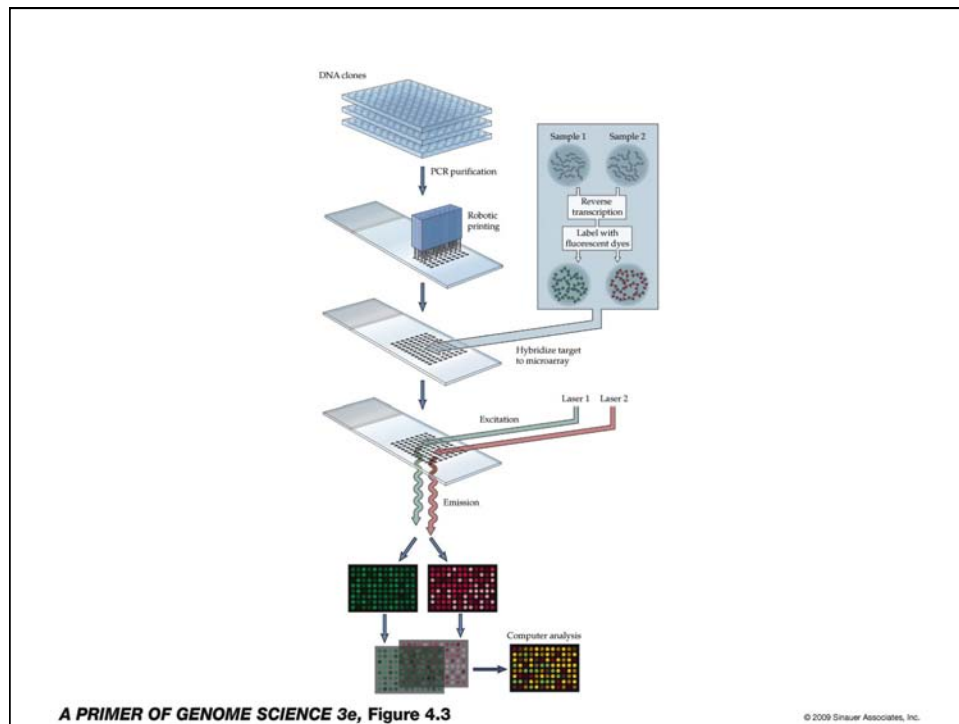


Gene expression analysis

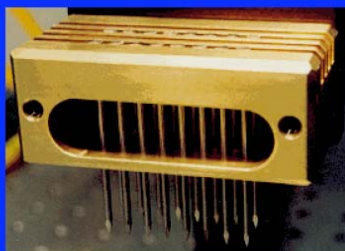
Biosciences 741: Genomics
Fall, 2013
Week 5

Gene expression analysis

- From EST clusters to spotted cDNA microarrays
- Long vs. short oligonucleotide microarrays vs. RT-PCR
- Methods of DNA microarray data analysis
- Serial analysis of gene expression (SAGE) and RNA-seq
- Promoter analysis
- Chromatin immunoprecipitation (ChIP-seq)



Cartesian Technologies Prosys 5510

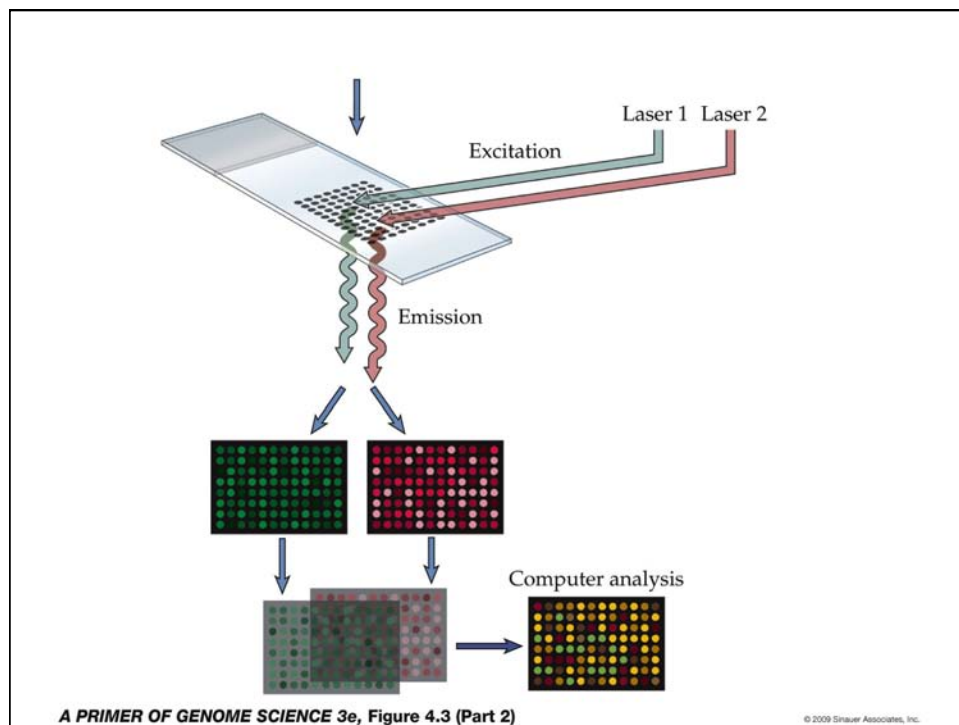
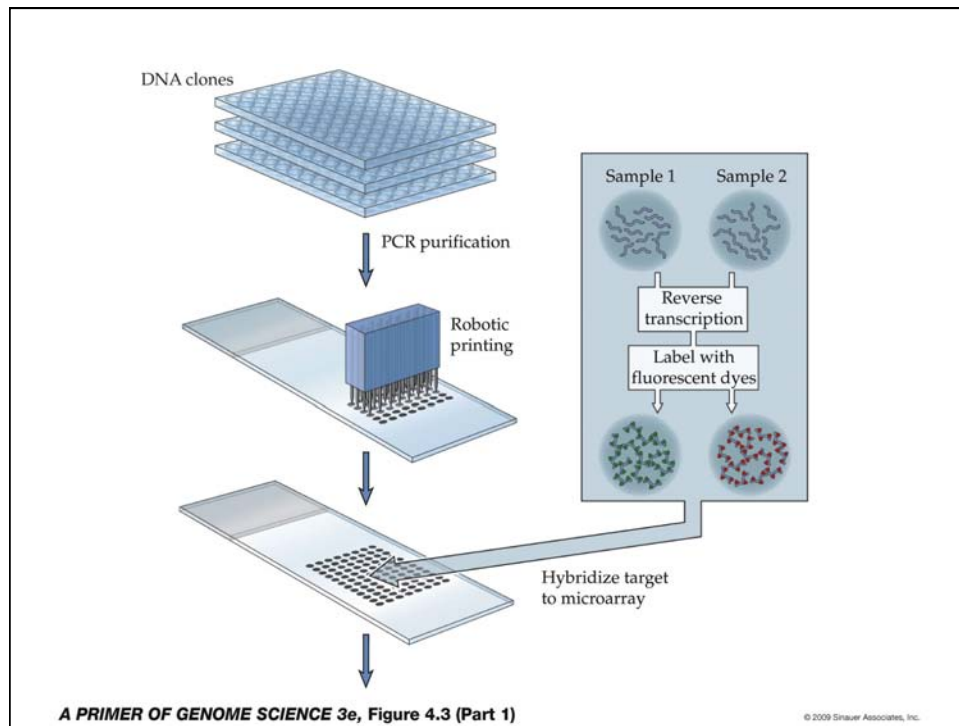


