



# 生物信息学

## 第十一章 转录组与转录调控分析（2）

# 基因集富集分析



- ❑ **Gene Set Enrichment Analysis (GSEA)**
- ❑ 考虑所有的基因而不仅是差异表达基因
- ❑ 根据差异表达水平将所有基因排序
- ❑ 发现基因集里的基因是否倾向于分布在所有基因列表的前部 (上调) 或后部 (下调)
- ❑ 计算流程:
  - ✿ 计算一个富集分值 (Enrichment score, ES)
  - ✿ 根据ES分值估计统计显著性
  - ✿ 针对多重检验进行校正



# GSEA的输入

- ❑ 基因表达数据 $D$ ，包括 $N$ 个基因和 $k$ 个样本
- ❑ 排序产生基因列表 $L$ 
  - ✿ 上调-不变-下调
  - ✿ 差异表达基因的 $p$ -value
- ❑ 用指数 $p$ 来控制每一步的权重
  - ✿  $p=0$ ，标准Kolmogorov–Smirnov统计
  - ✿  $p=1$ ，GSEA软件
- ❑ 独立的基因集 $S$ ，如GO, KEGG
  - ✿ 包括 $N_H$ 个基因

# Enrichment Score ES(S)



- 基因集 $D$ 排序为 $L = \{g_1, \dots, g_N\}$ ,  $r(g_j) = r_j$
- 对基因列表 $L$ , 计算每一个位置 $i$ 以上, 包括在基因集 $S$ 中的 (“hits”) 部分, 以及不在 $S$ 中的 (“misses”) 部分

$$P_{\text{hit}}(S, i) = \sum_{\substack{g_j \in S \\ j \leq i}} \frac{|r_j|^p}{N_R}, \quad \text{where } N_R = \sum_{g_j \in S} |r_j|^p$$

$$P_{\text{miss}}(S, i) = \sum_{\substack{g_j \notin S \\ j \leq i}} \frac{1}{(N - N_H)}.$$

- $ES = P_{\text{hit}} - P_{\text{miss}}$  的最大值

# ES计算：实例



基因列表

基因集 $S = 1, 3, 4, 5$

| Gene | E-ratio |
|------|---------|
| 1    | 5       |
| 2    | 4       |
| 3    | 3       |
| 4    | 2       |
| 5    | 1.5     |
| 6    | 0.04    |
| 7    | 0.007   |

$$P_{hit}(S, 1) = 5/5=1$$

$$P_{miss}(S, 1) = 0$$

$$ES(1) = 1$$

$$P_{hit}(S, 2) = 5/5=1$$

$$P_{miss}(S, 2) = 0.33$$

$$ES(2) = 0.67$$

$$P_{hit}(S, 3) = 1 + 3/(5+3) = 1.375$$

$$P_{miss}(S, 3) = 0.33$$

$$ES(3) = 1.045$$

$$P_{hit}(S, 4) = 1.375 + 2/(5+3+2) = 1.575$$

$$P_{miss}(S, 4) = 0.33$$

$$ES(4) = 1.245$$

# ES计算：实例



基因列表

| Gene | E-ratio |
|------|---------|
| 1    | 5       |
| 2    | 4       |
| 3    | 3       |
| 4    | 2       |
| 5    | 1.5     |
| 6    | 0.04    |
| 7    | 0.007   |

基因集 $S=1, 3, 4, 5$

$$P_{hit}(S, 5) = 1.575 + 1.5/(5+3+2+1.5)=1.705$$

$$P_{miss}(S, 5) = 0.33$$

$$\mathbf{ES(5) = 1.375}$$

$$P_{hit}(S, 6) = 1.705$$

$$P_{miss}(S, 6) = 0.66$$

$$ES(6) = 1.045$$

$$P_{hit}(S, 7) = 1.705$$

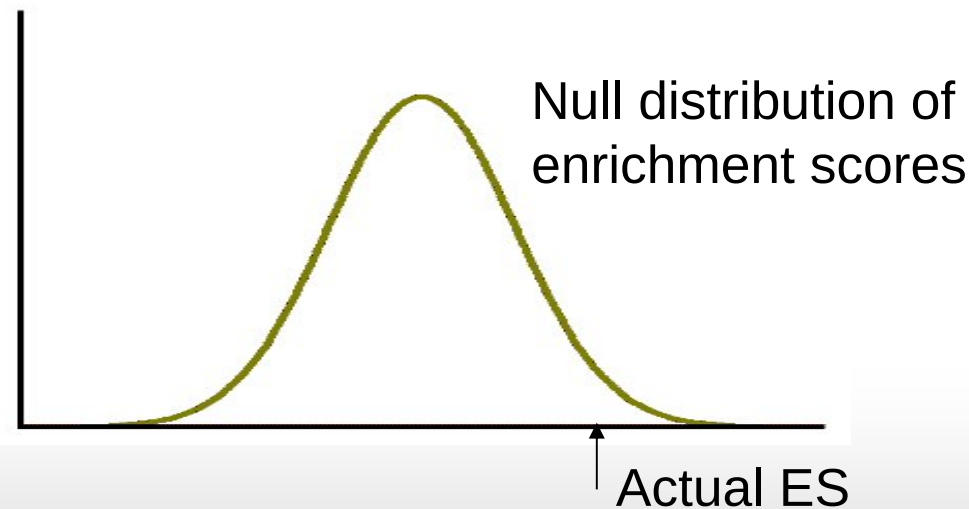
$$P_{miss}(S, 7) = 1$$

$$ES(7) = 0.705$$

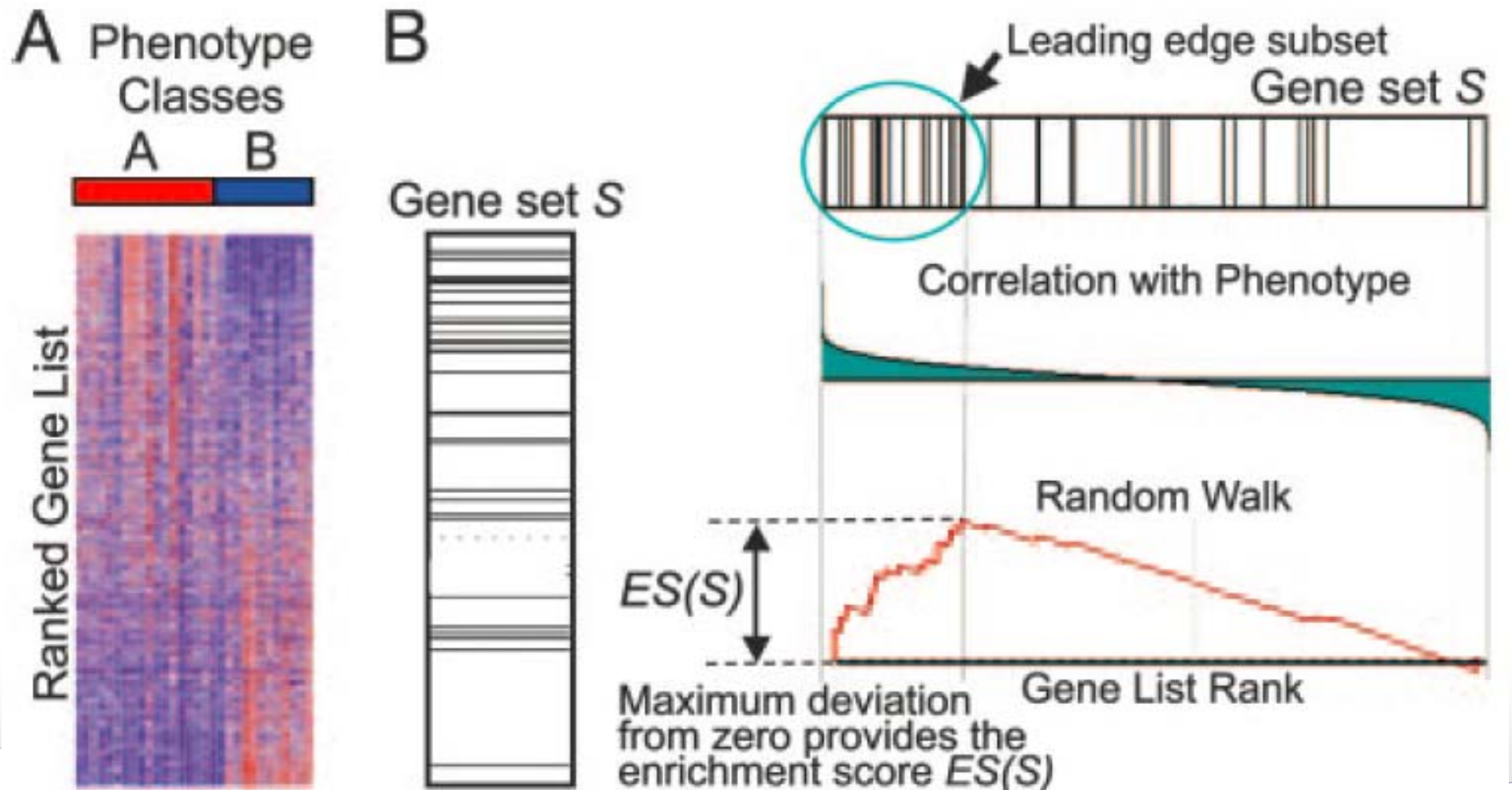


# 显著性估算

- ❑ 计算ES的显著性：与 $ES_{NULL}$ 比较
- ❑ 将原数据的 $p$ -value取出，随机分给每个基因，重新排序
- ❑ 重新计算ES值，重复1,000次置换 (Permutation)，建立 $ES_{NULL}$ 分布的直方图
- ❑ 估算 $p$ -value = 大于或等于ES的个数/总数



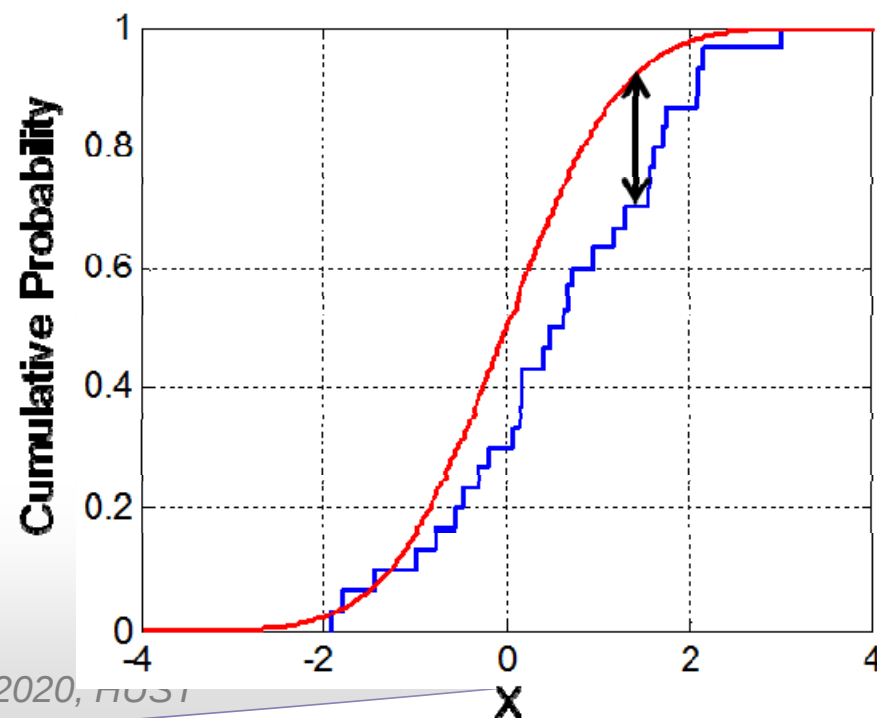
# GSEA算法总结



# Kolmogorov–Smirnov检验



- ❑ GSEA,  $p = 0$ , 不考虑 $p$ -value的权重
- ❑ 非参检验方法 (Nonparametric test)
- ❑ 检验分布是否符合正态分布
- ❑ 两样本的Kolmogorov–Smirnov检验
  - ✿ 差异最大的值算显著性



# 基因调控网络



- 早期观点：表达谱相似的基因可能存在功能上的关联，可能相互作用... (直接作用)
- 当前的观点：表达谱相似的基因可能具有共同的调控元件 (基因UTR区域存在共同的启动子)，能够被同一个上游因子所调控

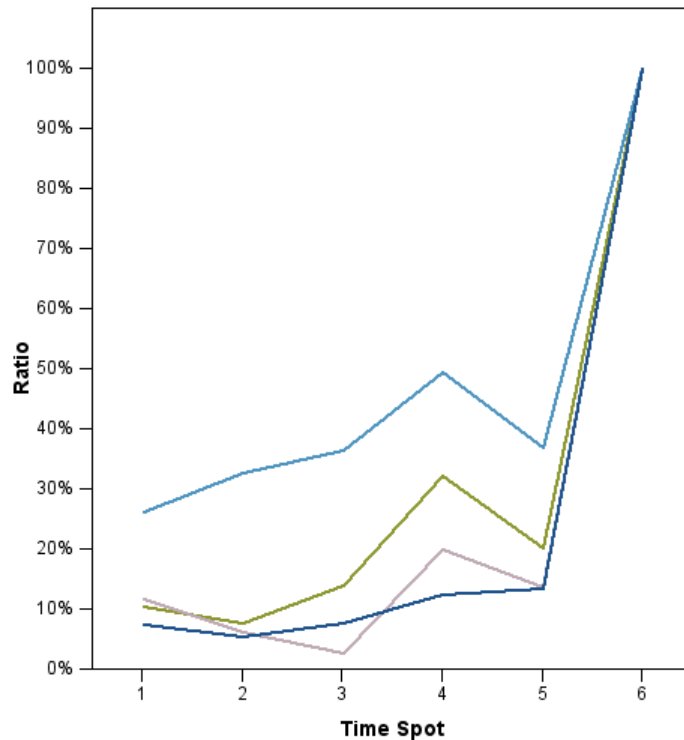
# 相关系数：基因共表达网络



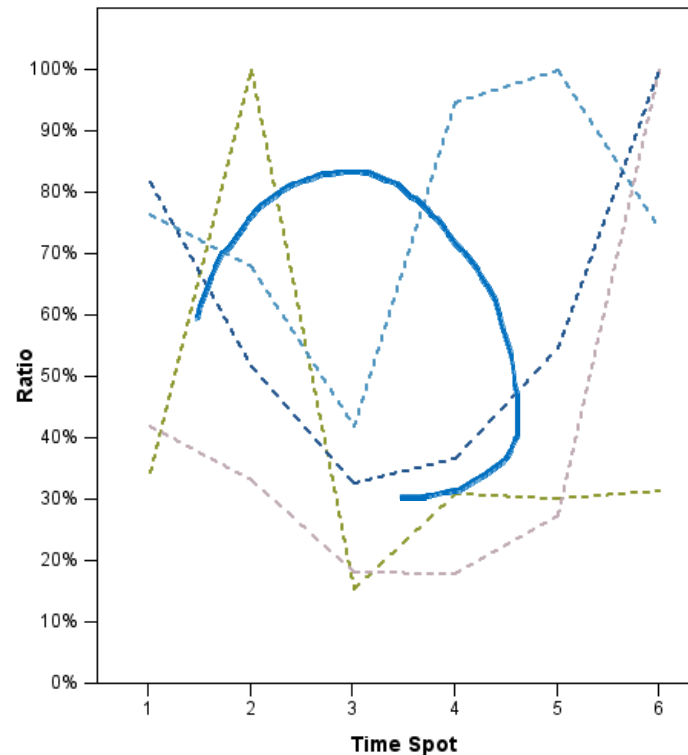
## 与光合效率和气孔发育相关的基因：ERL2

✿ 在Wild-type中与之显著相关，但在Mutant中显著不相关的基因

Wild-type

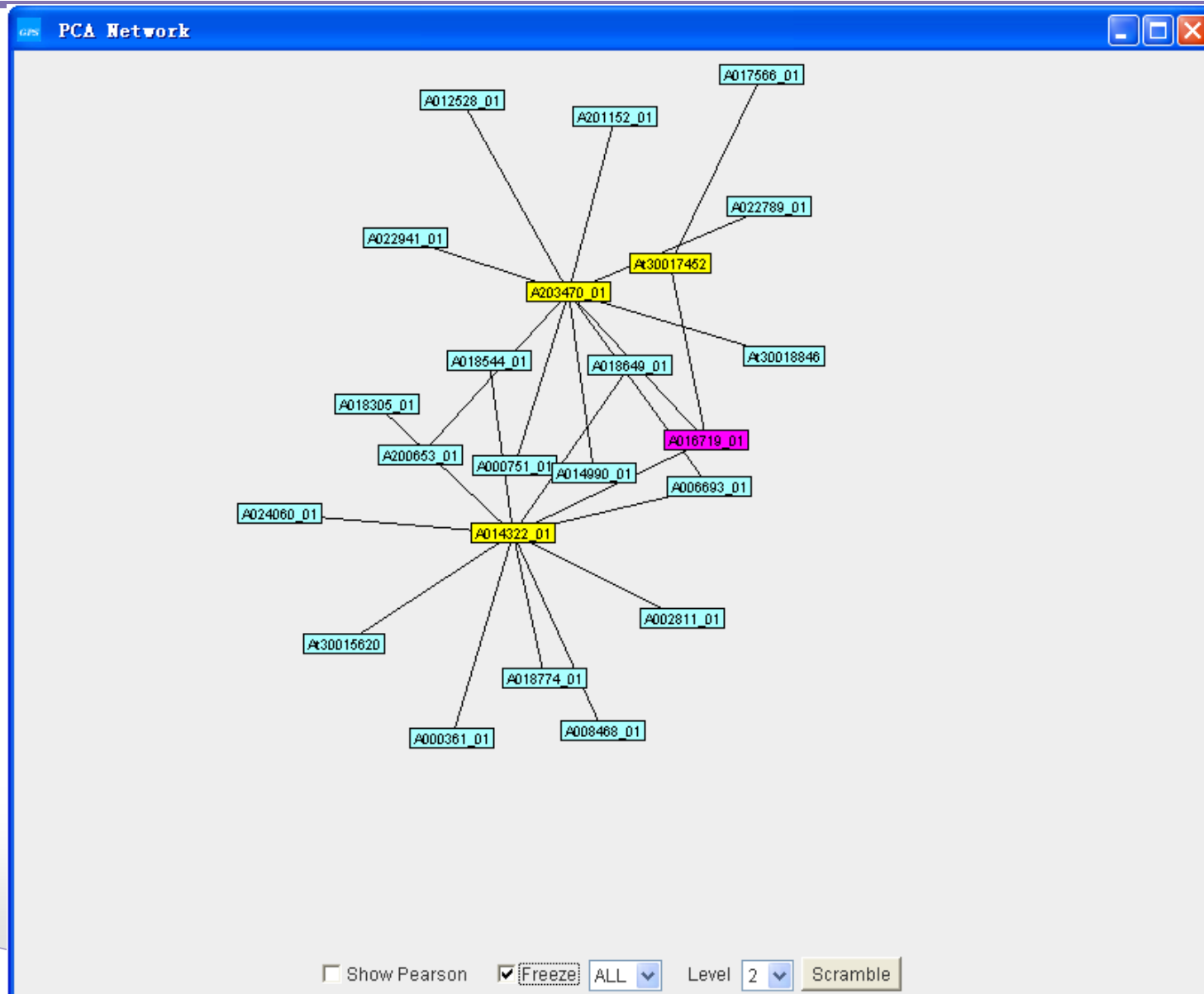


Mutant



A016719\_01 ERL2  
At30017452 SKP1  
A203470\_01 Unknown  
A014322\_01 ChS1

# 相关系数：基因共表达网络



# Microarray: 工具&数据库



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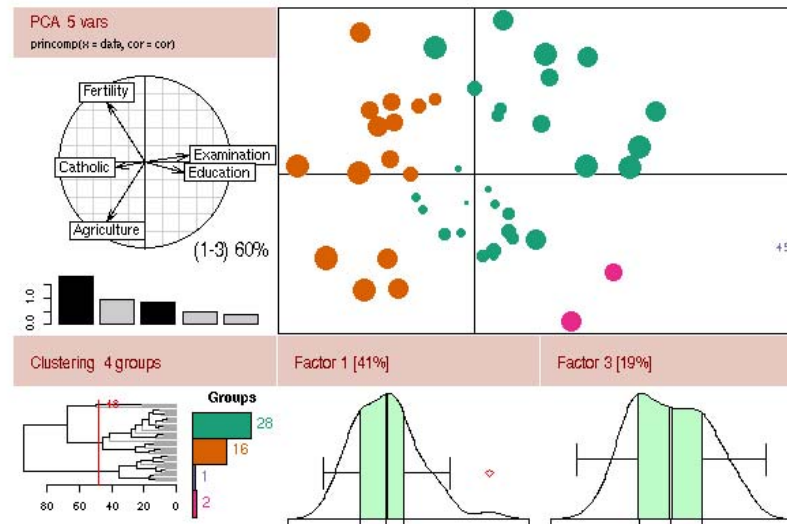
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## The R Project for Statistical Computing



### Getting Started:

- R is a free software environment for statistical computing and graphics. It compiles and runs on a wide variety of UNIX platforms, Windows and MacOS. To download R, please choose your preferred [CRAN mirror](#).
- If you have questions about R like how to download and install the software, or what the license terms are, please read our [answers to frequently asked questions](#) before you send an email.

