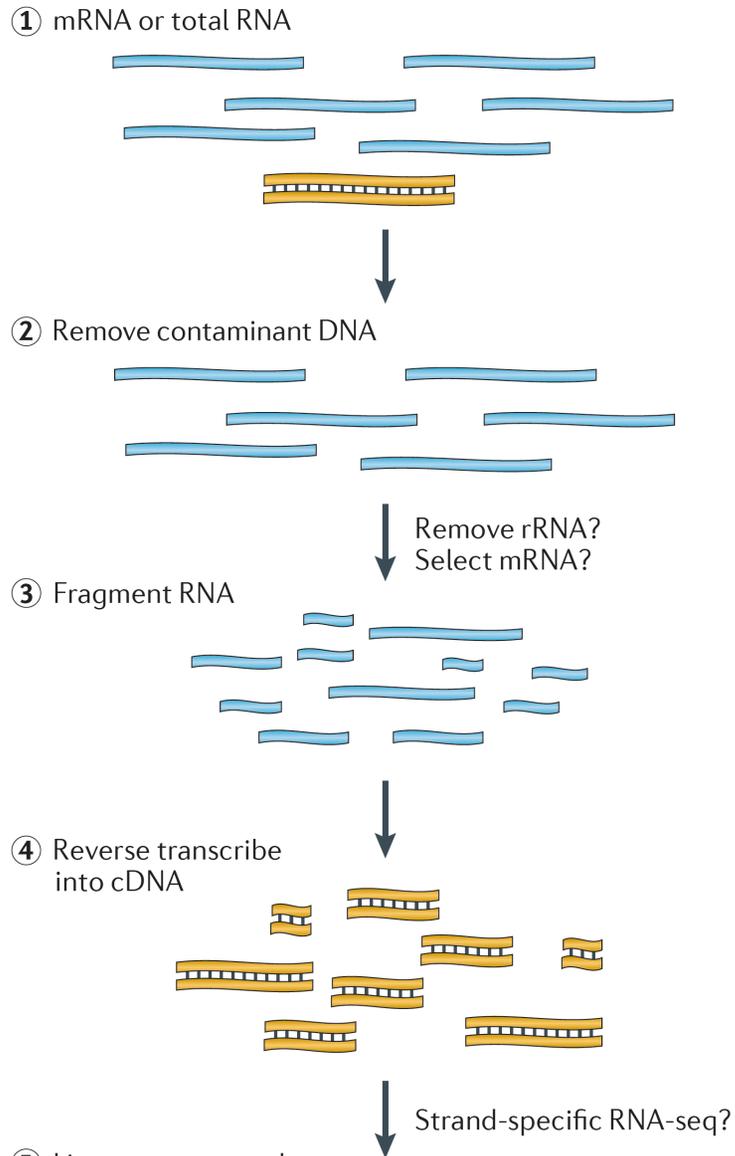
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# Using RNA-Seq to examine RNA

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- Technical methodology
- Read mapping and normalization
- Estimating isoform-level gene expression
- De novo transcript reconstruction
- Sensitivity and sequencing depth
- Differential expression analysis