### News:

- [R version 2.7.1](#) has been released on 2008-06-23.
- [R News 8/1](#) has been published on 2008-05-27.
- The R Foundation as been awarded [four slots for R projects](#) in the Google [Summer of Code 2008](#).
- [R 2.7.2 Release Candidates](#) will appear August 18-24. Final release is scheduled for 2008-08-25.
- [useR! 2008](#), the R user conference, will be held at Dortmund University, Germany, August 12-14, 2008.

# GEO - NCBI



  
Gene Expression Omnibus

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**Gene Expression Omnibus:** a gene expression/molecular abundance repository supporting [MIAME compliant](#) data submissions, and a curated, online resource for gene expression data browsing, query and retrieval.

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GEO accession

GEO BLAST

GO

GO

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GSM Samples **244022**

GSE Series **9369**

Total **258289**

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# Array Express - EMBL



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## ARRAYEXPRESS



ArrayExpress is a public repository for **transcriptomics data**, which is aimed at storing **MIAME-** and **MINSEQE-** compliant data in accordance with **MGED** recommendations. The ArrayExpress Warehouse stores gene-indexed **expression profiles** from a curated subset of experiments in the repository.

[» More Info](#)

### Experiments

6288 experiments, 190493 assays available



Experiment, citation, sample and factor annotations

[» Browse experiments](#)

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### Expression Profiles

592 experiments, 169983 genes available



Genes

Experiment and sample annotations

Any species

[» Advanced query interface](#)

### News

- 28 Jul 2008  
**MGED 11 meeting**  
A tutorial on *Using ArrayExpress* along with other workshops and talks will be held at **MGED 11 meeting**, Riva del Garda, Trentino, Italy; from the 1-5 Sep, 2008. Please [register](#) if you wish to attend.
- 27 Jun 2008  
**ArrayExpress New Interface**...[more](#)

### Links

- ArrayExpress **Atlas Beta** *new!*
- ArrayExpress **User Survey**
- **Help** | **FAQ** | **Tutorials** | **Citing**
- **Submit data** to ArrayExpress
- **Programmatic Access**
- **FTP server** for public data
- **Software Downloads** and **Statistics**
- Quality metrics for microarrays
- ArrayExpress Scientific Advisory Board

# SMD - Stanford



## Stanford MicroArray Database

[SMD](#)[Links](#)[Help](#)

### SMD Login

User Name:

Password:

### Public Data

[Public Login](#) ☐

[Publications](#) ☐

[S.O.U.R.C.E](#) ☐

[Caryoscope](#) ☐

### SMD Announcements

Dozens of new data analysis tools are available from [GenePattern](#). Registered users click on the 'GP' icon in their repository.

### SMD Release 2.03

- Expression Connection: from a publication data set the user is allowed to view and manipulate the cluster and the expression correlations. Currently only available for Tuberculosis and Streptomyces.

### Recent Publications



The host response to adenovirus, helper-dependent adenovirus, and adeno-associated virus in mouse liver. McCaffrey AP, et al. (2008) Mol Ther 16(5):931-41



Systematic identification of mRNAs recruited to argonaute 2 by specific microRNAs and corresponding changes in transcript abundance. Hendrickson DG, et al. (2008) PLoS ONE 3(5):e2126



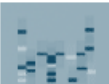
Module map of stem cell genes guides creation of epithelial cancer stem cells. Wong DJ, et al. (2008) Cell Stem Cell 2(4):333-44



Genomic response of the nematode *Caenorhabditis elegans* to spaceflight. Selch F, et al. (2008) Adv Space Res 41(5):807-815



MicroRNA expression signature of human sarcomas. Subramanian S, et al. (2008) Oncogene 27(14):2015-26



Systematic functional characterization of cis-regulatory motifs in human core promoters. Sinha S, et al. (2008) Genome Res 18(3):477-88



A dermal HOX transcriptional program regulates site-specific epidermal fate. Rinn JL, et al. (2008) Genes Dev 22(3):303-7



CSN5 isopeptidase activity links COP9 signalosome activation to breast cancer progression. Adler AS, et al. (2008) Cancer Res 68(2):506-15

# RNA-Seq



## □ 分析流程

- ✿ 分离纯化所有的mRNA
- ✿ 利用反转录酶将mRNA转变成cDNA
- ✿ cDNA测序
- ✿ 将序列映射到基因组上

## □ 序列检测到越多，则表达越高

## □ RNA-Seq数据分析：挑战！

- ✿ 将读段映射到参考基因组上
- ✿ 定量已知的基因
- ✿ 发现新的转录本
- ✿ 定量可变剪切异构体

# RNA-Seq数据：序列读段



## □ FASTQ: Illumina测序读段文件

```
Line 1: @EAS042_0001:1:1:1061:20798#0/1
Line 2: TNTCTGTGTCCTGGGGCATCAATGATAGTCACATAGTACTTGCTGGTCTCAAATTTCCACAAGGAGATATCAATGG
Line 3: +EAS042_0001:1:1:1061:20798#0/1
Line 4: aB\\^Y]a^]cde`daaYaaa_bc\\`b^Y\\a\\aaUQY\\]a`aa\\W_]HVZ]VQF^[`UH]J^F^T^\\I]__
```

### Line 1

|             |                                                                     |
|-------------|---------------------------------------------------------------------|
| EAS042_0001 | the unique instrument name                                          |
| 1           | flowcell lane                                                       |
| 1           | tile number within the flowcell lane                                |
| 1061        | 'x'-coordinate of the cluster within the tile                       |
| 20798       | 'y'-coordinate of the cluster within the tile                       |
| #0          | index number for a multiplexed sample (0 for no indexing)           |
| /1          | the member of a pair, /1 or /2 (paired-end or mate-pair reads only) |

Line 2: 原始序列

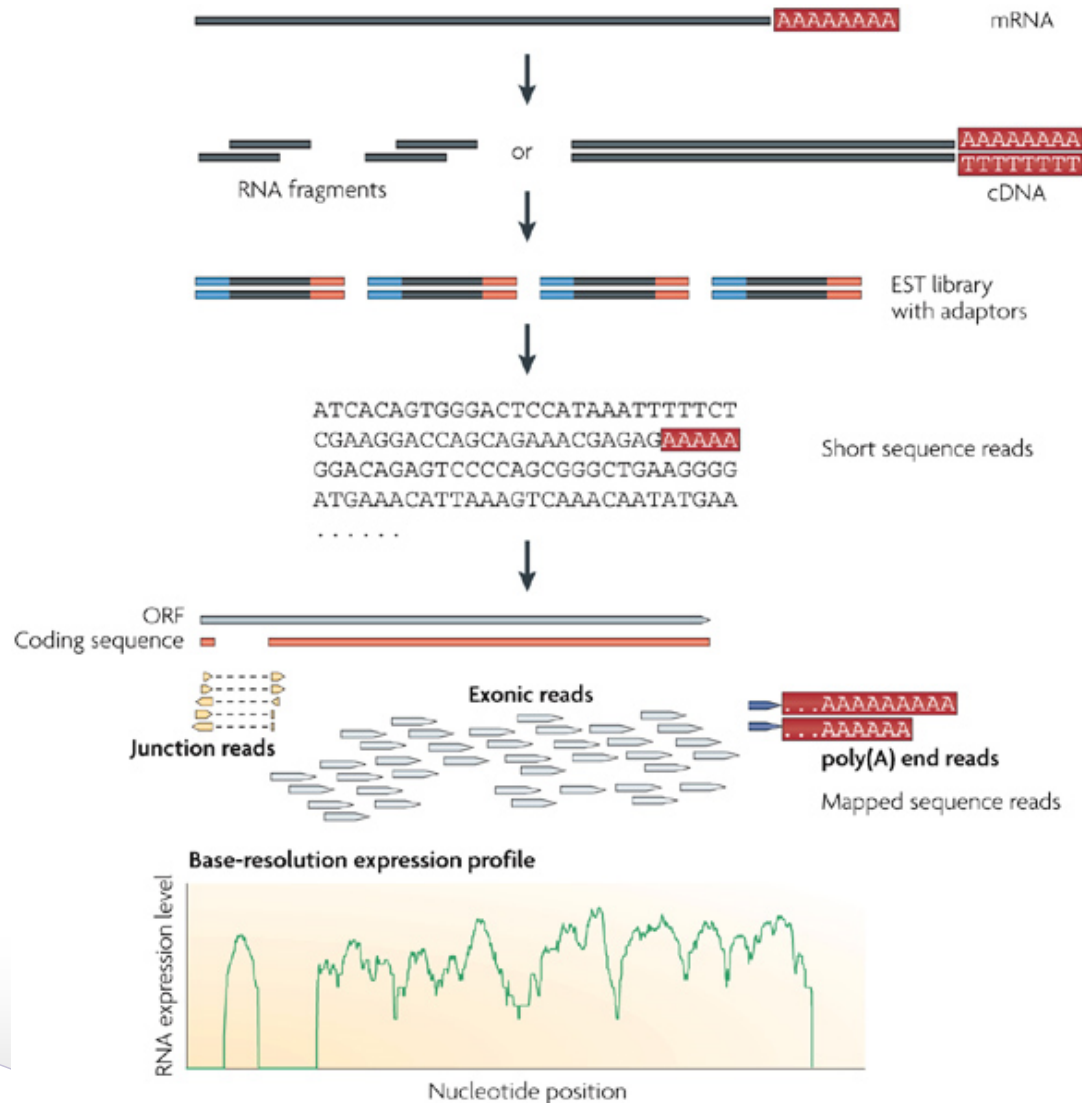
Line 3: + ?

Line 4: 序列的质量分值

-5 ~ 62

使用 ASCII 59 ~ 126

# RNA-Seq分析流程



Poly(A) end-reads

样品准备

高通量测序

数据分析:  
✓读段映射  
✓可视化  
✓重头组装  
✓定量

# RNA-Seq vs. DNA芯片



- ❑ RNA-seq可以发现新的转录本和可变剪切异构体，DNA芯片只能检测已知转录本的表达
- ❑ RNA-Seq比全基因组铺瓦芯片的解析度更高：单个碱基
- ❑ RNA-Seq相同的实验流程可以做不同的分析
  - ✿ 单核苷酸多态性 (SNP芯片)
  - ✿ 外显子连接点 (连接点芯片)
  - ✿ 基因融合 (基因融合芯片)

# RNA-Seq的优势



## □ 转录组分析方法：RNA-Seq比其他方法更有优势

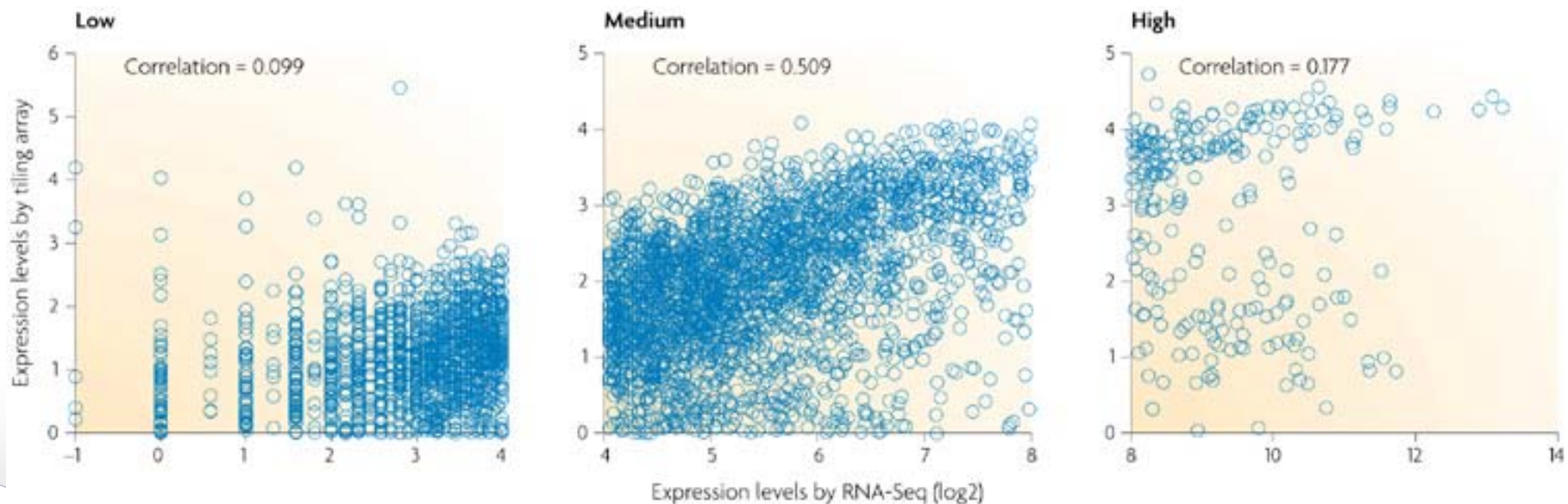
Table 1 | Advantages of RNA-Seq compared with other transcriptomics methods

| Technology                                                 | Tiling microarray       | cDNA or EST sequencing      | RNA-Seq                    |
|------------------------------------------------------------|-------------------------|-----------------------------|----------------------------|
| <i>Technology specifications</i>                           |                         |                             |                            |
| Principle                                                  | Hybridization           | Sanger sequencing           | High-throughput sequencing |
| Resolution                                                 | From several to 100 bp  | Single base                 | Single base                |
| Throughput                                                 | High                    | Low                         | High                       |
| Reliance on genomic sequence                               | Yes                     | No                          | In some cases              |
| Background noise                                           | High                    | Low                         | Low                        |
| <i>Application</i>                                         |                         |                             |                            |
| Simultaneously map transcribed regions and gene expression | Yes                     | Limited for gene expression | Yes                        |
| Dynamic range to quantify gene expression level            | Up to a few-hundredfold | Not practical               | >8,000-fold                |
| Ability to distinguish different isoforms                  | Limited                 | Yes                         | Yes                        |
| Ability to distinguish allelic expression                  | Limited                 | Yes                         | Yes                        |
| <i>Practical issues</i>                                    |                         |                             |                            |
| Required amount of RNA                                     | High                    | High                        | Low                        |
| Cost for mapping transcriptomes of large genomes           | High                    | High                        | Relatively low             |

# RNA-Seq vs. DNA芯片



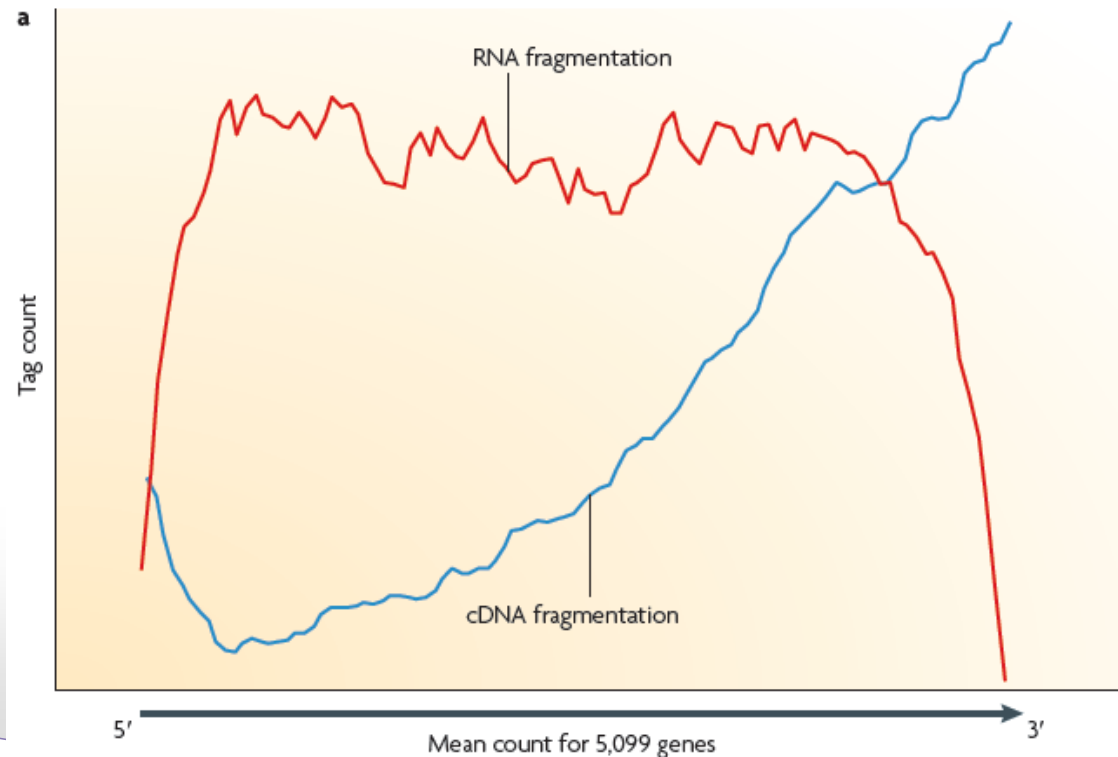
- ❑ 营养丰富的培养基里的芽殖酵母
- ❑ 仅在中等表达时，两者有较高一致性
- ❑ 基因表达低或者高的时候，关联性差
  - ✿ DNA芯片的对基因表达低或高的检测不够敏感



# RNA-Seq的问题：建库



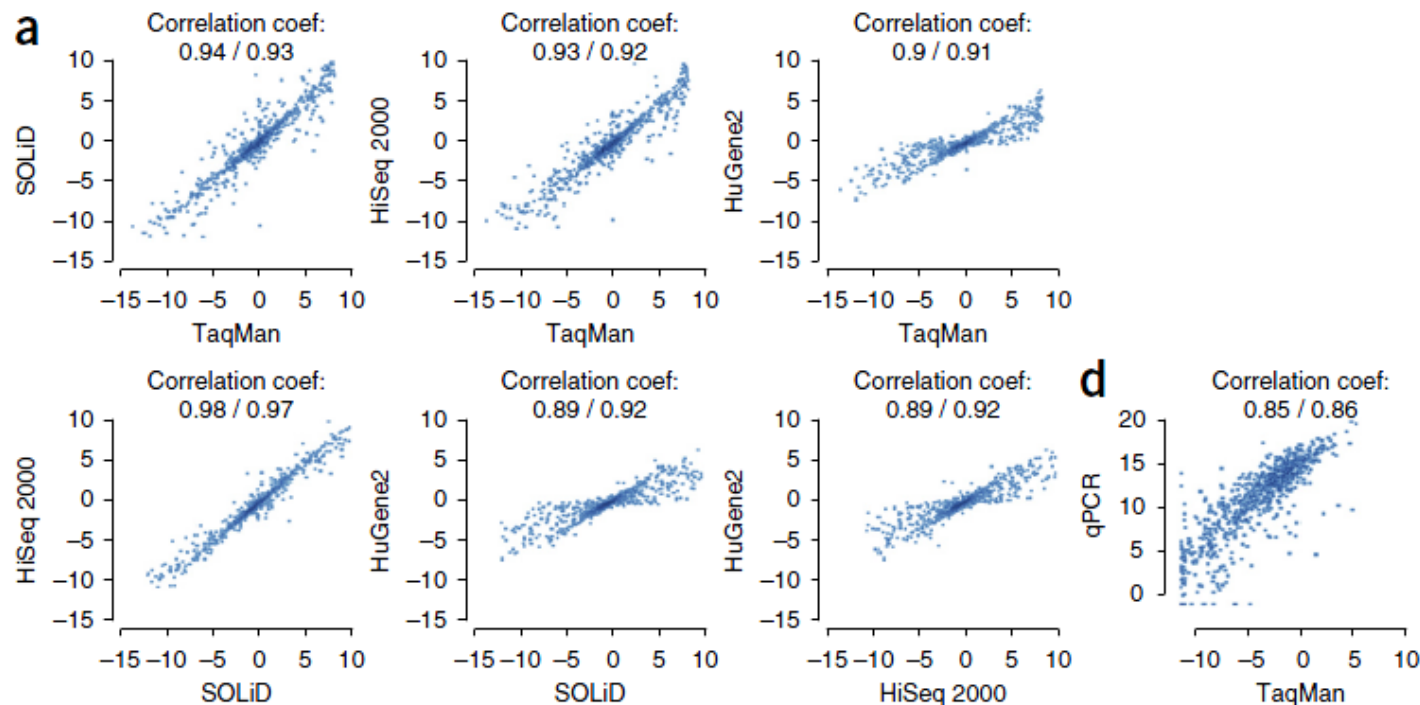
- ❑ mRNA与cDNA碎裂的不同
- ❑ 利用oligo-dT引物得到的cDNA更倾向于获得转录本的3'端
- ❑ RNA碎裂在5'和3'端都较少