# RNA-Seq workflow



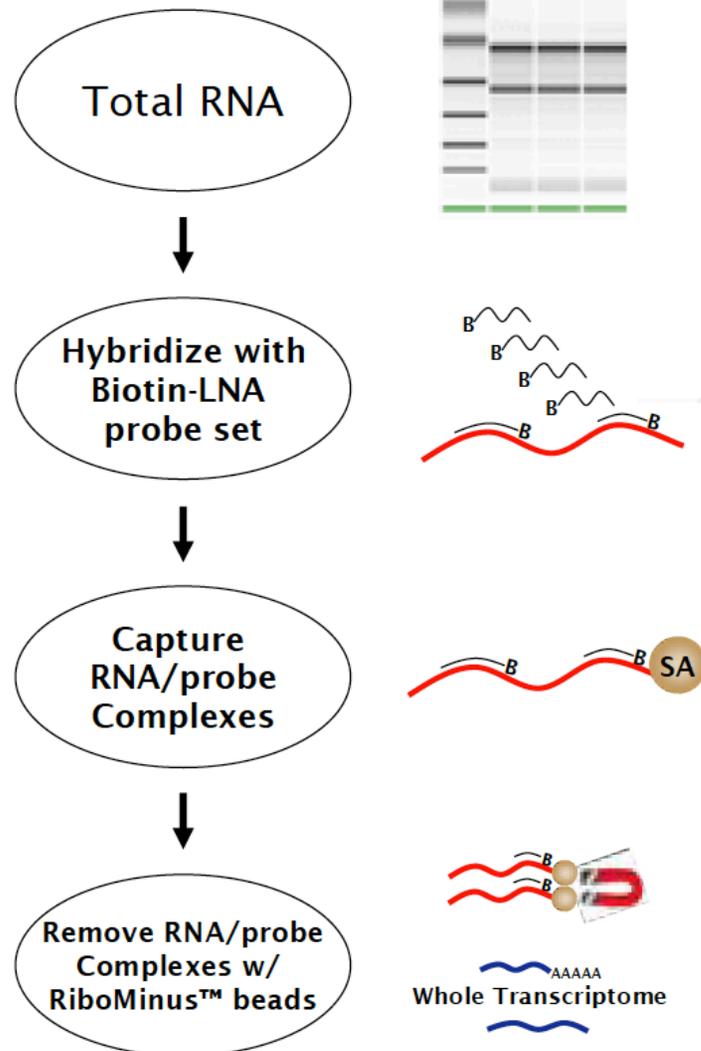
## Some technical details specific to RNA-Seq

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- Wide dynamic range of RNA concentrations.
- RNA is strand specific (unlike dsDNA)
- RNA degrades easily (RNase and spontaneous)
- RNA is processed (e.g., spliced)
- RNA has secondary structure (possible blocks to reverse transcriptase).

# Ribosomal RNA will dominate the sequenced reads unless removed

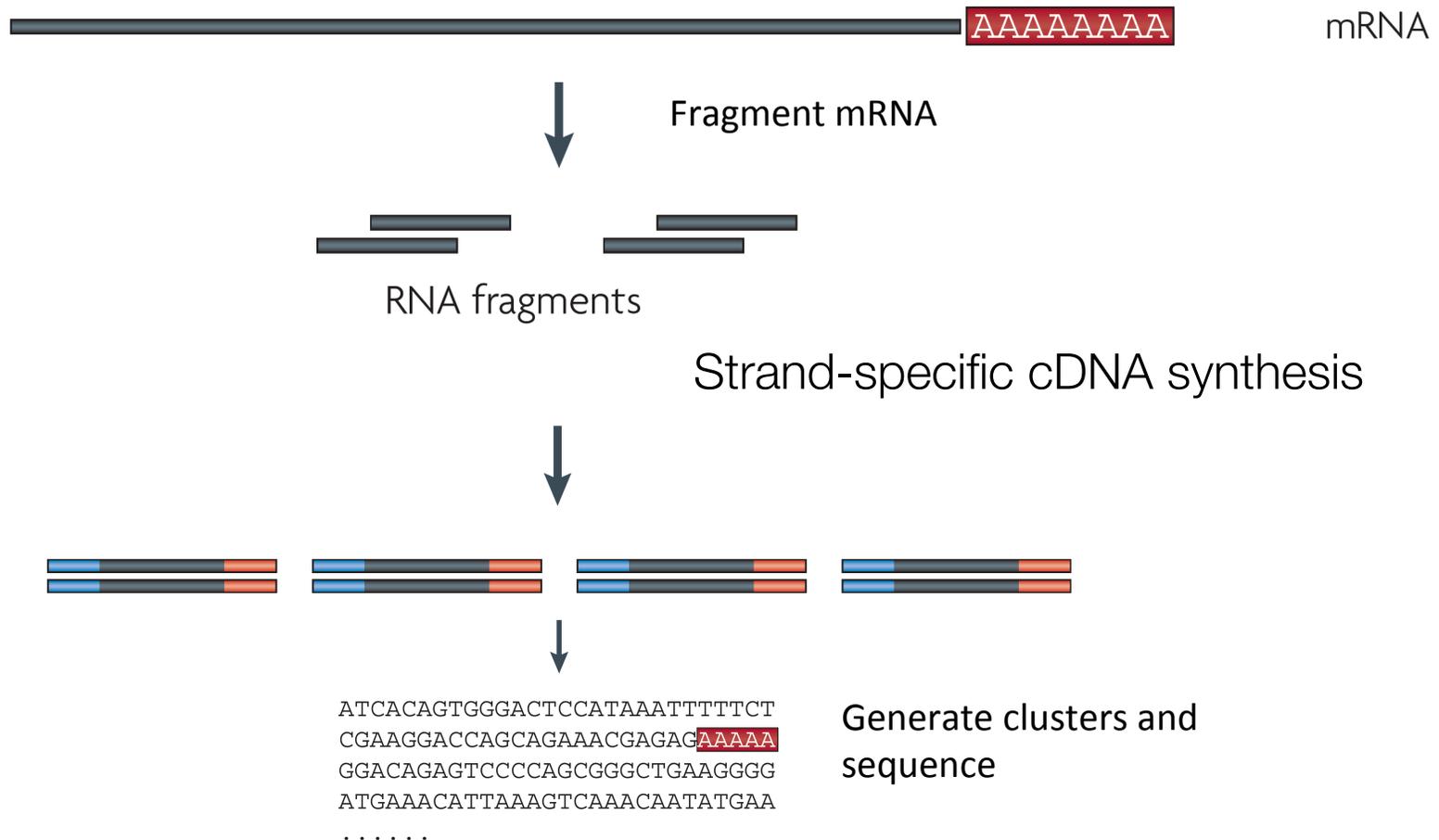
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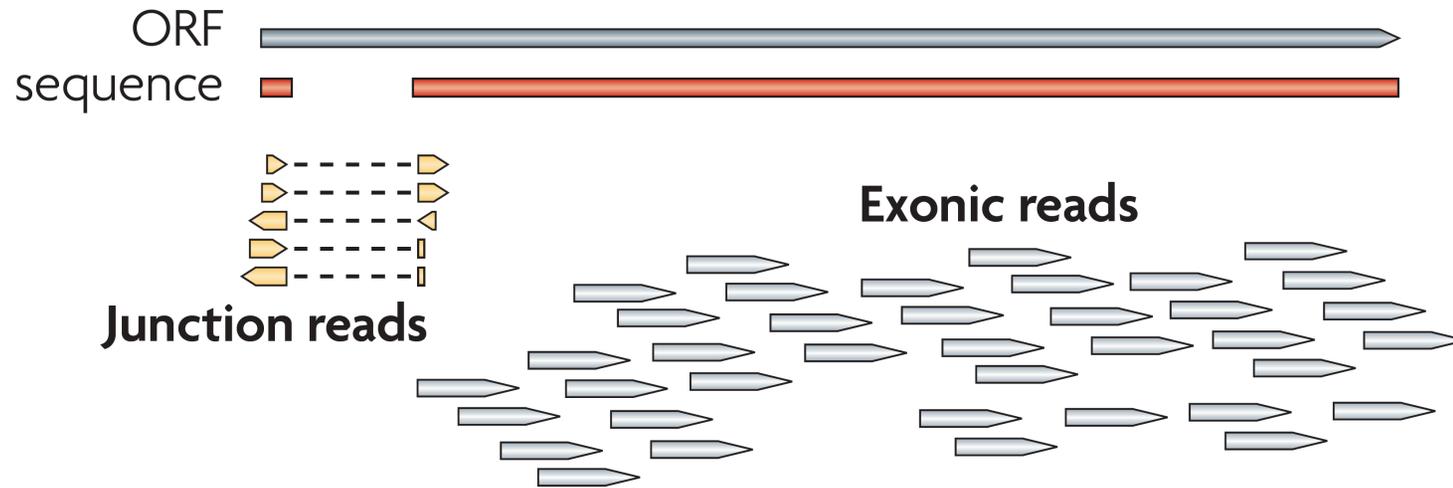
# Illumina RNA-seq workflow