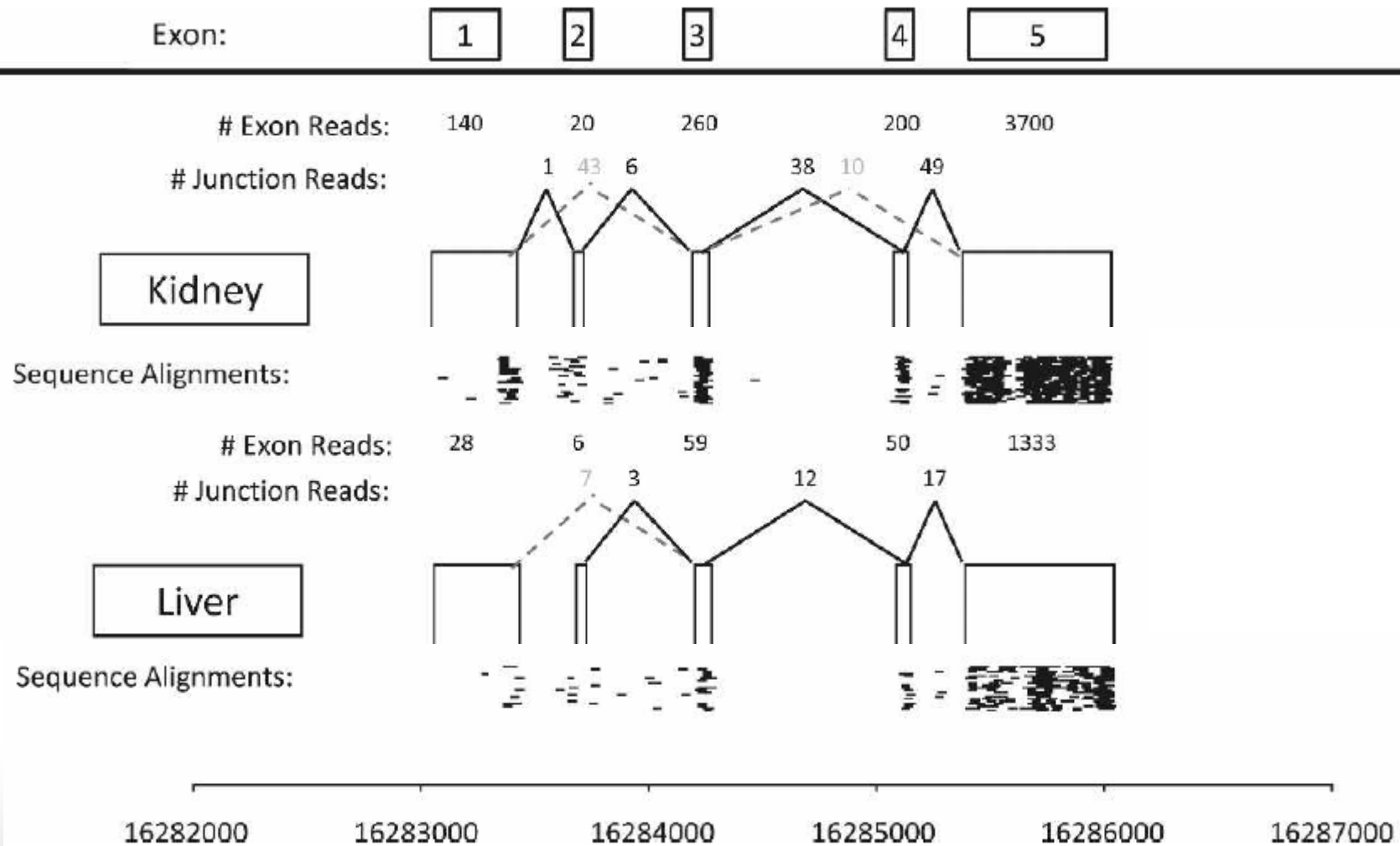
# RNA-Seq的准确性



- ❑ HiSeq 2000和SOLiD测序分析结果
- ❑ HuGene2: Affymetrix芯片数据
- ❑ 利用qPCR (Taqman或PrimePCR) 验证表达水平
- ❑ 不同方法一致性较高



# RNA-Seq数据：基因模型



基因C17orf45 (ENSG00000175061)的结构



# RNA-Seq数据的归一化

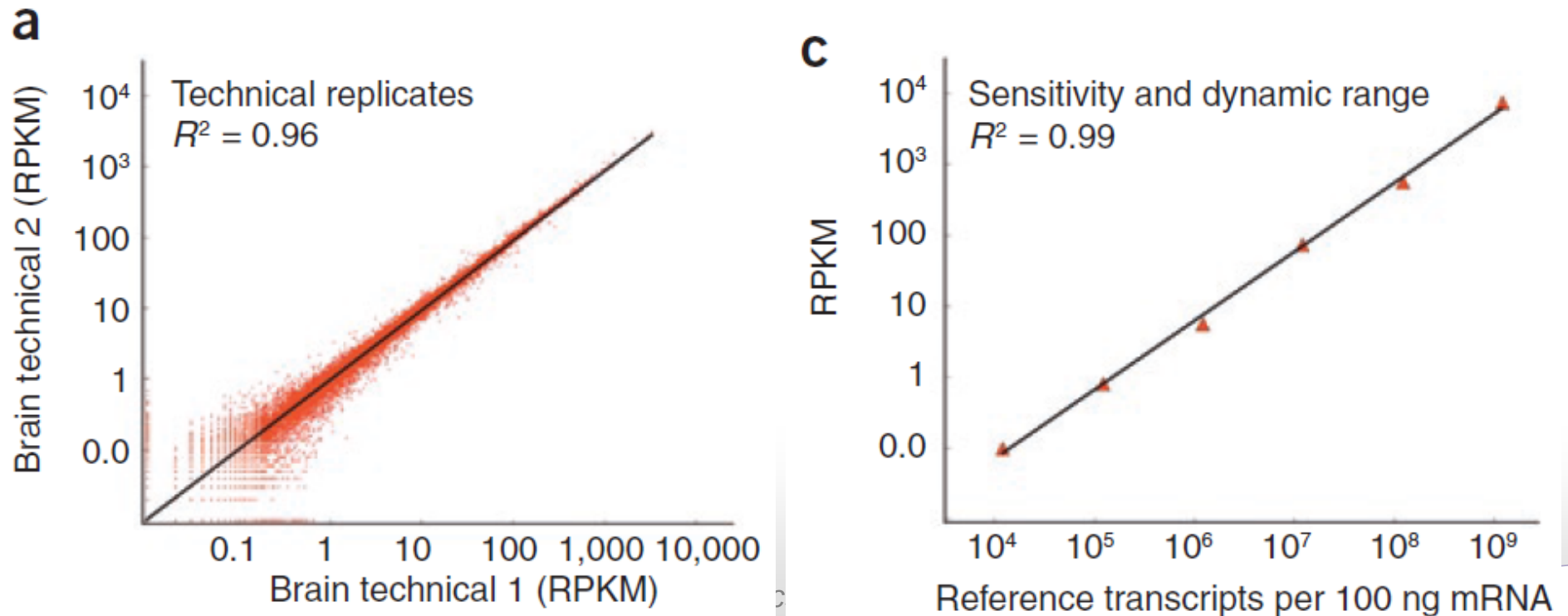
- ❑ 不同样本之间比较：测序深度不同
- ❑ 不同基因之间：表达相同时序列越长读段越多
- ❑ RPKM (The number of reads per kilobase of transcript per million mapped reads)
  - ✿ 每百万可映射读段每千kb的读段数
  - ✿ 例如，测序 $10^7$ 读段， $8 \times 10^6$ 可映射 ( $N$ )
  - ✿ 1kb转录本 ( $L$ )，总共有1000个读段 ( $C$ )
  - ✿  $RPKM = 1000 / (1 * 8) = 125$
- ❑ Multiread (多重定位读段)
  - ✿ 计数时需要除以定位个数

$$R = \frac{10^9 C}{NL}$$

# 归一化的RNA-Seq数据



- ❑ 技术重复的结果一致性较高
- ❑ 体外合成的转录本加入样本中检测
  - ⚙️ RPKM与加入量线性相关

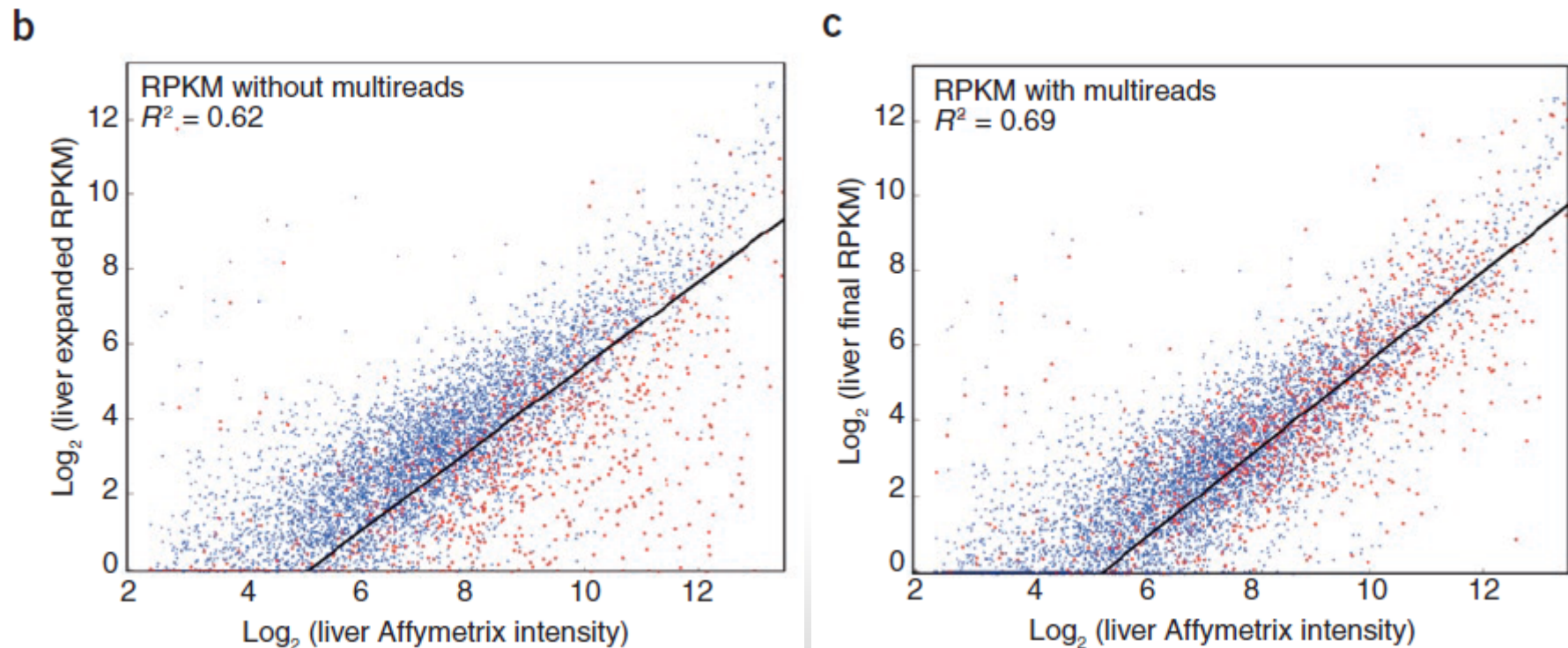


# 多重定位读段



## □ RNA-Seq vs. DNA芯片

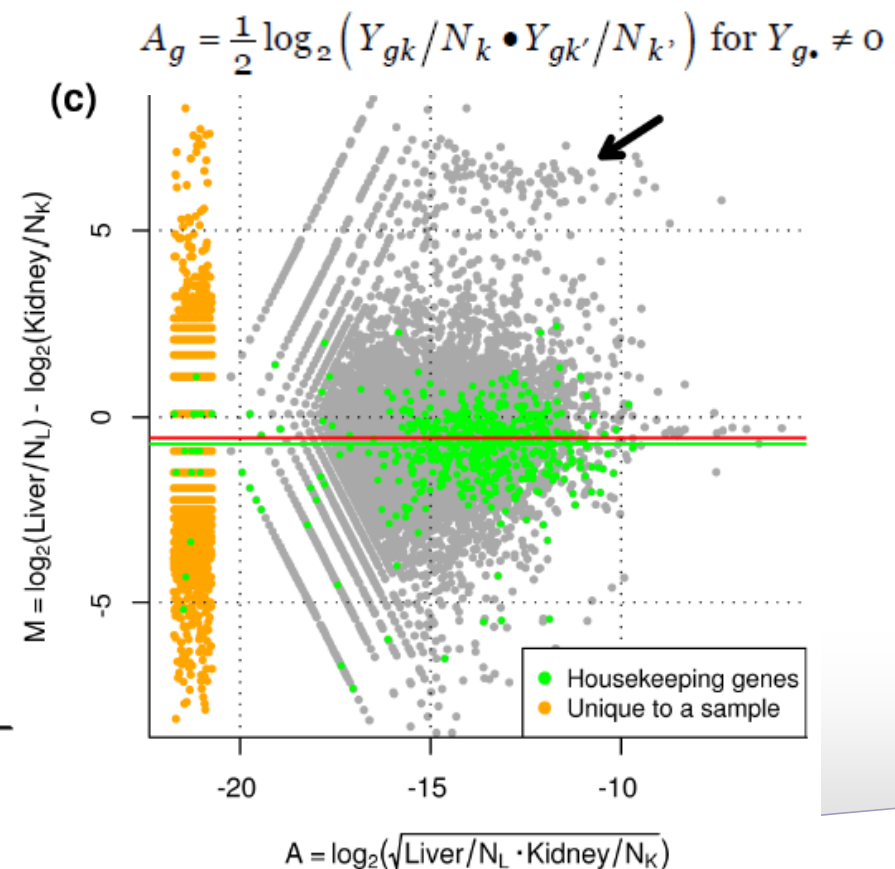
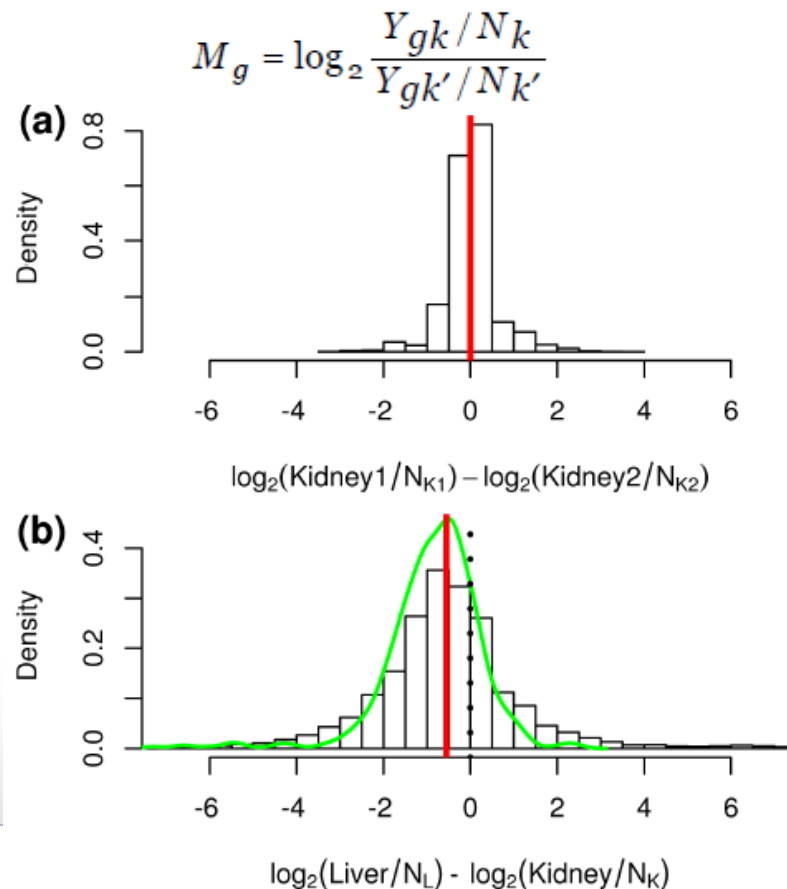
- ✿ 不考虑多重定位读段造成部分基因RPKM值偏低
- ✿ 考虑多重定位读段提高与芯片结果的线性关系





# 归一化：不同样本之间的比较

- 不同样本相同基因的比较不需要考虑长度因素
- $Y_{gk}$ : 基因 $g$ 的读段数目,  $N_k$ : 读段总数





# 差异表达基因分析

## □ Lander-Waterman model

- ✿ 转录本中C个分子，测序获得N个读段
- ✿ 测到某个分子的概率为 $\lambda = N/C$

## □ 截短的 (Truncate) 泊松过程

- ✿ 不知道有多少分子被测0次
- ✿ 读段个数分布在L~R之间

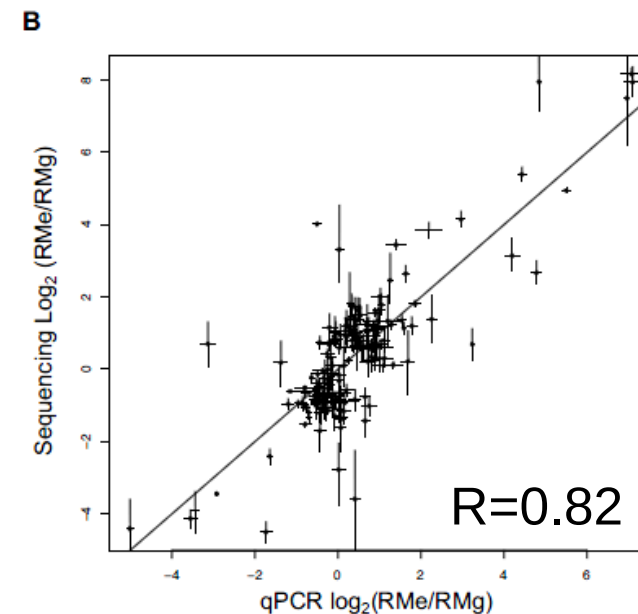
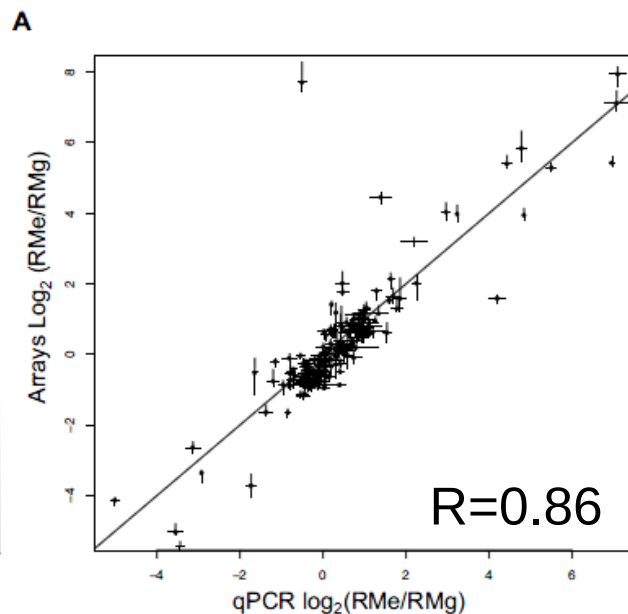
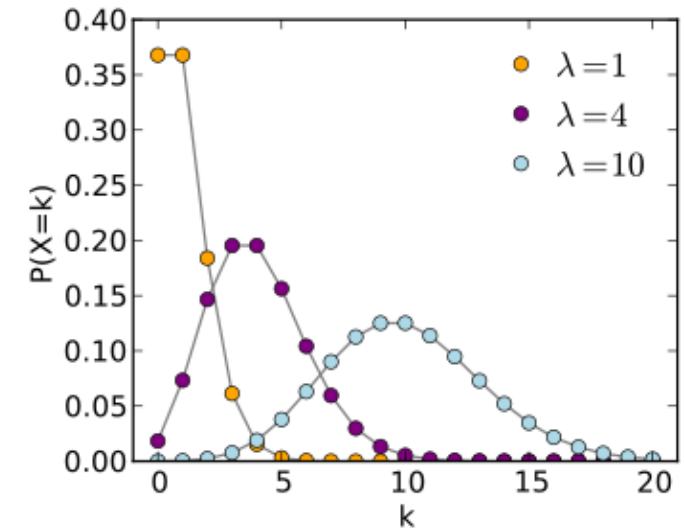
## □ 第*i*个分子测到 $x_i$ 个读段符合泊松分布

- ✿ 
$$\Pr(X_i|\lambda) = \frac{1}{K_{L,R}(\lambda)} \cdot \frac{e^{-\lambda} \lambda^{x_i}}{x_i!}$$

- ✿ 
$$K_{L,R}(\lambda) = \sum_{x=L}^R \Pr(X_i|\lambda) \cong 1 - \text{poisson}(0, \lambda)$$



- ❑  $\lambda < 10$ : 有偏分布
- ❑  $\lambda \sim 10$ : 近似为正态分布
- ❑ 差异表达基因分析
  - ✿ 利用Fisher's exact test
  - ✿ qPCR与芯片结果拟合更好! ?