Capture poly-A RNA with poly-T oligo attached beads (100 ng total) (2x)

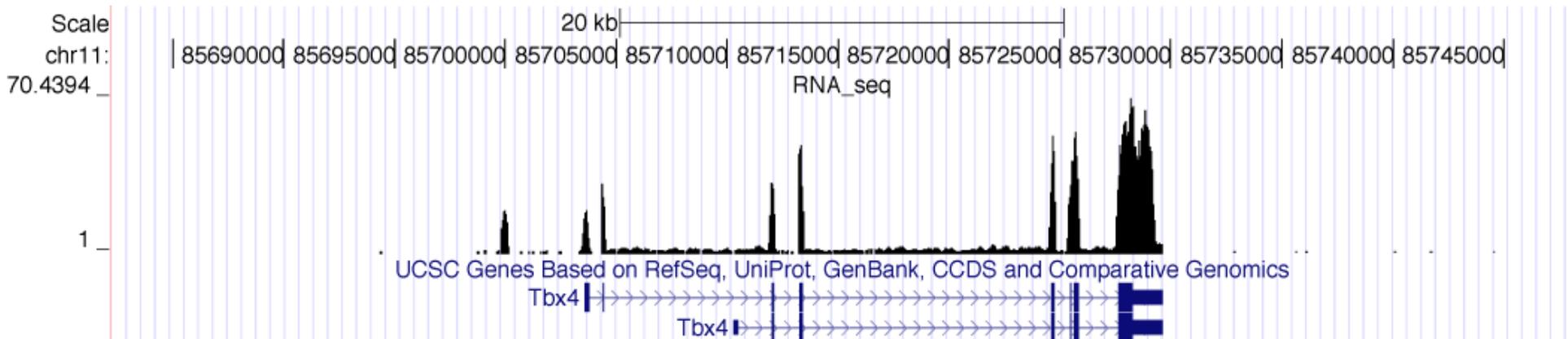
- RNA quality must be high – degradation produces 3' bias
- Non-poly-A RNAs are not recovered



# RNA-Seq reads map mostly to exons



Martin and Wang *Nat Rev Genet* 12:671 (2011)



# How does one analyze RNA levels from RNA-Seq?

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## **Use existing gene annotation:**

Align to genome plus annotated splices

Depends on high-quality gene annotation

Which annotation to use: RefSeq, GENCODE, UCSC?

Isoform quantification?

Identifying novel transcripts?

## **Reference-guided alignments:**

Align to genome sequence

Infer splice events from reads

Allows transcriptome analyses of genomes with poor gene annotation

## **De novo transcript assembly:**

Assemble transcripts directly from reads

Allows transcriptome analyses of species without reference genomes

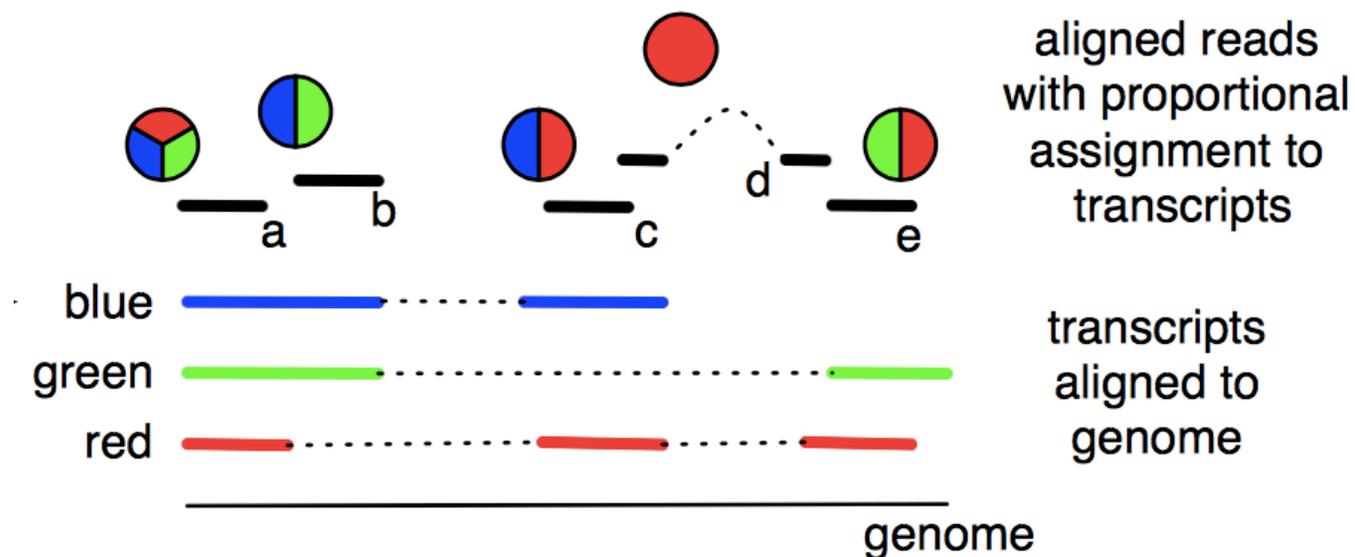
# RNA-seq reads contain information about the abundance of different transcript isoforms

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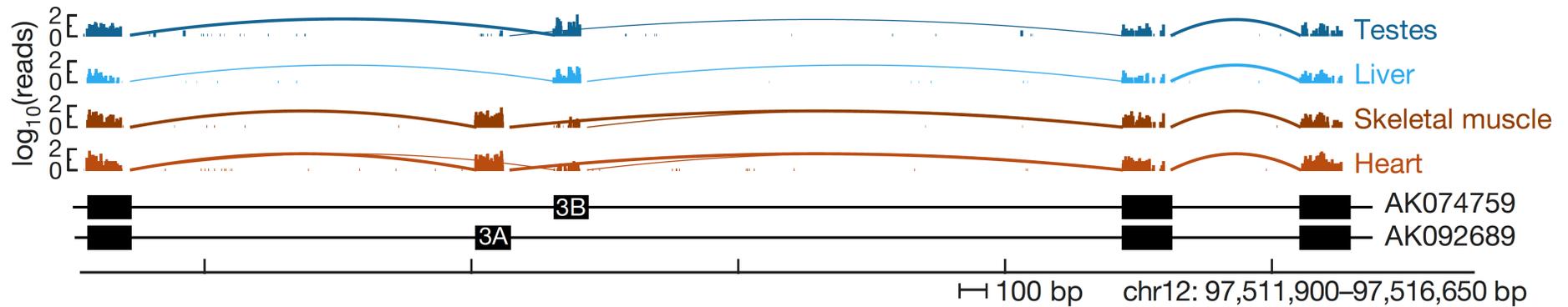
## Normalization :

**Internal:** *Reads or Fragments* per kilobase of feature length per million mapped reads (RPKM or FPKM)

**External:** Reads relative to a standard “spike”



# There is a lot of functional diversity in transcript isoforms



Alternative transcript events	Total events (×10 <sup>3</sup> )	Number detected (×10 <sup>3</sup> )	Both isoforms detected	Number tissue-regulated	% Tissue-regulated (observed)	% Tissue-regulated (estimated)
Skipped exon	37	35	10,436	6,822	65	72
Retained intron	1	1	167	96	57	71
Alternative 5' splice site (A5SS)	15	15	2,168	1,386	64	72
Alternative 3' splice site (A3SS)	17	16	4,181	2,655	64	74
Mutually exclusive exon (MXE)	4	4	167	95	57	66
Alternative first exon (AFE)	14	13	10,281	5,311	52	63
Alternative last exon (ALE)	9	8	5,246	2,491	47	52
Tandem 3' UTRs	7	7	5,136	3,801	74	80
<b>Total</b>	<b>105</b>	<b>100</b>	<b>37,782</b>	<b>22,657</b>	<b>60</b>	<b>68</b>

Constitutive exon or region   
 Body read   
 Junction read   
 pA Polyadenylation site  
 Alternative exon or extension   
█ Inclusive/extended isoform   
█ Exclusive isoform   
█ Both isoforms

# Examples of applications of RNA-seq

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Characterizing transcriptome complexity

- Alternative splicing

Differential expression analysis

- Gene- and isoform-level expression comparisons

Novel RNA species

- lncRNAs and eRNAs

- Pervasive transcription

Translation

- Ribosome profiling

Allele-specific expression

Measuring RNA half-lives and decay

Examining protein-RNA interactions (CLIP, RIP, &c.)