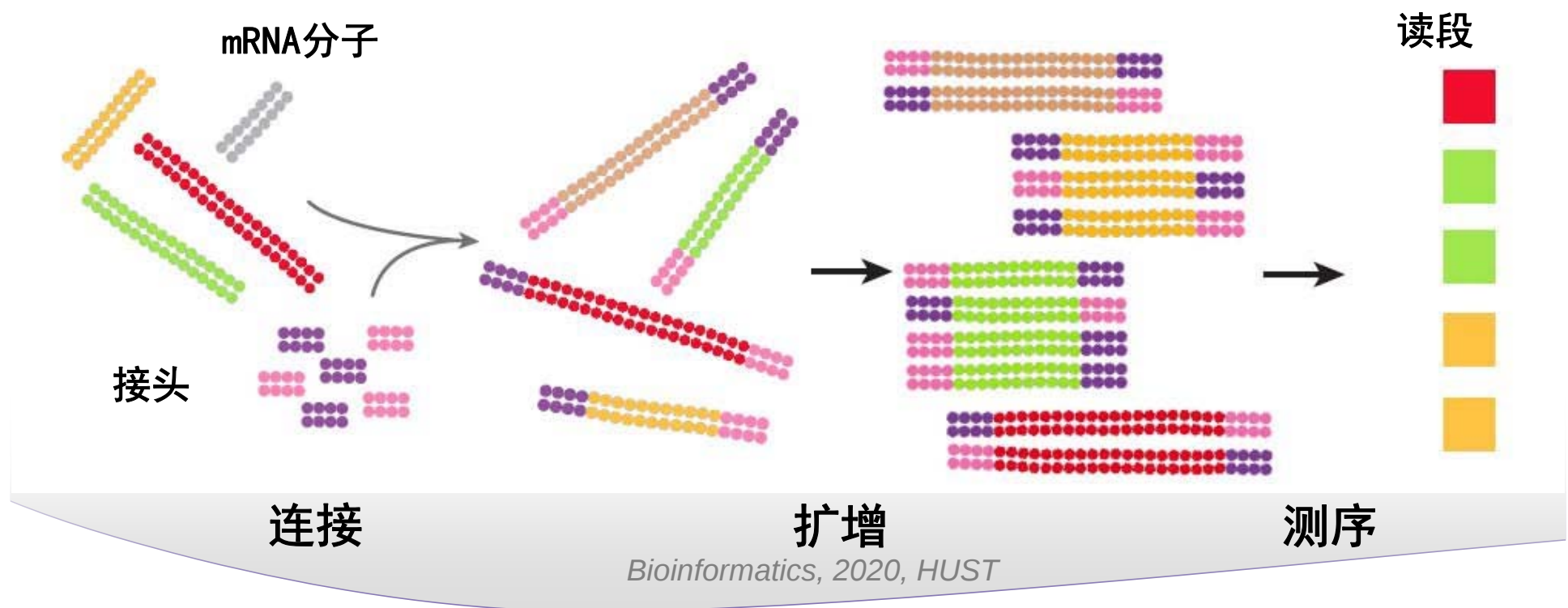


# 二次泊松分布？



## □ TSPM: two-stage Poisson model

- ✿ 测序可以看成是泊松过程
- ✿ 建库也可以近似看成是泊松过程
- ✿ 两者的 $\lambda$ 不同，需要分别估计



# 负二项分布：DESeq



## □ NB: Negative Binomial (Pascal) Distribution

- ✿ 每次试验的成功率 $p$ ，失败率 $1-p$
- ✿ 经历 $r$ 次失败后观察到 $k$ 次成功事件，则

$$f(k; r, p) \equiv \Pr(X = k) = \binom{k+r-1}{k} p^k (1-p)^r \quad \text{for } k = 0, 1, 2, \dots$$

## □ RNA-Seq数据的归一化

- ✿ 总共 $m$ 个样本
- ✿ 基因 $i$ 在样本 $j$ 中检测到 $K_{ij}$ 个读段
- ✿ 样本 $j$ 的采样深度 $s_j$

$$s_j = \underset{i}{\text{median}} \frac{K_{ij}}{\left( \prod_{v=1}^m K_{iv} \right)^{1/m}}$$

# 负二项分布：DESeq



## □ RNA-Seq数据的归一化

- ✿ 总共 $m$ 个样本
- ✿ 基因 $i$ 在样本 $j$ 中检测到 $K_{ij}$ 个读段
- ✿ 样本 $j$ 的采样深度 $s_j$
- ✿ 样本 $j$ 的条件 $p(j)$
- ✿  $q_{ip}$  基因 $i$ 在条件 $p$ 下的平均归一化表达量

$$q_{ip} = \frac{1}{\# \text{ of replicates}} \sum_{j \text{ in replicates}} \frac{K_{ij}}{s_j}$$

$$\mu_{ij} = q_{ip(j)} s_j$$

$$\sigma_{ij}^2 = \mu_{ij} + s_j^2 v_p(q_{ip(j)})$$

用最大似然性估算 (MLE) 获得

$$K_{ij} \sim NB(\mu_{ij}, \sigma_{ij}^2)$$

# DESeq: 差异表达基因分析



## □ 两样本的 $p$ -value计算

✿  $p(a, b) = \Pr(K_{iA} = a) \Pr(K_{iB} = b)$

✿  $K_{iS} = K_{iA} + K_{iB}$

$$p_i = \frac{\sum_{a+b=k_{iS}} p(a, b) \mathbb{I}_{p(a, b) \leq p(k_{iA}, k_{iB})}}{\sum_{a+b=k_{iS}} p(a, b)}.$$

Anders and Huber *Genome Biology* 2010, 11:R106  
<http://genomebiology.com/2010/11/10/R106>



METHOD

Open Access

## Differential expression analysis for sequence count data

Simon Anders\*, Wolfgang Huber

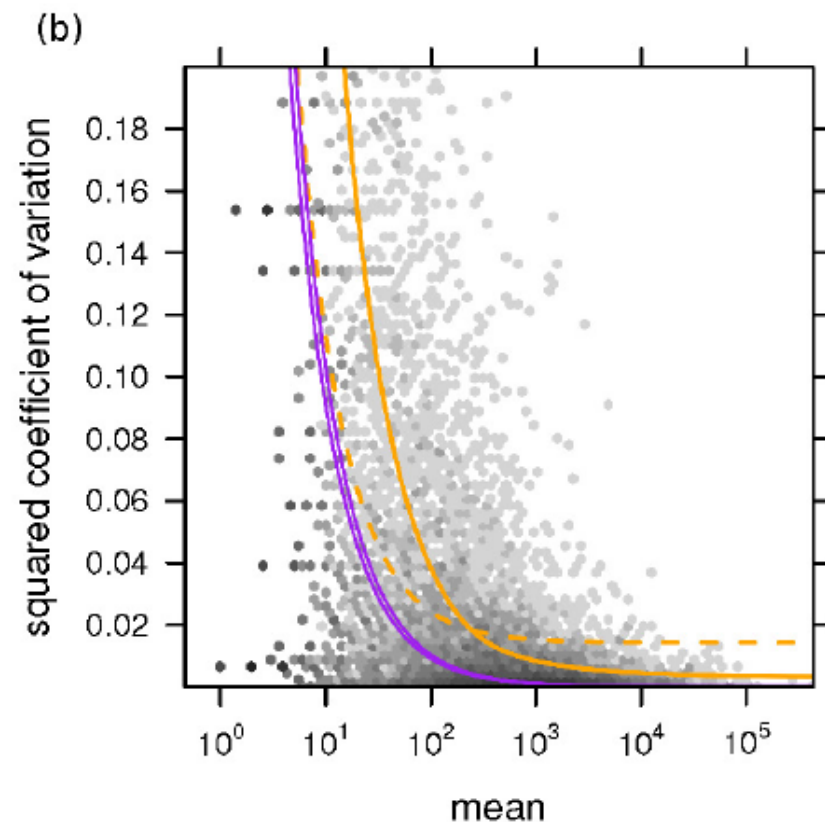
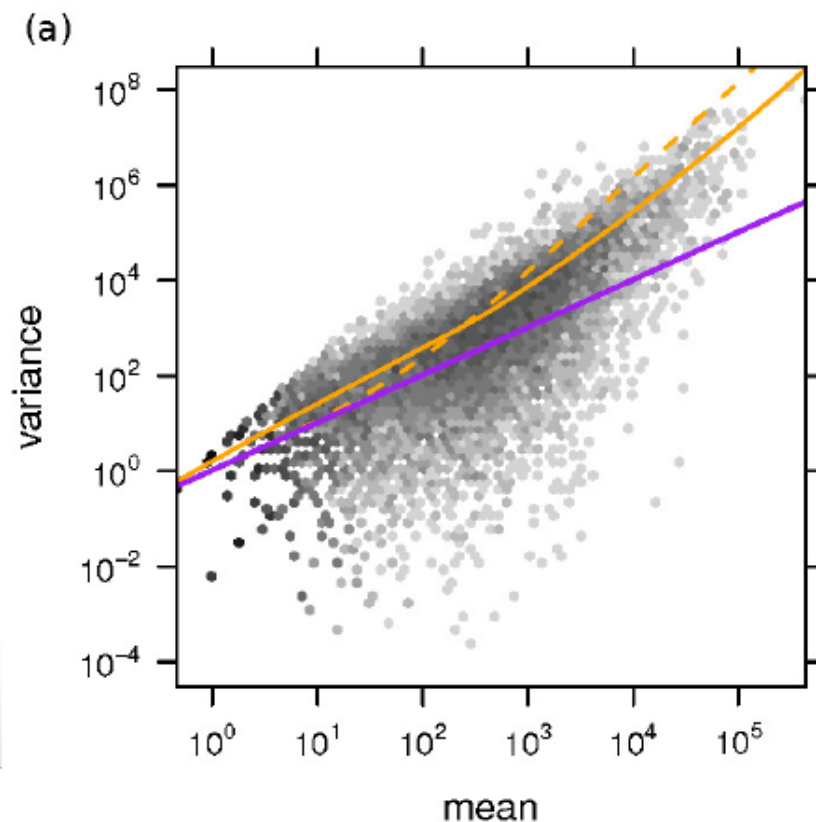
Bioinformatics, 2020, ROST

# 负二项分布 vs. 泊松分布



□ DESeq (橙), EdgeR (橙虚线), 泊松 (紫)

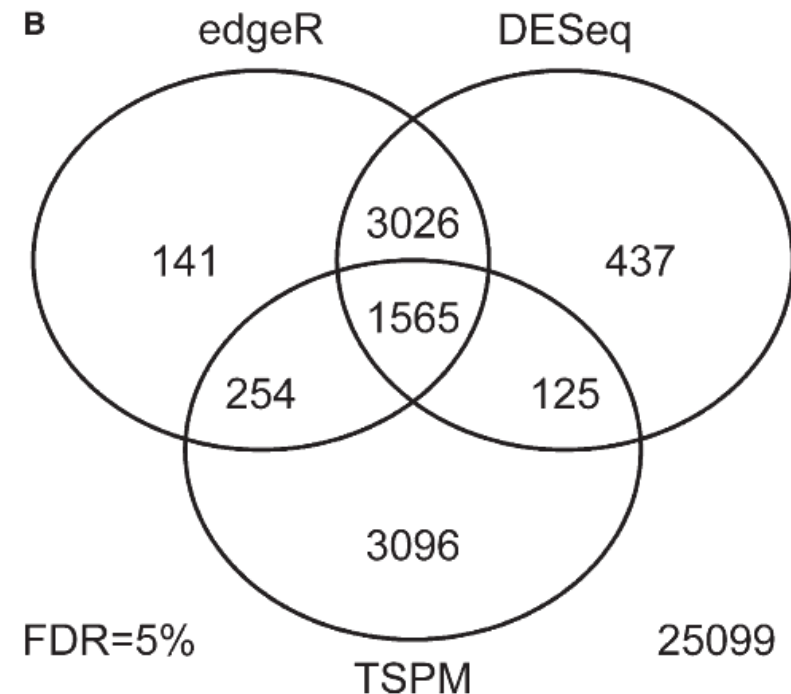
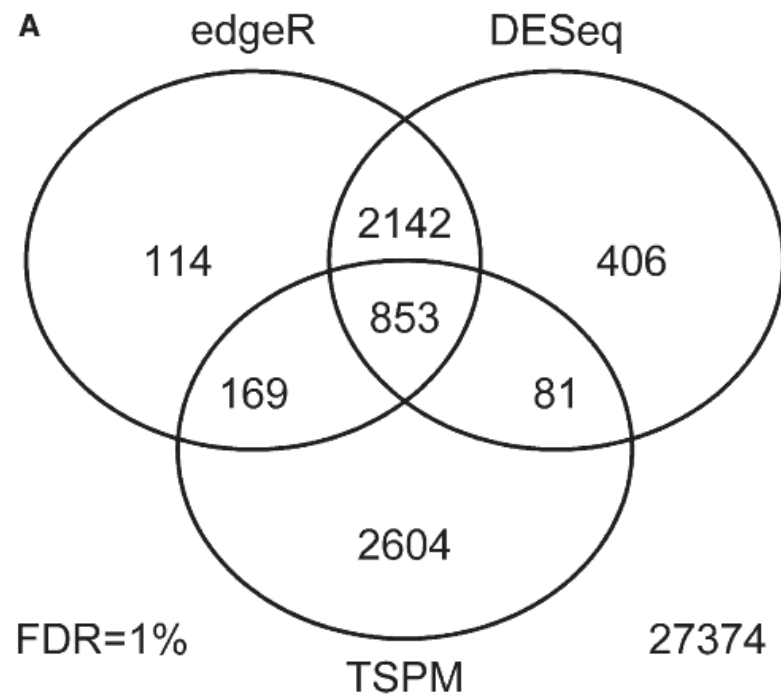
⚙ NB估算的方差更大



# 负二项分布 vs. 二次泊松分布



- DESeq和EdgeR的重合较高：NB分布
- TSPM (二次泊松) 与其他工具重合较低



# RNA-Seq差异表达基因分析工具



## ❑ 目前最好：DESeq和EdgeR

⚙ DESeq: <http://bioconductor.org/packages/release/bioc/html/DESeq.html>

⚙ EdgeR: <http://bioconductor.org/packages/release/bioc/html/edgeR.html>

## ❑ R语言 + Bioconductor实现

**Table 1 A comparison of common statistical methods for RNA-Seq differential gene expression analysis**

| Method                  | Underlying distribution | Recommended with biological replicates | Multi-group comparison | R/Bioconductor package | Reference |
|-------------------------|-------------------------|----------------------------------------|------------------------|------------------------|-----------|
| Fisher's exact Test     | Poisson                 | No                                     | No                     | No                     | [27]      |
| Likelihood ratio test   | Poisson                 | No                                     | Yes                    | No                     | [21]      |
| edgeR                   | Negative Binomial       | Yes                                    | Yes                    | Yes                    | [28]      |
| DESeq                   | Negative Binomial       | Yes                                    | No                     | Yes                    | [15]      |
| baySeq                  | Negative Binomial       | Yes                                    | Yes                    | Yes                    | [17]      |
| BBSeq                   | Beta-Binomial           | Yes                                    | No                     | Yes                    | [29]      |
| Two-stage poisson model | Poisson                 | Yes                                    | Yes                    | No                     | [30]      |

# 可变剪切

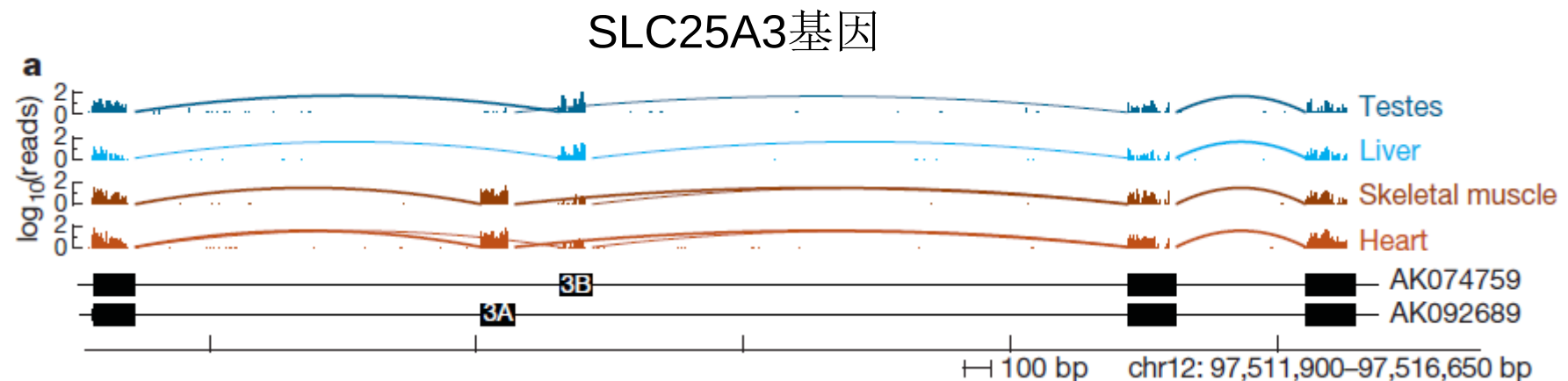


## □ AS, Alternatively Splicing

✿ 92–94%的人类多外显子基因存在可变剪切现象

## □ Major isoform vs. minor isoform

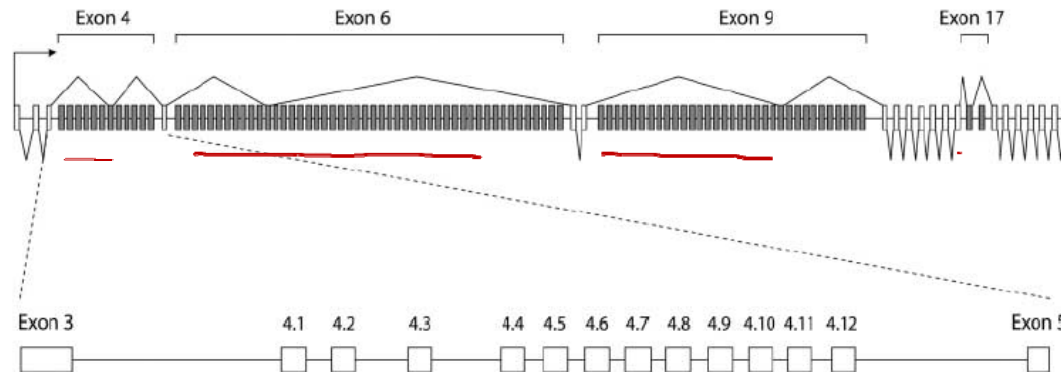
## □ 86%包括至少有一个次要异构体 (比例15%)