Effect of genetic variation on gene expression

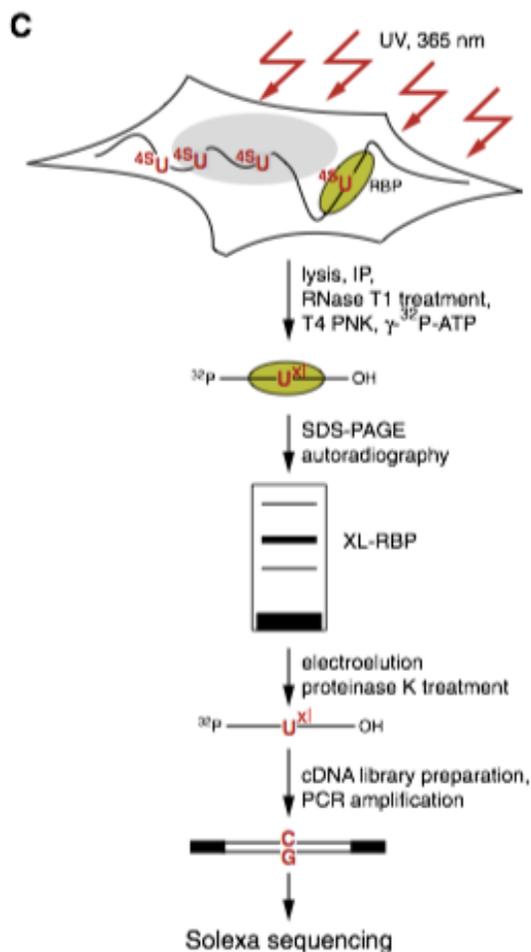
- Imprinting

- RNA editing

- Novel events

# RNA-seq to examine protein-RNA interactions

## PAR-CLIP Photoactivatable-Ribonucleoside- Enhanced Crosslinking and Immunoprecipitation



There are several methods to look at protein-RNA interactions using RNA-Seq such as RIP, CLIP and similar protocols.

### 3'UTR of ELF1

Sequence	# reads	error
AAATGTTTTAGATTACTTTTTCAACTGTAAATAATGTACATTTAATGTCACAAGAAAA	501	1
-----ATTACTTTTTCAACTGTAAACAATGTACATTT-----	239	1
-----ATTACTTTTTCAACTGTAAATAATGTACACTT-----	113	0
-----ACTTTTTCAACTGTAAACAATGTACATTTAAT-----	82	1
-----ATTACTTTTTCAACTGTAAATAATGTACATCT-----	67	1

### 3'UTR of HES1

Sequence	# reads	error
GTGACTGACCATGCACTATATTTGTATATATTTTATATGTTTCATATGCAATTCGCGCCTT	527	1
-----CACTATATTTGTATACATTTTATATG-----	130	1
-----CACTATATTTGTATACATTTTATATG-----	48	1
-----ACTATATTTGTATACATTTTATATG-----	40	1
-----CACTATATTTGTATATATTTTATATGTTTCA-----	22	1

1. Hafner, M. *et al.* Transcriptome-wide Identification of RNA-Binding Protein and MicroRNA Target Sites by PAR-CLIP. *CELL* **141**, 129–141 (2010).

# Summary

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- Genomics I: Deep sequencing gives us access to information on a genomic level.
- Genomics II: These approaches provide a diverse set of tools to study life at a genomic scale.
- \*Sophisticated use of data from genomics requires an integrated understanding of the biological experiment, sample preparation and down stream computational analyses of the data.