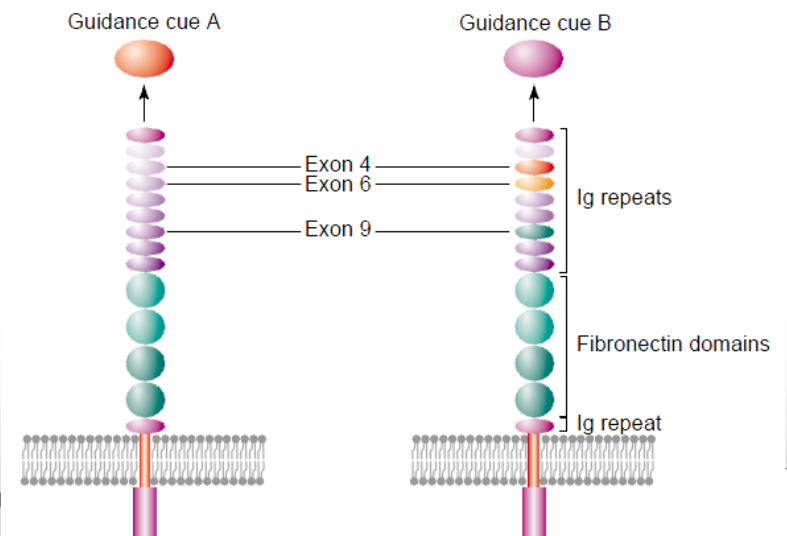
# 果蝇Dscam基因的可变剪切



□  $12 \times 48 \times 33 \times 2 = 38,016$  个不同的异构体



- 果蝇: ~250,000个神经元
- 轴突导向 (Axon guidance)
- 调控神经发育
  - ✿ 神经元之间的连接





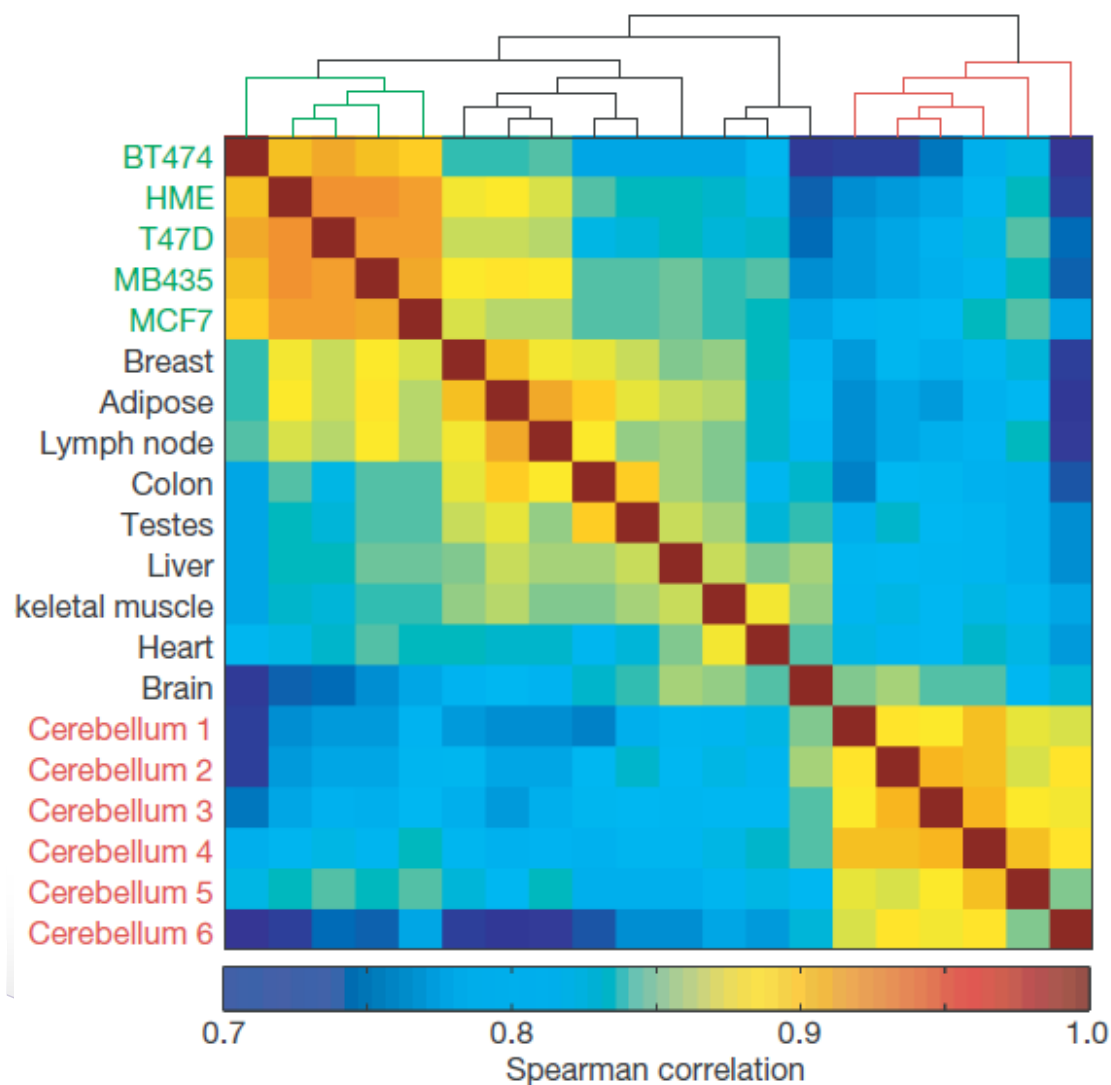
# 可变剪切的类型

- 8种类型
- 仅统计外显子上的读段数 – 不全面

| Alternative transcript events     |  | Total events ( $\times 10^3$ ) | Number detected ( $\times 10^3$ ) | 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                             |
| Total                             |  | 105                            | 100                               | 37,782                 | 22,657                  | 60                            | 68                             |

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

# 可变剪切的组织特异性

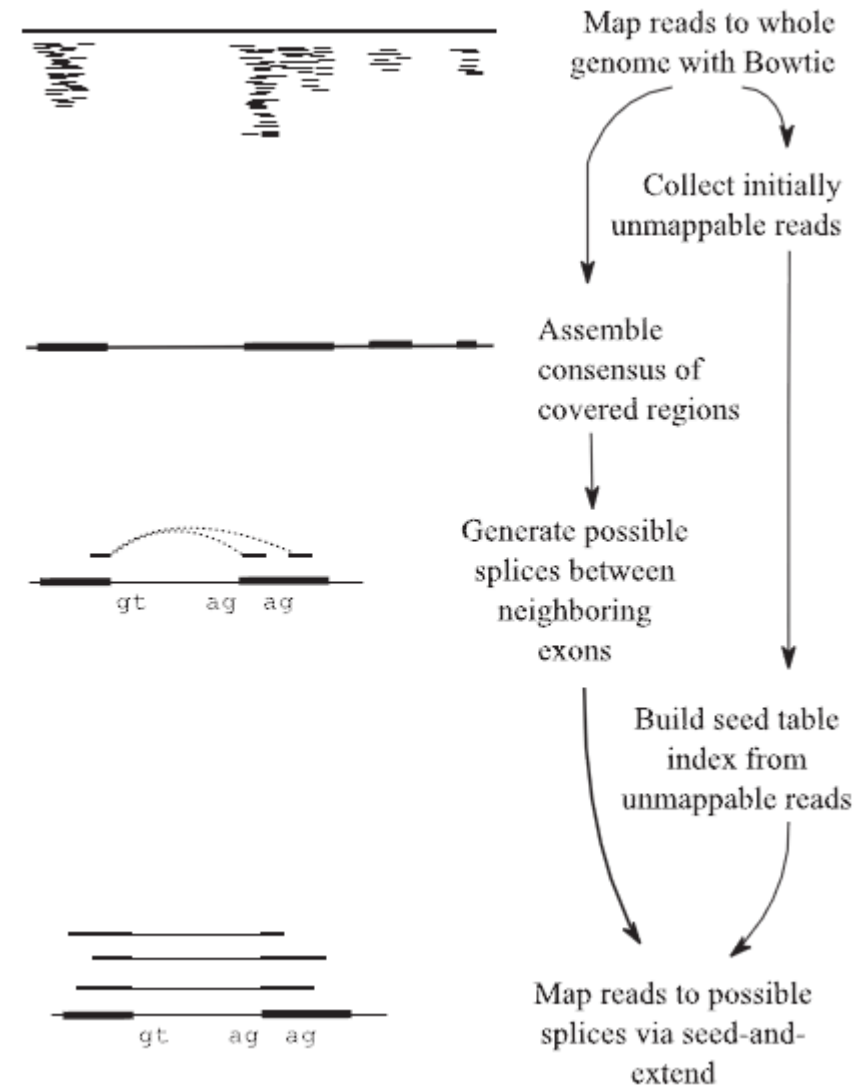


- 脑的可变剪切特异性最高
- 不同个体之间存在差异
- 细胞系有特别的剪切模式

# 可变剪切鉴定: Cufflinks



- ❑ 用Bowtie (领带) 将所有读段映射到基因组上
- ❑ 不能完美匹配的, 用TopHat (礼帽) 发现剪切位点

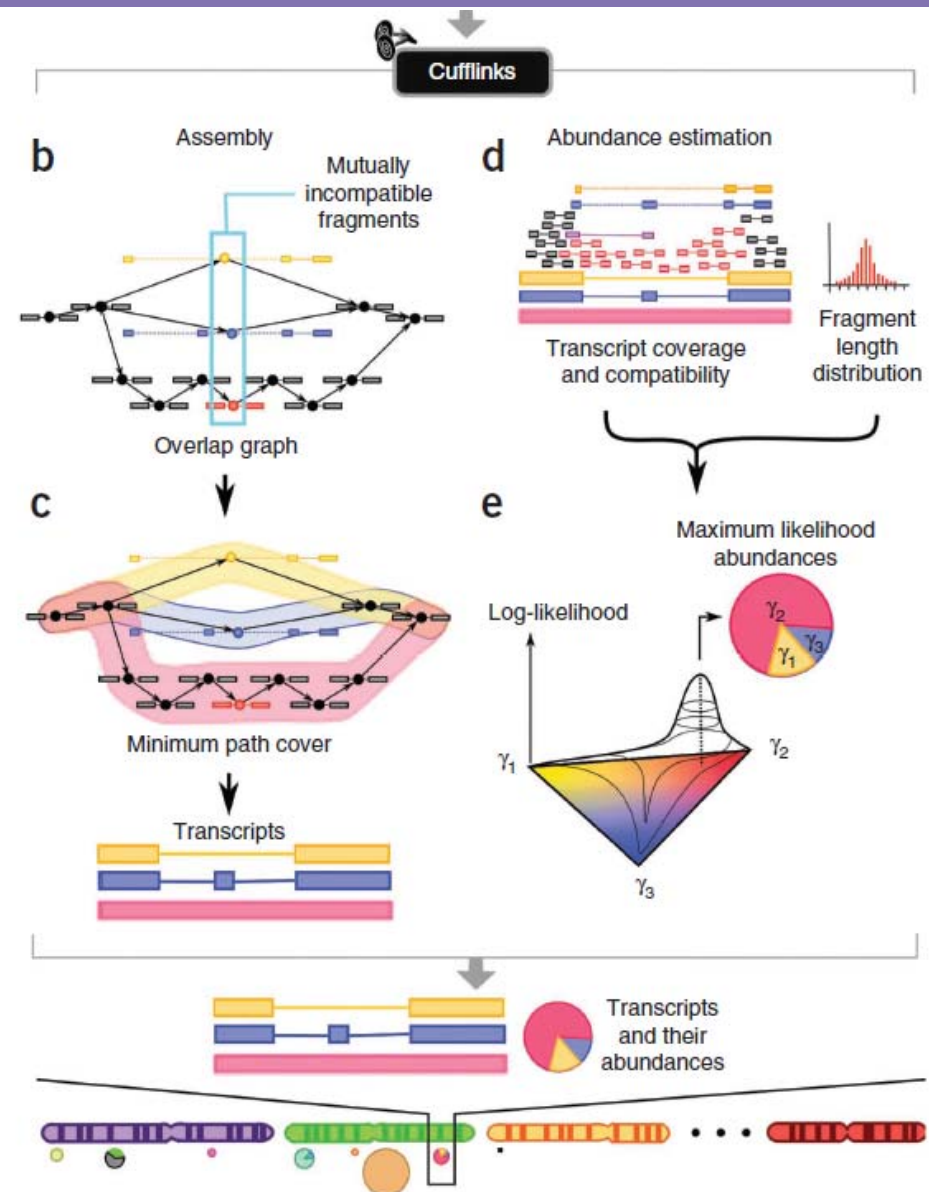


<http://cole-trapnell-lab.github.io/cufflinks/>

# 可变剪切鉴定: Cufflinks



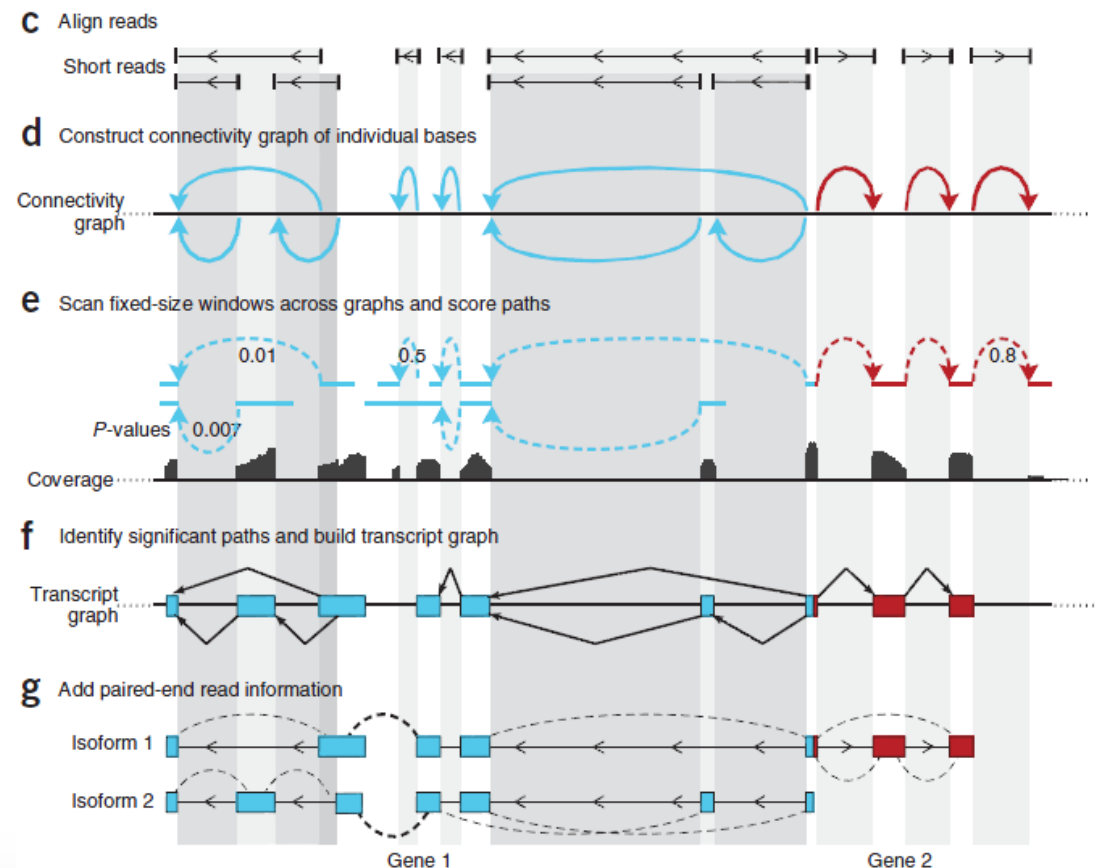
- ❑ OLC算法 (Overlap graph)
- ❑ 读段是图中的结点,
- ❑ 若可以匹配则置边
- ❑ 用OLC算法计算多条路径
- ❑ 用最大似然性方法估算每个异构体的表达水平



# 可变剪切鉴定: Scripture



- ❑ DBG算法  
(Connectivity graph)
- ❑ 单个碱基是结点，边是两个读段共有的序列
- ❑ 用DBG算法算出多个路径
- ❑ Cuffdiff: 利用双端测序数据校正不同异构体的比例
- ❑ RPKM归一化表达



<http://www.broadinstitute.org/software/scripture/>

# 常用的RNA-Seq分析软件



**Table 2** | List of publicly available RNA-seq software packages discussed in this review

|                 | Primary category                     | Discovery | Need genomic assembly             | Associated read mapper  | Splice junctions                                  | Quantitation                                    | Reference |
|-----------------|--------------------------------------|-----------|-----------------------------------|-------------------------|---------------------------------------------------|-------------------------------------------------|-----------|
| ABYSS v1.0.11   | Short-read assembler                 | Yes       | No                                | NA                      | Assembled                                         | Read coverage                                   | 33        |
| BASIS V1        | Existing transcript quantitation     | No        | Yes                               | External                | From existing models                              | Read coverage                                   | 41        |
| ERANGE v3.1     | Existing and novel gene quantitation | Yes       | Yes                               | Blat<br>Bowtie<br>Eland | From existing models<br>Novel with blat           | RPKM from gene annotations and novel transfrags | 18        |
| G-Mo.R-Se v1.0  | Novel gene model annotation          | Yes       | Yes                               | SOAP                    | Predicted from transfrags                         | No                                              | 37        |
| QPALMA v0.9.9.2 | Spliced read mapper                  | Yes       | Yes                               | Integrated              | Predicted from transfrags                         | No                                              | 38        |
| RNA-mate v1.1   | Existing and novel gene quantitation | Yes       | Yes                               | Map reads               | From existing models                              | Deprecated in v1.1                              | 36        |
| RSAT v0.0.3     | Existing transcript quantitation     | No        | No; requires transcript sequences | Eland, SeqMap (bundled) | From supplied transcript sequences                | RPKM from transcript sequences                  | 40        |
| TopHat v1.0.10  | Existing and novel gene quantitation | Yes       | Yes                               | Bowtie                  | Predicted from transfrags<br>From existing models | RPKM from supplied annotations                  | 32        |
| Velvet v0.7.47  | Short read assembler                 | Yes       | No                                | NA                      | Assembled                                         | Fold coverage                                   | 31        |

NA, short-read assemblers do not rely on any particular annotated read mapper to assemble the transcripts.

# 表观遗传学 (Epigenetics)



Dolly

Ian Wilmut



多莉：生于1996年7月5日，死于2003年2月14日

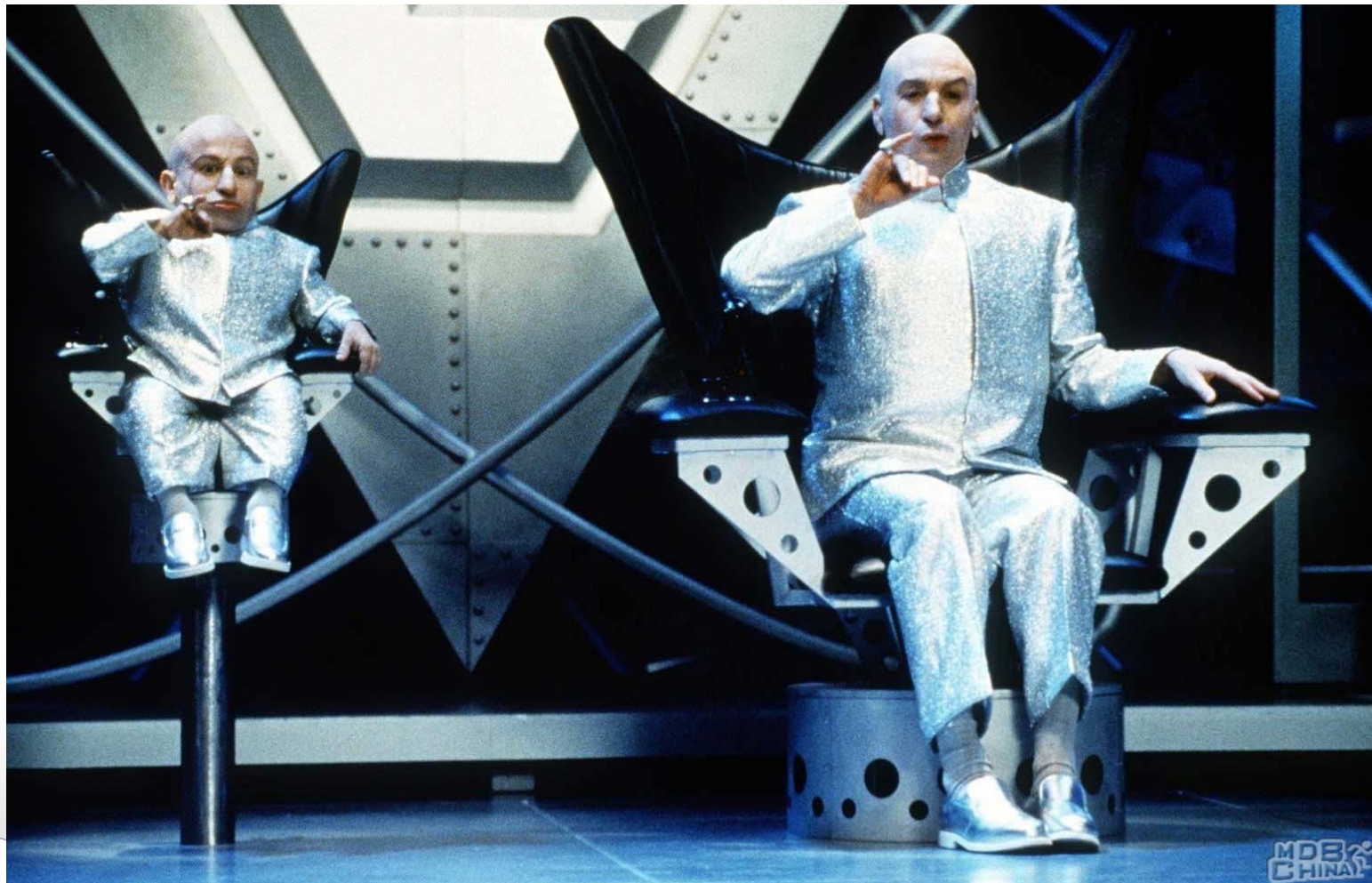
*Bioinformatics, 2020, HUST*

# Dr. Evil



**Dr. Evil's Clone  
"Mini Me"**

**Dr. Evil**

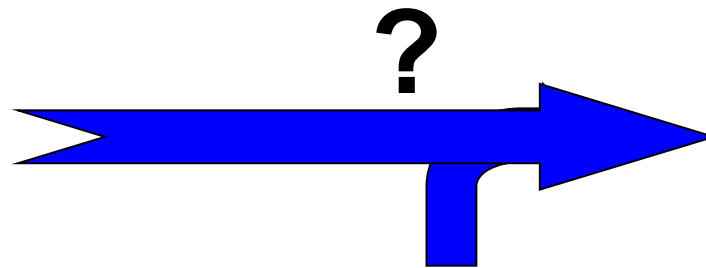


# The calico cat



Rainbow

College of Veterinary Medicine, Texas A&M Univ.



Allie



Copy Cat

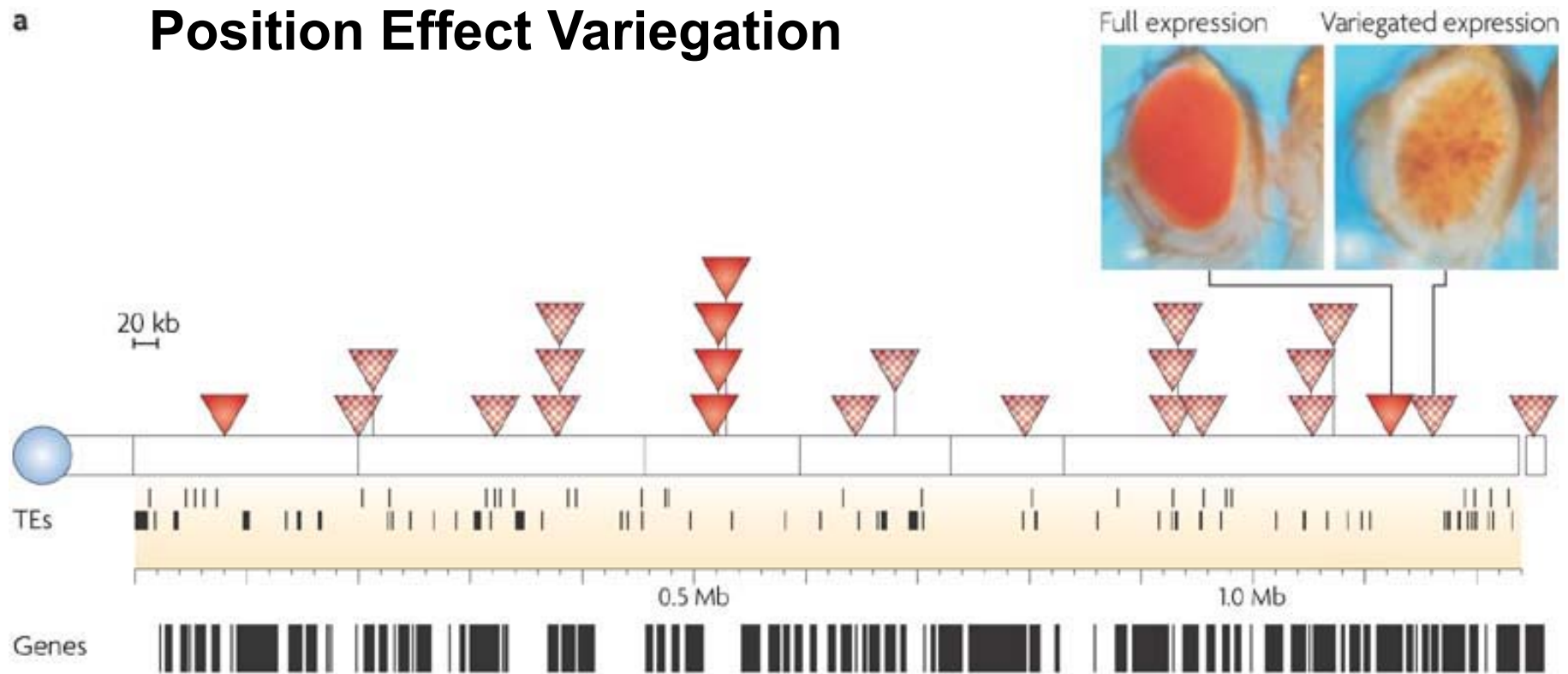


College of Veterinary Medicine, Texas A&M Univ.

# PEV: 位置效应斑



## a Position Effect Variegation



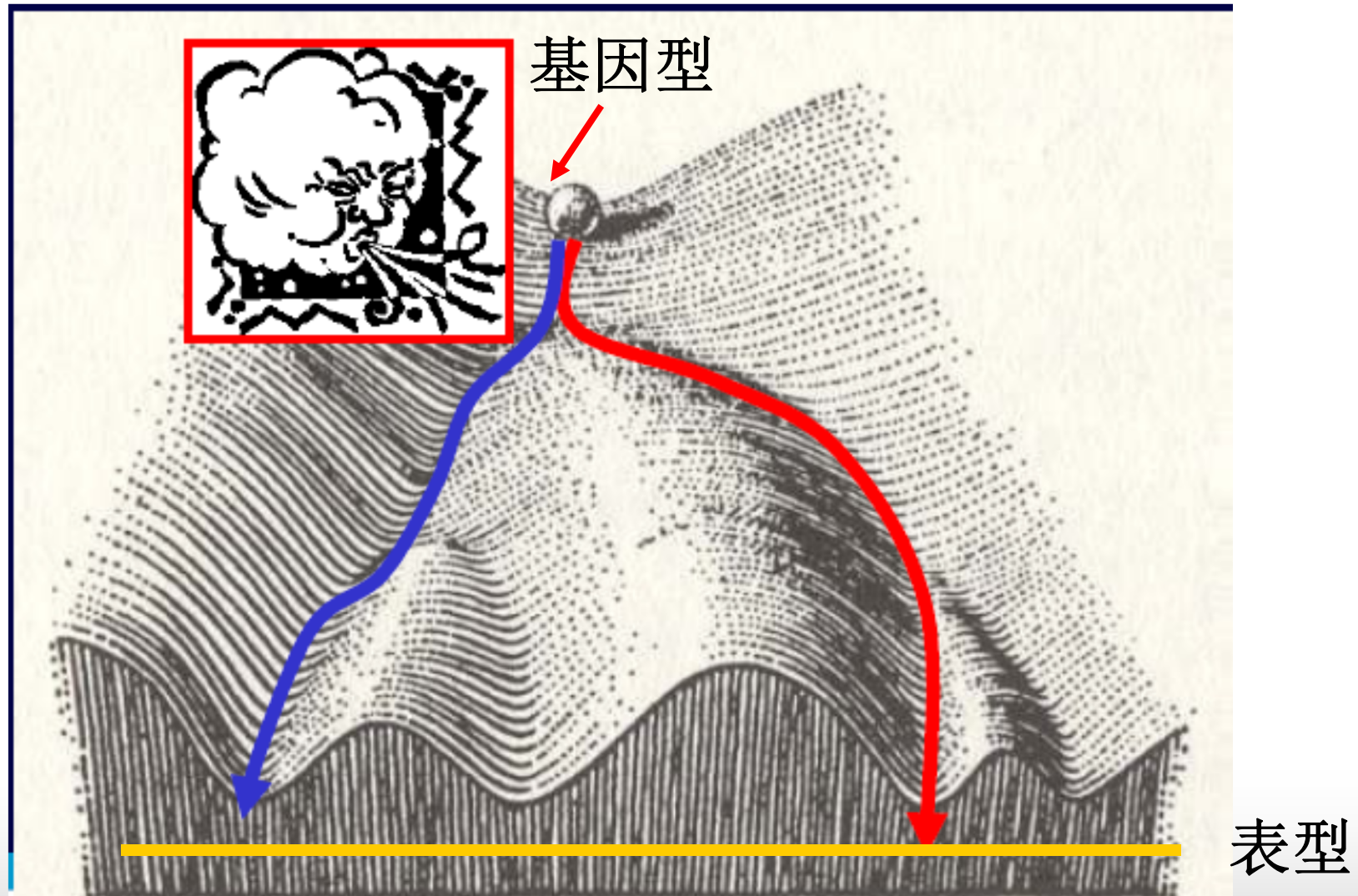
□ white 基因 vs. 转座子

# 表观遗传学



- ❑ 基因的DNA序列不发生改变的情况下，基因的表达水平与功能发生改变，并产生可遗传的表型
- ❑ 特征: (1)可遗传；(2) 可逆性；(3) DNA不变
- ❑ 表观遗传学机制：
  - ✿ DNA甲基化
  - ✿ 组蛋白修饰
  - ✿ MicroRNA
  - ✿ 染色质重塑
  - ✿ ...

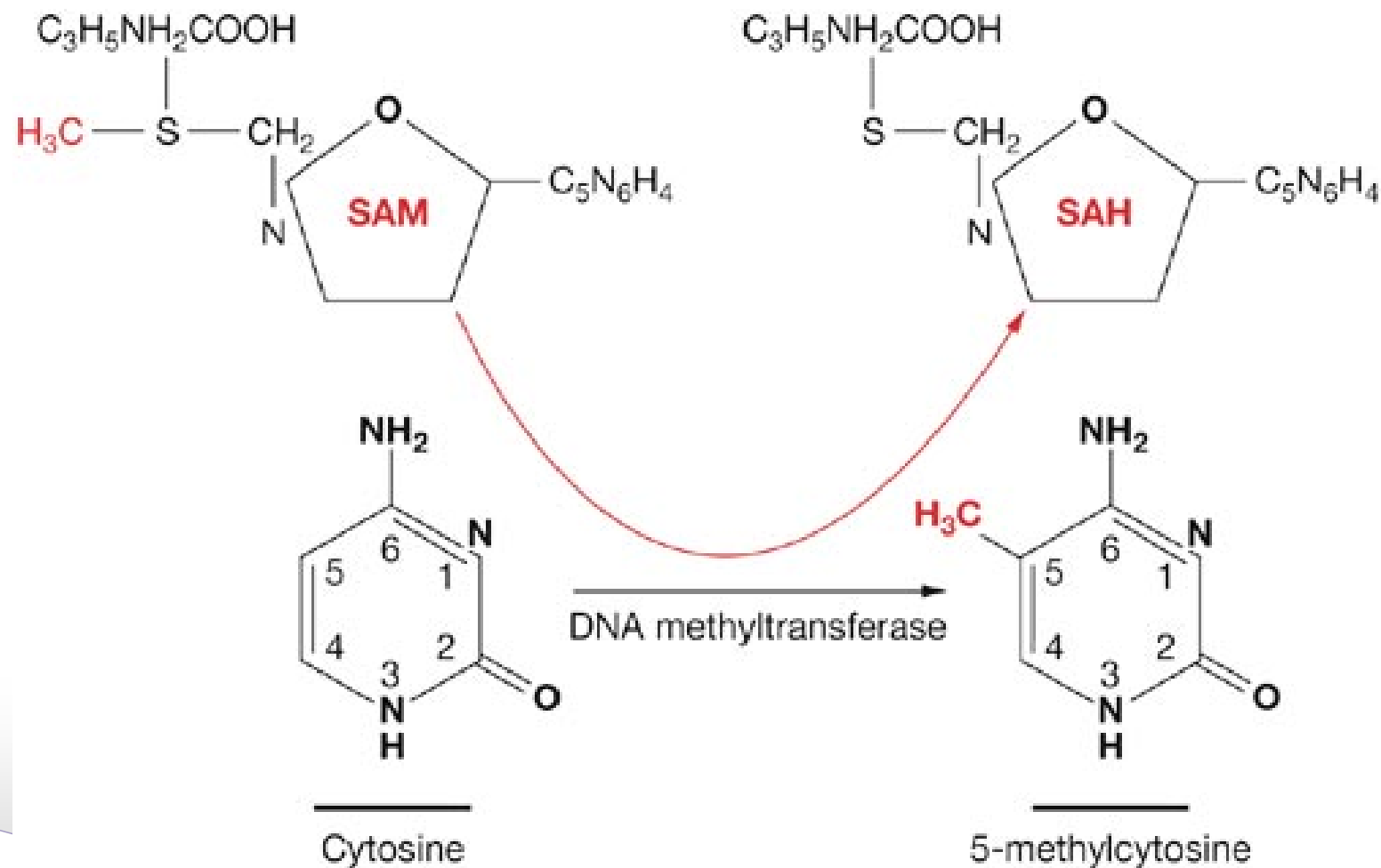
# Waddington's epigenetics



# DNA甲基化



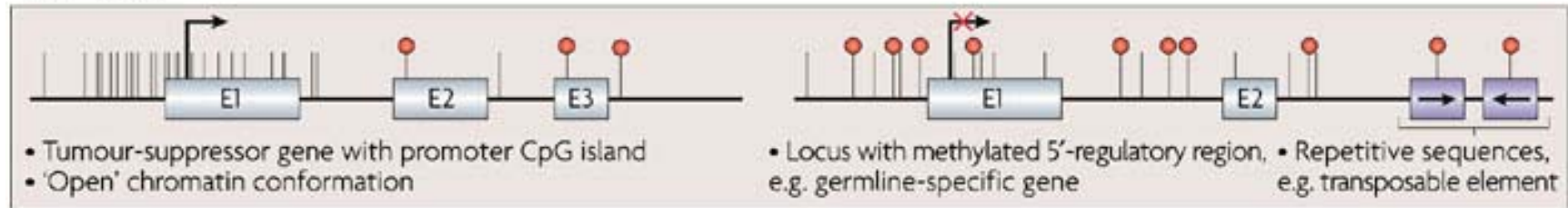
SAH, S-adenosylhomocysteine; SAM, S-adenosylmethionine



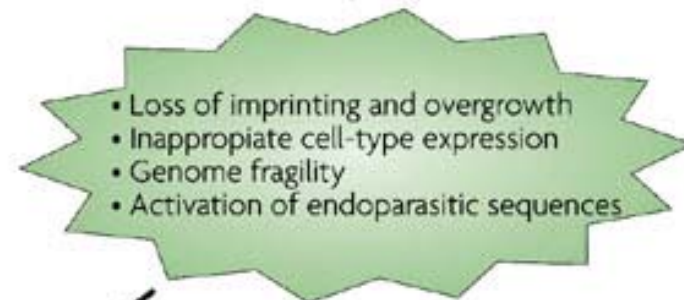
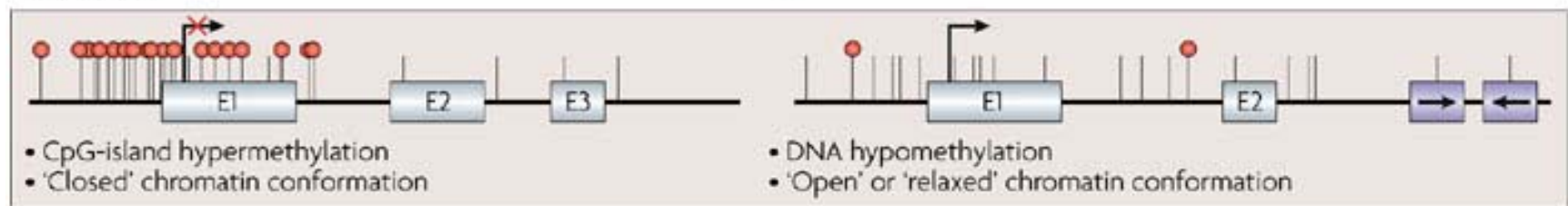
# DNA甲基化



## Normal cell



## Cancer cell



Tumorigenesis

| Unmethylated CpG    • Methylated CpG

# 叶酸：很重要？



Google

叶酸

Google 搜索

高级搜索 | 使用偏好

☒ 所有网页 ☐ 中文网页 ☐ 简体中文网页 ☐ 中国的网页

网页

约有2,460,000项符合叶酸的查询结果，以下是第1-

## 叶酸 百度百科

**叶酸**（Folic acid）维生素B复合体之一，相当于蝶酰谷氨酸（pteroylglutamic acid，PGA）。是米切尔（H. K. Mitchell，1941）从菠菜叶中提取纯化的，而命名为**叶酸**。 ...

[baike.baidu.com/view/8114.htm](http://baike.baidu.com/view/8114.htm) - 41k - [网页快照](#) - [类似网页](#)

## 孕期如何补充叶酸

**叶酸**，是一种B族维生素，也叫做B9。你的身体需要用它来生成红细胞、去甲肾上腺素和色拉托宁（神经系统的化学成分）。**叶酸**协助合成DNA（身体的遗传物质），维持大脑的 ...

[cn.babycenter.com/pregnancy/nutrition/folicacid/](http://cn.babycenter.com/pregnancy/nutrition/folicacid/) - 38k - [网页快照](#) - [类似网页](#)

## 孕妇不要过量服用叶酸

2007年1月21日 ... 据英国报道，新的研究显示，妇女在怀孕期间大剂量服用**叶酸**，今后患乳腺癌的概率可能增加。这一发现对妇女怀孕期间广泛服用的维生素的安全性带来疑问。 ...

[news.xinhuanet.com/health/2007-01/21/content\\_5631511.htm](http://news.xinhuanet.com/health/2007-01/21/content_5631511.htm) - 70k - [网页快照](#) - [类似网页](#)

## 巧补叶酸宝宝聪明 新华网

2008年5月22日 ... 近日，一五七医院妇产科郭会平主任接受记者采访时指出——怀孕之后补充**叶酸**对预防胎儿畸形作用不大，要防胎儿神经管畸形最佳补充**叶酸**的时间应该是怀孕 ...

[news.xinhuanet.com/lady/2008-05/22/content\\_8211613.htm](http://news.xinhuanet.com/lady/2008-05/22/content_8211613.htm) - 22k - [网页快照](#) - [类似网页](#)

## 孕期营养明星之叶酸访谈-搜狐母婴

主持人：各位，今天邀请的嘉宾是孕期营养明星——**叶酸**！**叶酸**，你好！**叶酸**：主持人好，大家好！主持人：**叶酸**，昨天看你就像一汪水，今天怎么又变成片剂了？ ...

[baobao.sohu.com/20070412/n249381255.shtml](http://baobao.sohu.com/20070412/n249381255.shtml) - 107k - [网页快照](#) - [类似网页](#)

## 孕妈咪，叶酸虽小别忘补 健康中心 新浪宝贝 新浪网

别看**叶酸**在人体内来起来似乎不太起眼，可它却是蛋白质和核酸合成的必需因子，血红蛋白、红细胞、白细胞快速增生、氨基酸代谢、大脑中长链脂肪酸如DNA的代谢等都少不了 ...

[baby.sina.com.cn/health/2004-09-30/47\\_65377.shtml](http://baby.sina.com.cn/health/2004-09-30/47_65377.shtml) - 62k - [网页快照](#) - [类似网页](#)

**主持人**：最近，我看了一篇关于你的报道，说是：成年妇女每天需摄入50—100微克，而**妊娠**期妇女上升为300—400毫克。如果孕妇体内缺乏叶酸的话，会导致**胎儿**脊柱裂、脑脊膜膨出等神经管畸形，甚至产下“无脑儿”，也会造成**流产**。缺乏叶酸，除了会造成先天畸形儿外，还会给孕妇带来危险。孕妇将会出现**贫血**症状，严重时还会导致**贫血性心脏病**、**妊娠**期高血压病、胎盘早剥、**早产**和**产褥感染**等。

**叶酸**：是的。卫生部曾经对全国12万多名围产儿进行调查，结果无脑儿、开放性脊柱裂、脑脊膜膨出等神经管畸形，分别居于出生缺陷的第一、三、九位！这些都是因为我叶酸的缺乏而造成的。

# DNA甲基化 vs. 转座子

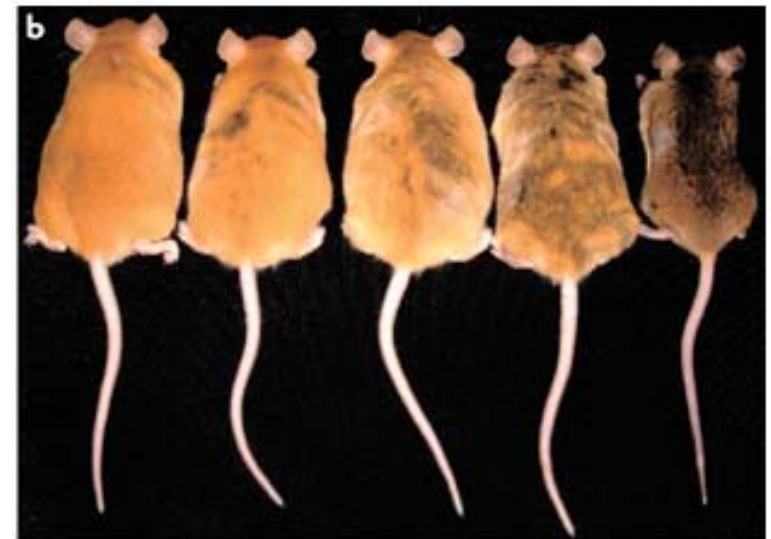
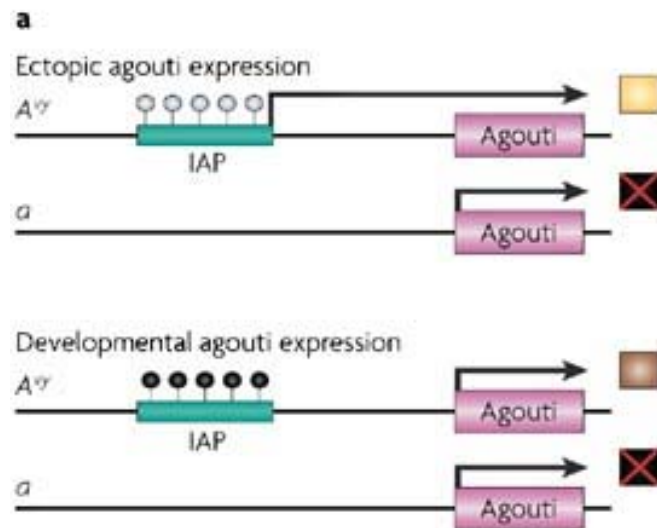


❑ 叶酸：很重要

❑ IAP: intracisternal A particle

⚙ 非甲基化：异常表达Agouti

⚙ 甲基化：正常表达

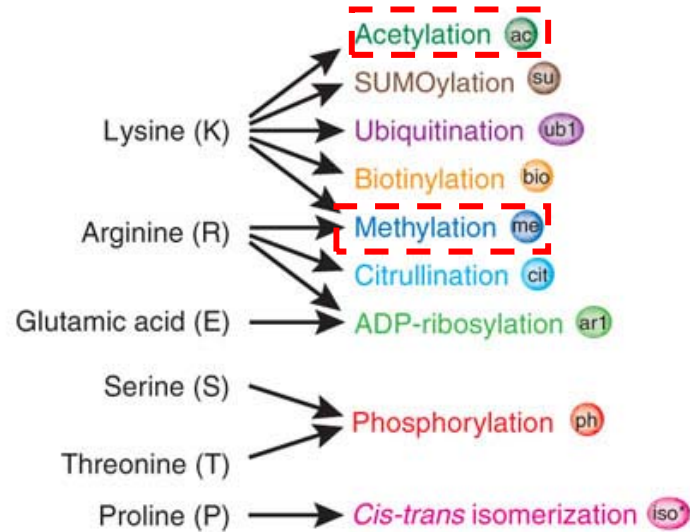


Nature Reviews | Genetics

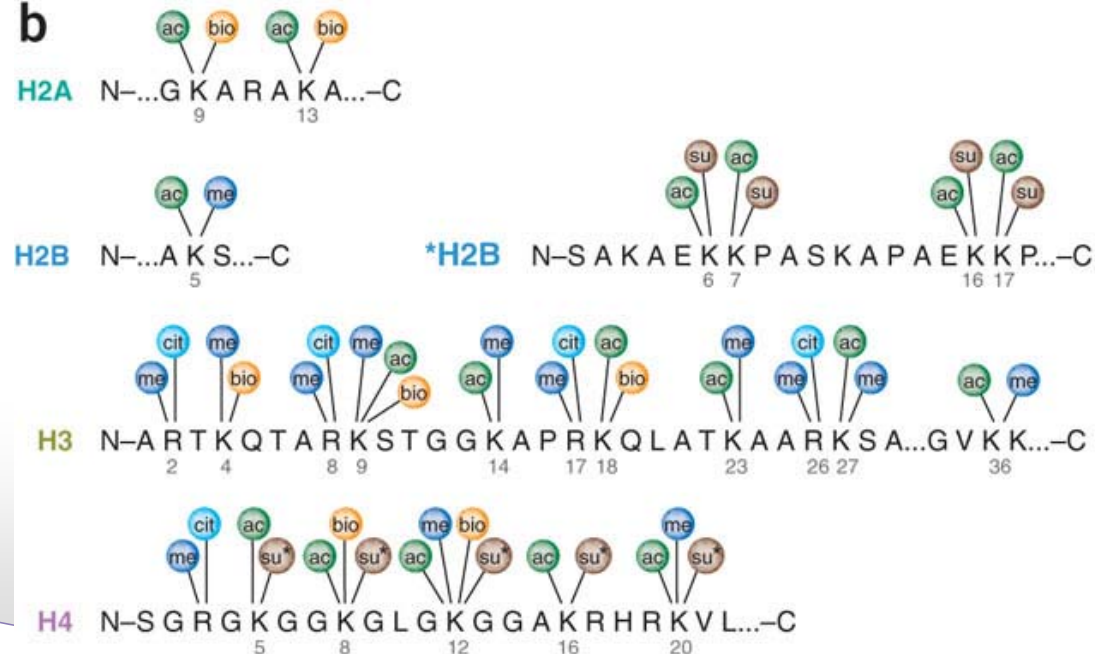
# 组蛋白的共价修饰



a



b



Katie Ris-Vicari

# Paramutation



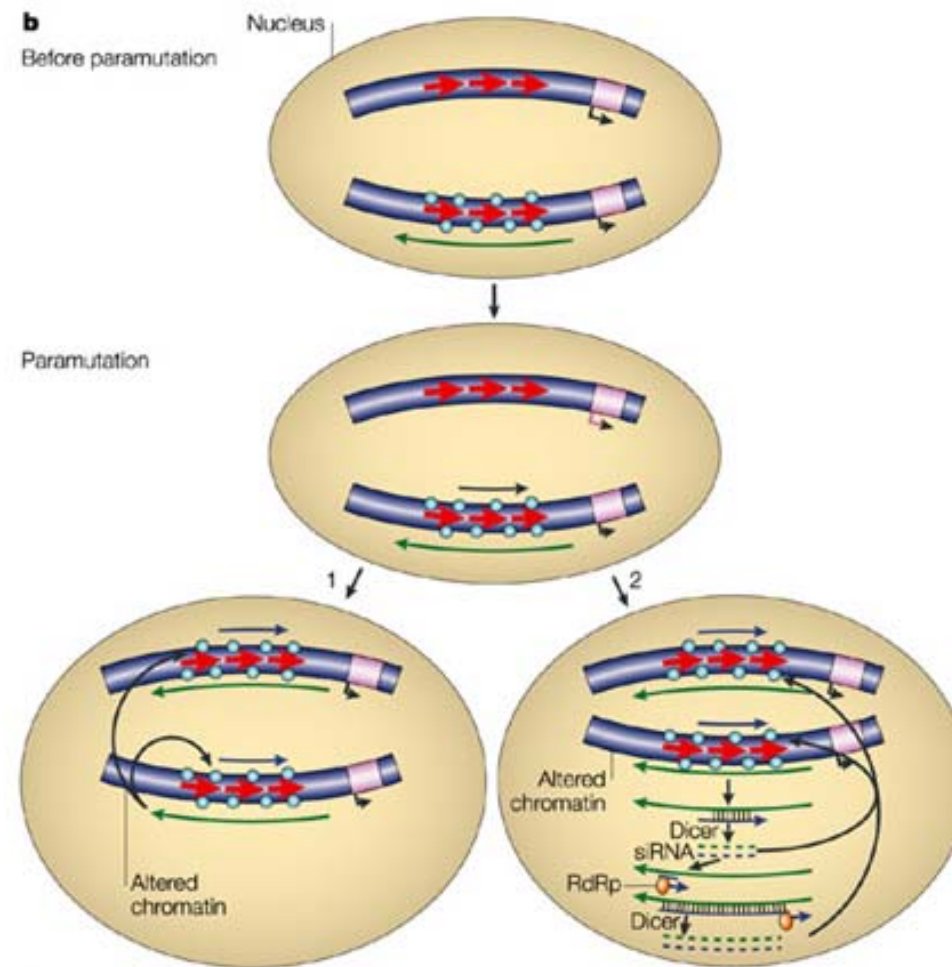
- ❑ 一个沉默的基因常常导致等位基因也发生沉默
- ❑ maize P-rr gene: Myb 转录因子



# Paramutation



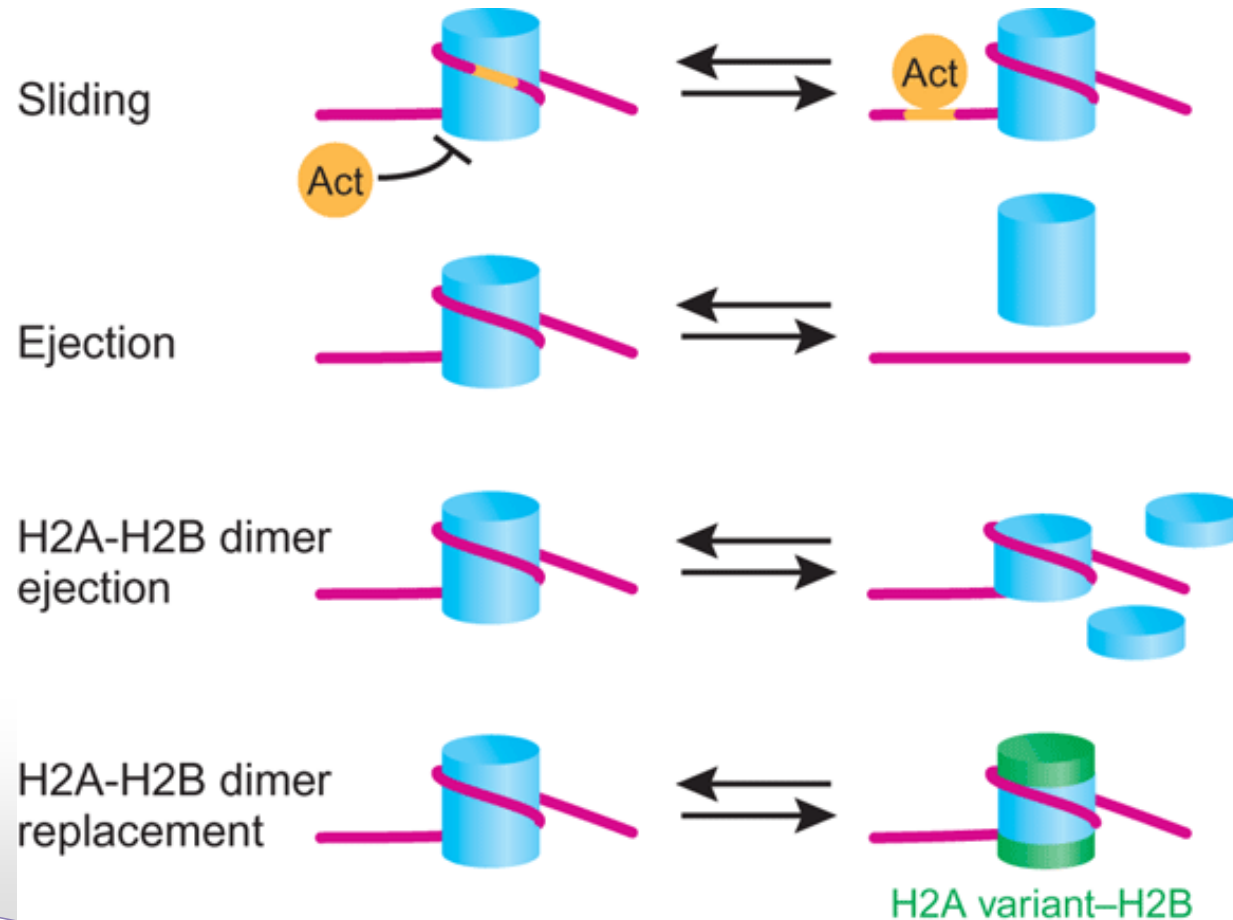
- 分子机理 (RNA-mediated trans-induction of chromatin): RNA参与调控



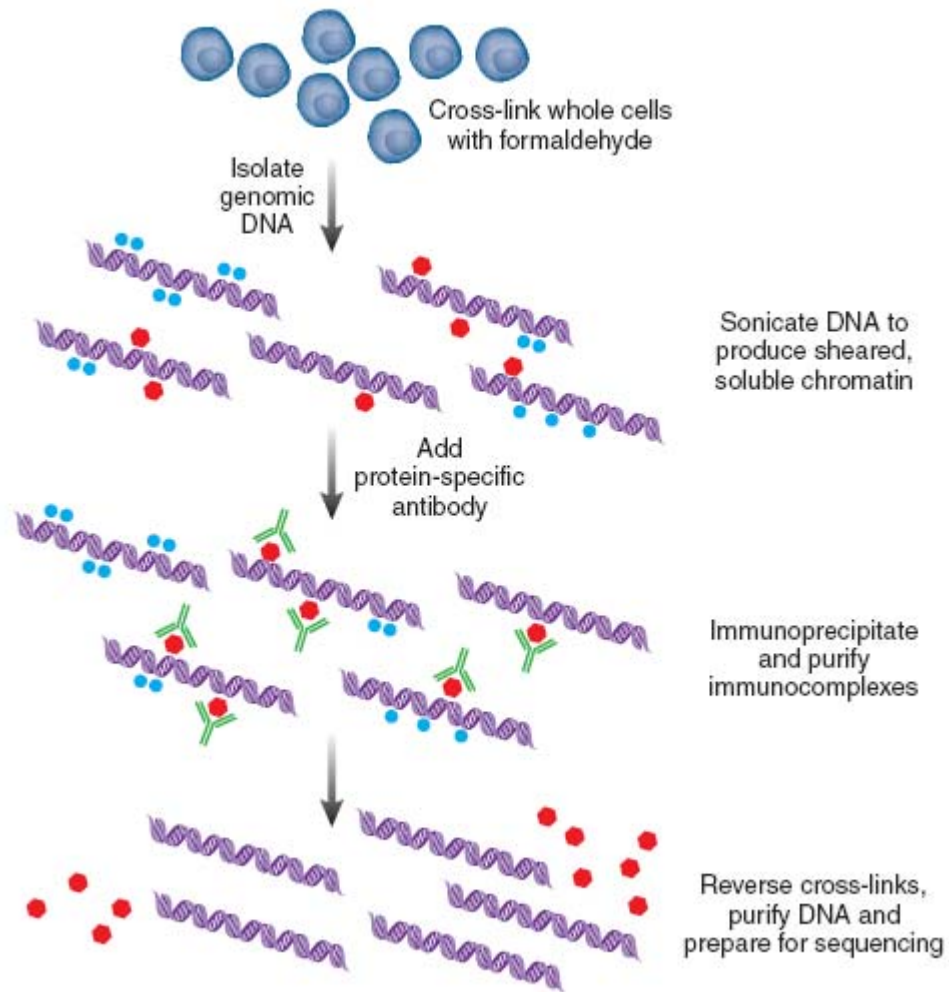
# 染色质重塑



□ 染色质 (Chromatin): 染色体上高度致密的部分，通常不表达基因



# ChIP-Seq



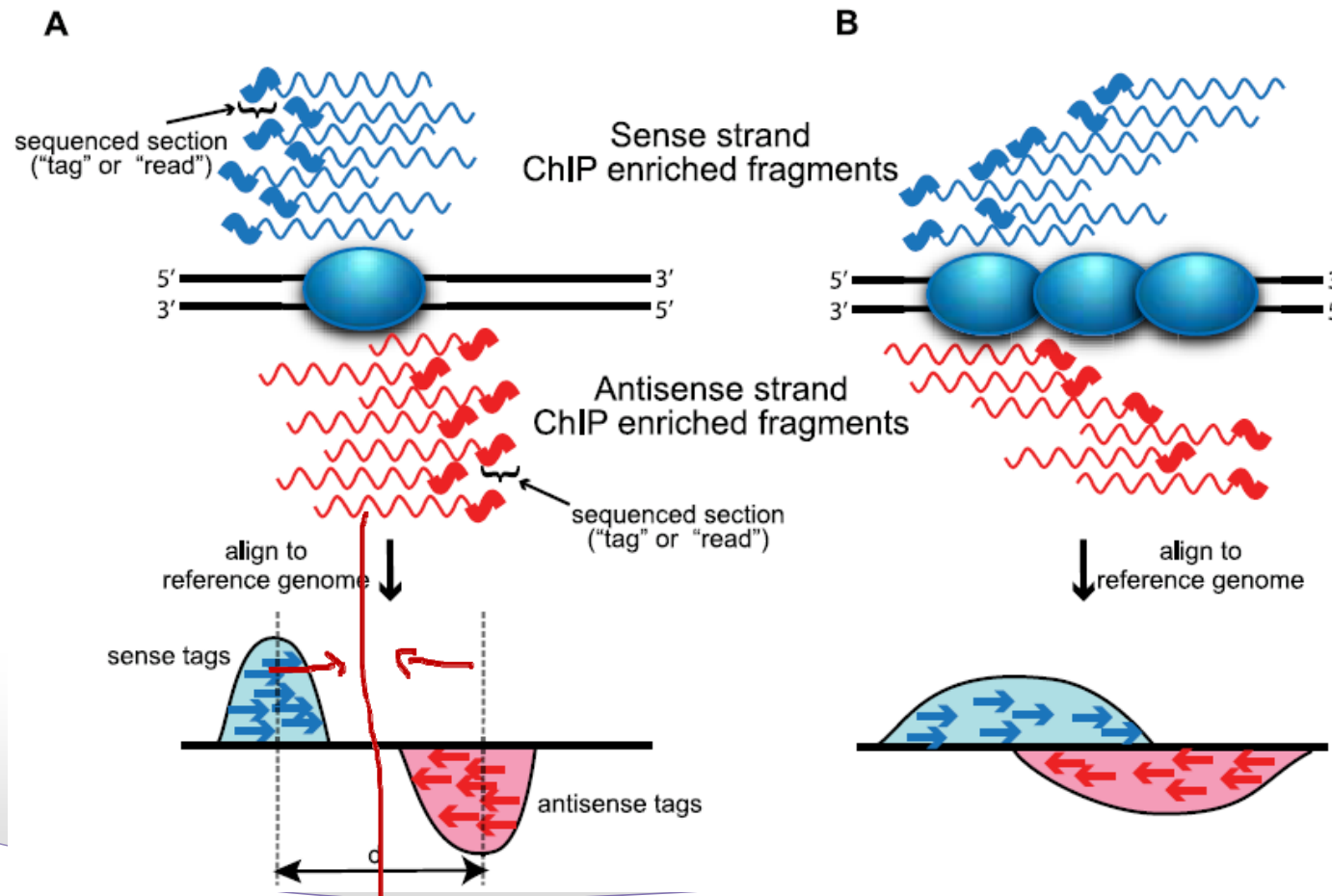
- 转录因子、组蛋白等与DNA结合
- Chromatin immunoprecipitation (ChIP) 结合高通量测序

# ChIP-Seq的读段分布



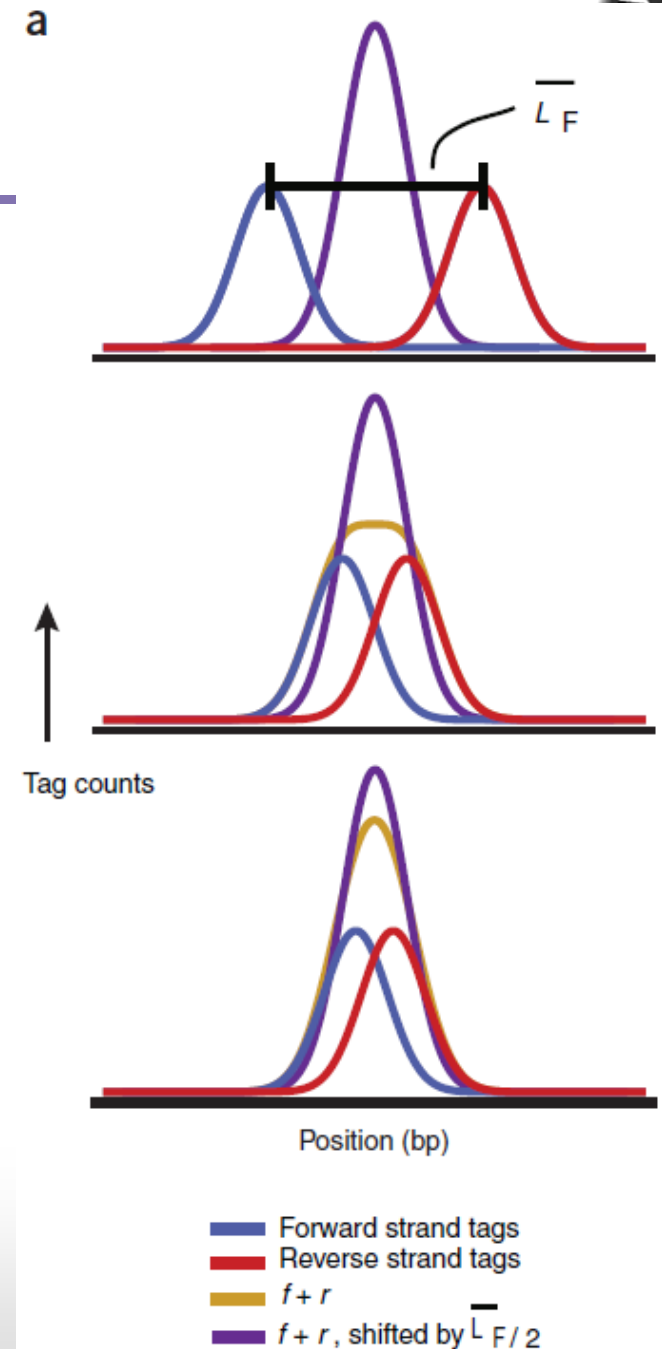
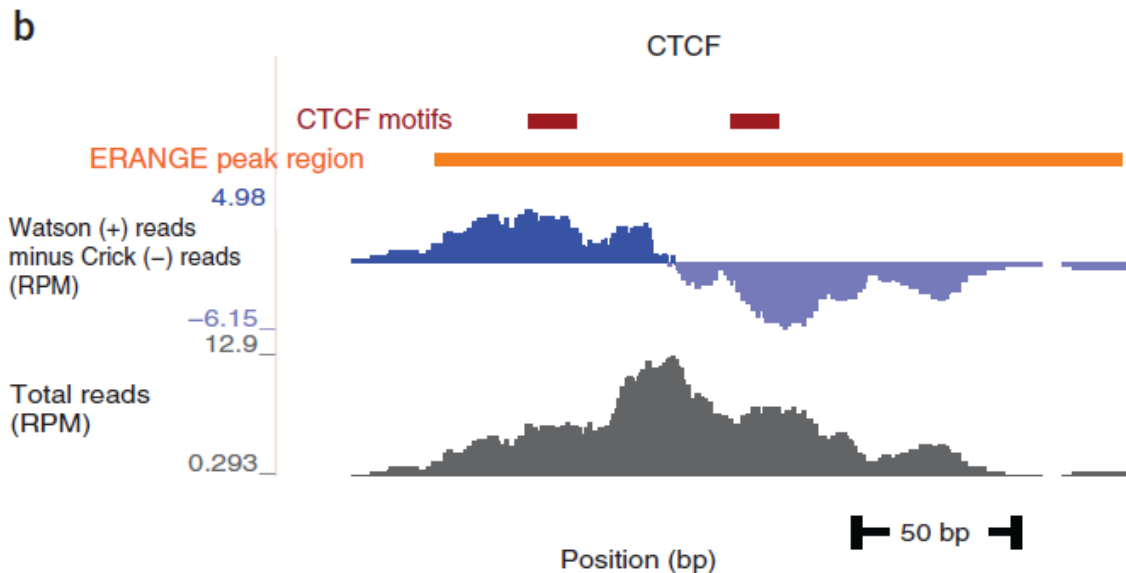
## □ 不同蛋白质与DNA结合的模式不同

✿ A. 转录因子; B. RNA聚合酶和组蛋白质等



# ChIP-Seq校正

- 测序读段的双峰校正为单峰
- 例如，CTCF结合双峰的校正



# 常见的ChIP-Seq数据分析工具



| Program                     | Reference | Version | Graphical user interface? | Window-based scan           | Tag clustering | Gaussian kernel density estimator | Strand-specific density | Peak height or fold enrichment (FE) | Background subtraction      | Compensates for genomic duplications or deletions | False Discovery Rate                  | Compare to normalized control data (FE) | Compare to statistical model fitted with control data | Statistical model or test      |
|-----------------------------|-----------|---------|---------------------------|-----------------------------|----------------|-----------------------------------|-------------------------|-------------------------------------|-----------------------------|---------------------------------------------------|---------------------------------------|-----------------------------------------|-------------------------------------------------------|--------------------------------|
| CisGenome                   | 28        | 1.1     | X*                        | X                           |                |                                   | X                       | X                                   |                             | X                                                 |                                       | X                                       |                                                       | conditional binomial model     |
| Minimal ChipSeq Peak Finder | 16        | 2.0.1   |                           | X                           |                |                                   | X                       |                                     |                             |                                                   | X                                     |                                         |                                                       |                                |
| E-RANGE                     | 27        | 3.1     |                           | X                           |                |                                   | X                       |                                     |                             |                                                   | X                                     | X                                       |                                                       | chromosome scale Poisson dist. |
| MACS                        | 13        | 1.3.5   |                           | X                           |                |                                   | X                       |                                     |                             | X                                                 |                                       | X                                       |                                                       | local Poisson dist.            |
| QuEST                       | 14        | 2.3     |                           |                             | X              |                                   | X                       |                                     |                             | X**                                               |                                       | X                                       |                                                       | chromosome scale Poisson dist. |
| HPeak                       | 29        | 1.1     |                           | X                           |                |                                   | X                       |                                     |                             |                                                   |                                       | X                                       |                                                       | Hidden Markov Model            |
| Sole-Search                 | 23        | 1       | X                         | X                           |                |                                   | X                       |                                     | X                           |                                                   |                                       | X                                       |                                                       | One sample t-test              |
| PeakSeq                     | 21        | 1.01    |                           | X                           |                |                                   | X                       |                                     |                             |                                                   |                                       | X                                       |                                                       | conditional binomial model     |
| SISSRS                      | 32        | 1.4     |                           | X                           |                |                                   | X                       |                                     |                             |                                                   | X                                     |                                         |                                                       |                                |
| spp package (wtd & mtc)     | 31        | 1.7     |                           | X                           |                |                                   | X                       |                                     | X                           | X'                                                | X                                     |                                         |                                                       |                                |
|                             |           |         |                           | Generating density profiles |                |                                   | Peak assignment         |                                     | Adjustments w. control data |                                                   | Significance relative to control data |                                         |                                                       |                                |

X\* = Windows-only GUI or cross-platform command line interface

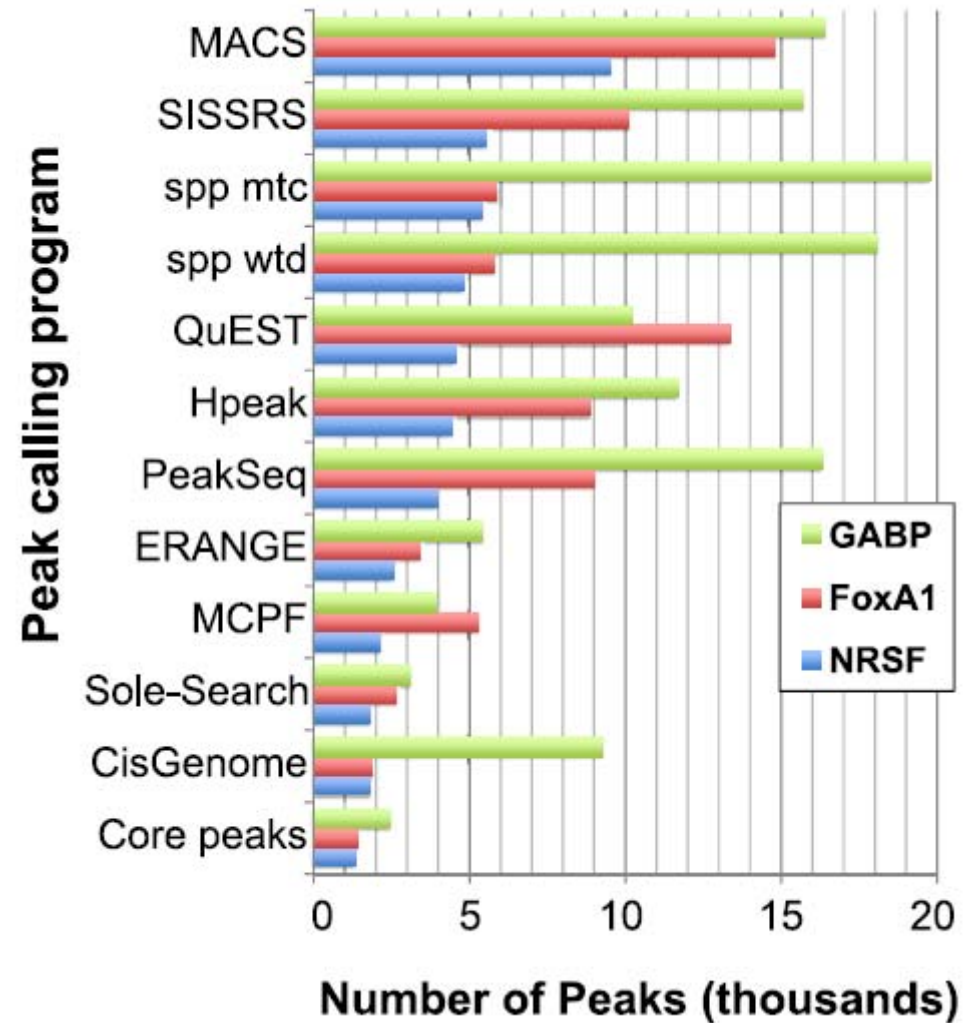
X\*\* = optional if sufficient data is available to split control data

X' = method excludes putative duplicated regions, no treatment of deletions

# 不同软件结果获得的峰不同



- ❑ 人类三个转录因子
- ❑ NRSF
- ❑ (neuron-restrictive silencer factor)
- ❑ GABP (growth-associated binding protein)
- ❑ FoxA1 (hepatocyte nuclear factor 3α)

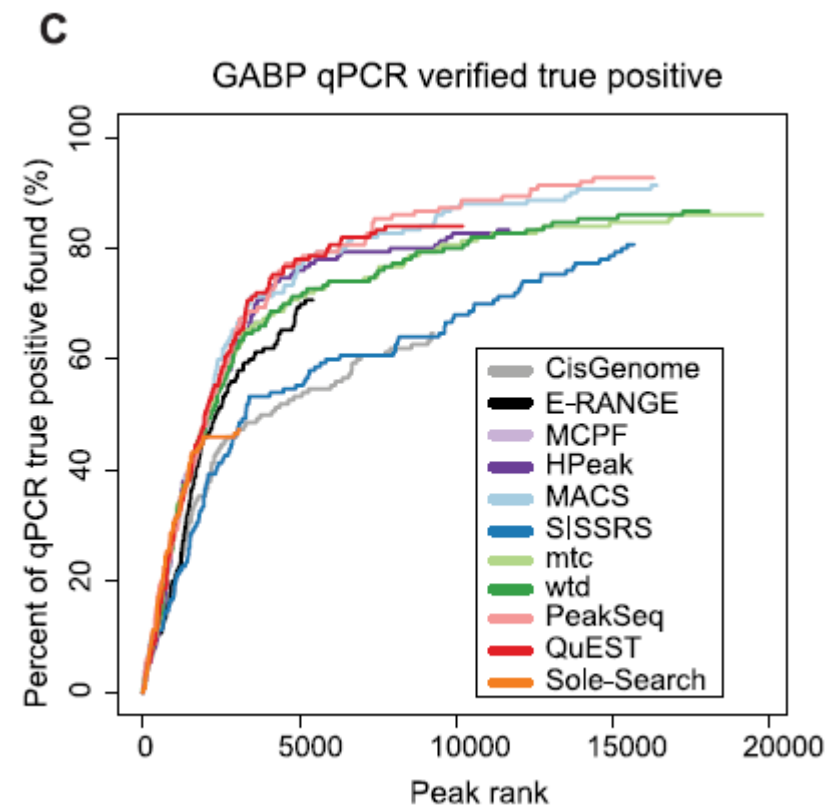
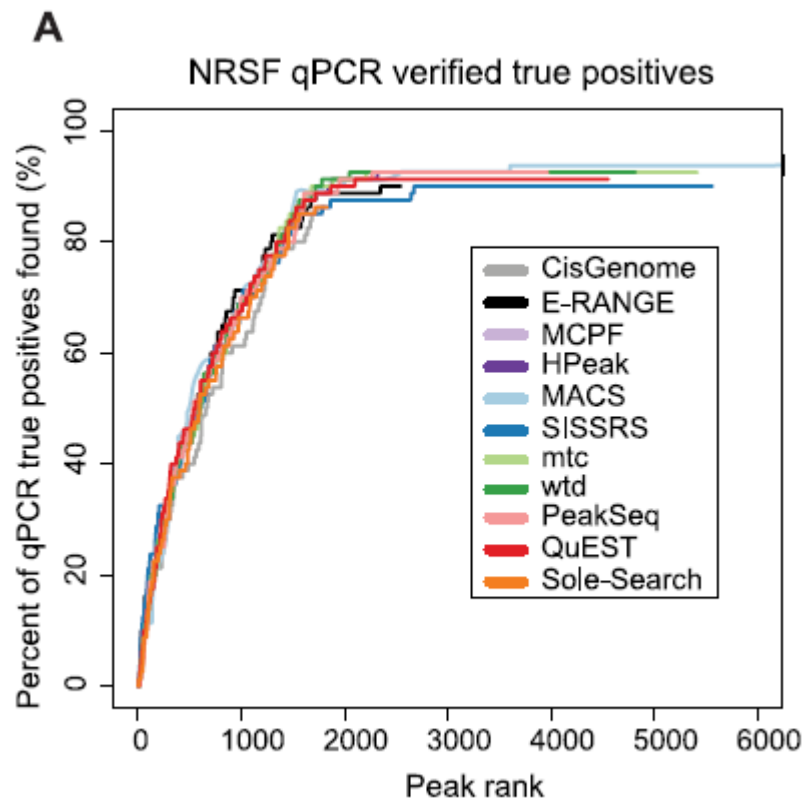


# qPCR验证



❑ NRSF: 大致相当

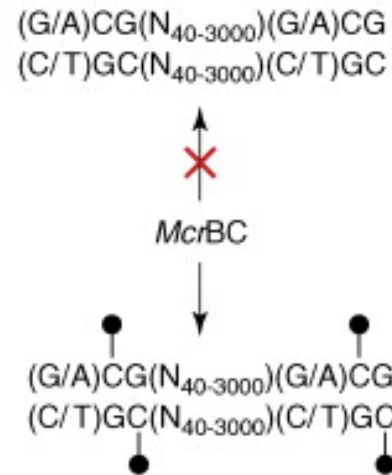
❑ GABP: SISSRS和CisGenome较差



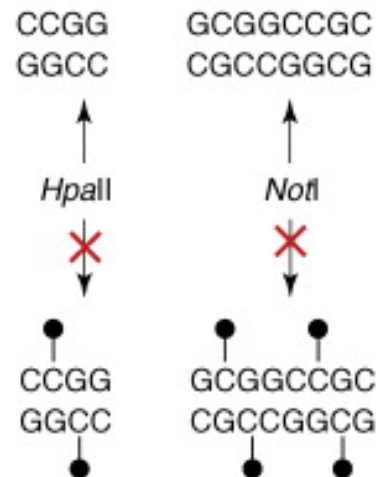
# DNA甲基化的检测：芯片



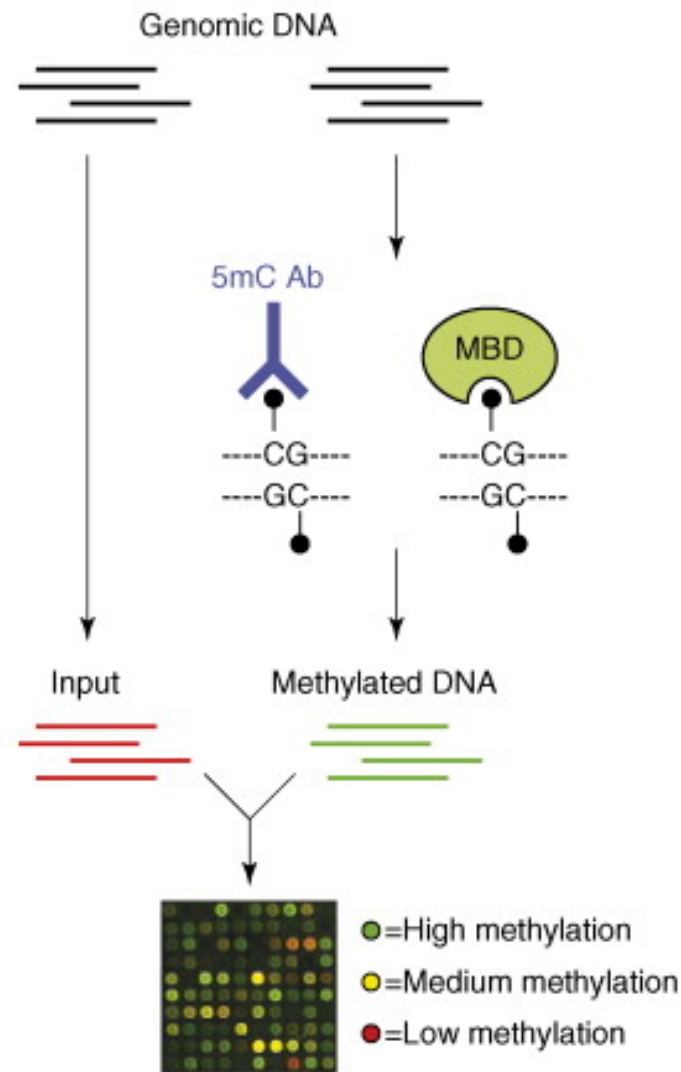
(a)



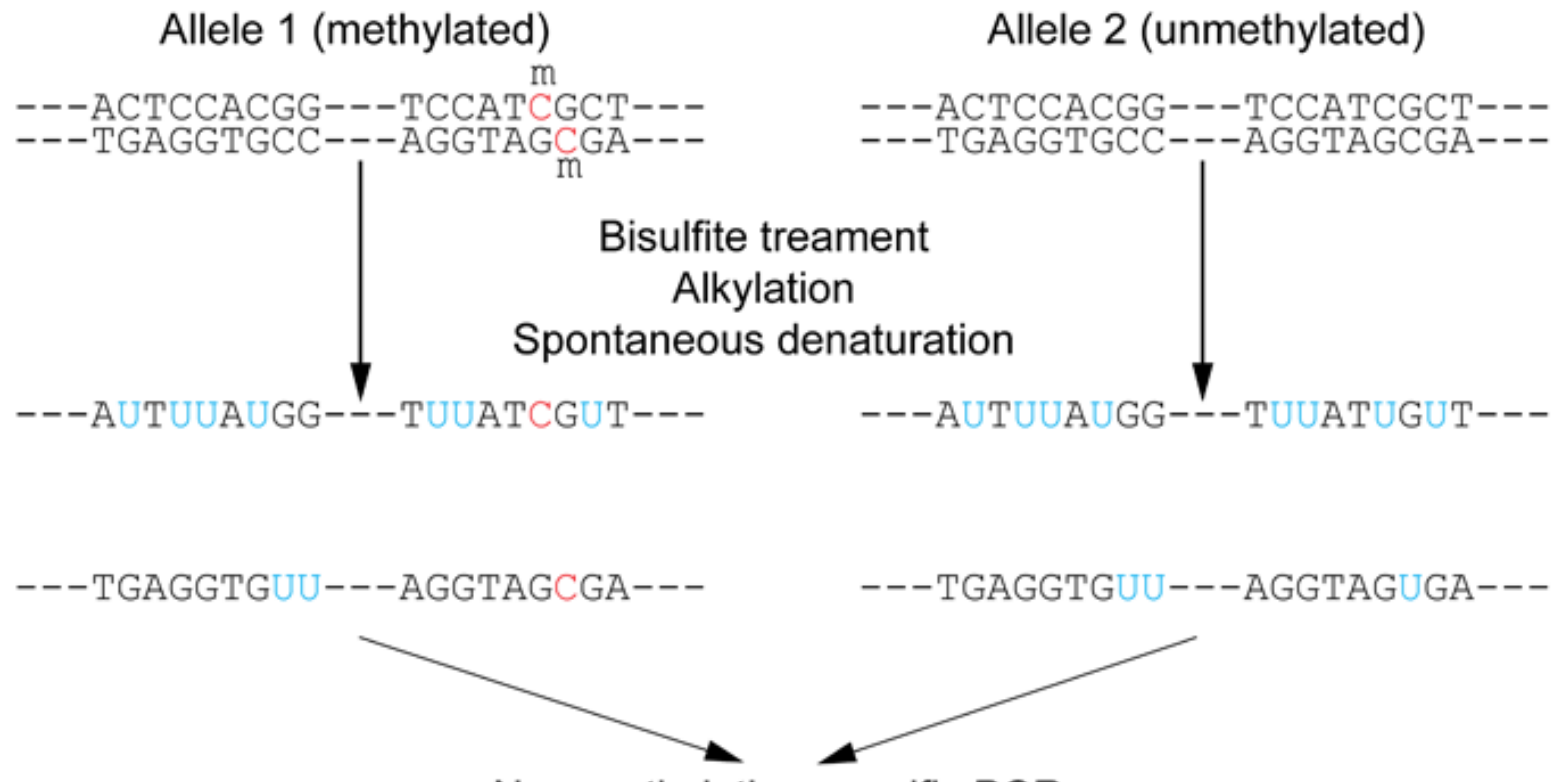
(b)



(c)



# MethylC-seq: Bisulfite Modification



重亚硫酸盐测序: 非甲基化的C将被测序成T, 反链为A

Differentiation of bisulfite-generated polymorphisms

Bioinformatics, 2020, HUST

# Methyl-Seq技术



## ❑ Bisulfite-based

- ⚙ MethylC-seq

- ⚙ Reduced representation bisulfite sequencing (RRBS)

## ❑ Enrichment-based

- ⚙ Methylated DNA immunoprecipitation sequencing (MeDIP-seq)

- ⚙ Methylated DNA binding domain sequencing (MBD-seq)

❑ MethylC-seq全基因组覆盖度高，测CpG岛其他方法有优势