Pin head holds 32 pins



Cross-section of pin





Hybridization to spotted cDNA microarrays: some technical issues

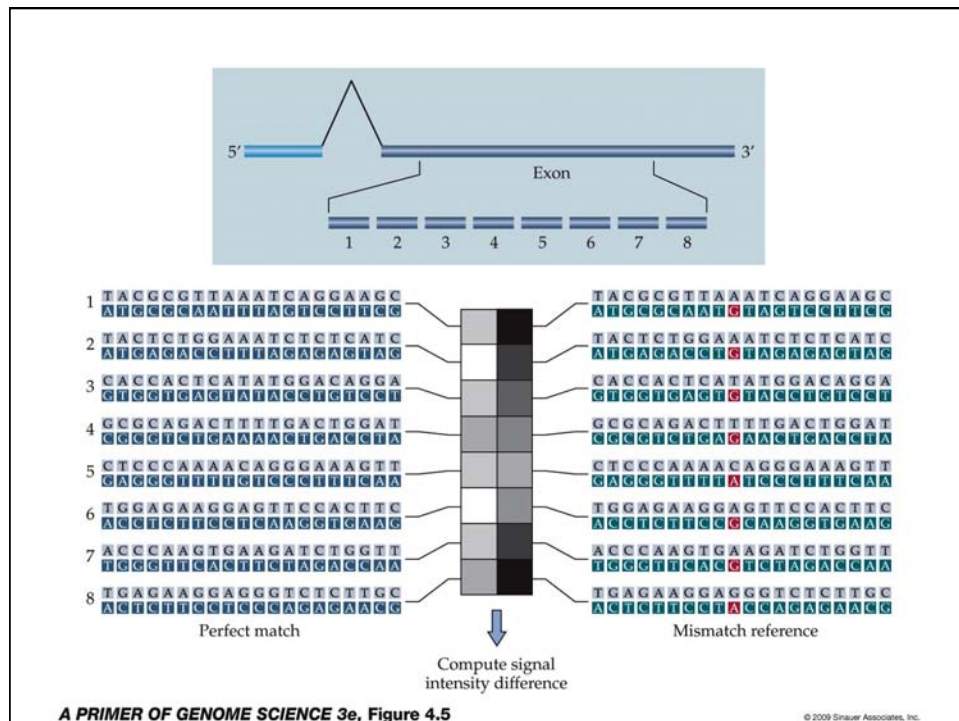
- Unigene sets tend to be more comprehensive than other DNA microarrays, but also less well characterized.
- The various fluorescent dyes differ in their efficiency of incorporation, the brightness of their fluorescence, and their effects on specific and nonspecific binding.
- Hybridization should be fairly gene-specific (because of the bias towards 3' ends), but cross-hybridization has also been observed between gene family members.
- Hybridization stringency is limited by the probe length, which apparently tends to be rather short.
- Sensitivity is limited, so some rare messages may not be detectable.
- Unigene sets do contain some annotation errors, so it can be helpful to resequence the clones of interest.

Choice and amplification of ESTs

- Unigene sets are available for many model organisms (at GMU: human, rat, mouse, and fruit fly) in the form of bacterial cultures in microtiter plates.
- The inserts from these cDNA clones can be PCR amplified by using oligonucleotide primers that bind to the plasmid vector just outside the polylinker.
- It is expensive and time-consuming to do this for tens of thousands of clones, but robots help, and it does not need to be done often.
- Purified insert DNAs are printed on polylysine-coated microscope slides with robotic printers.

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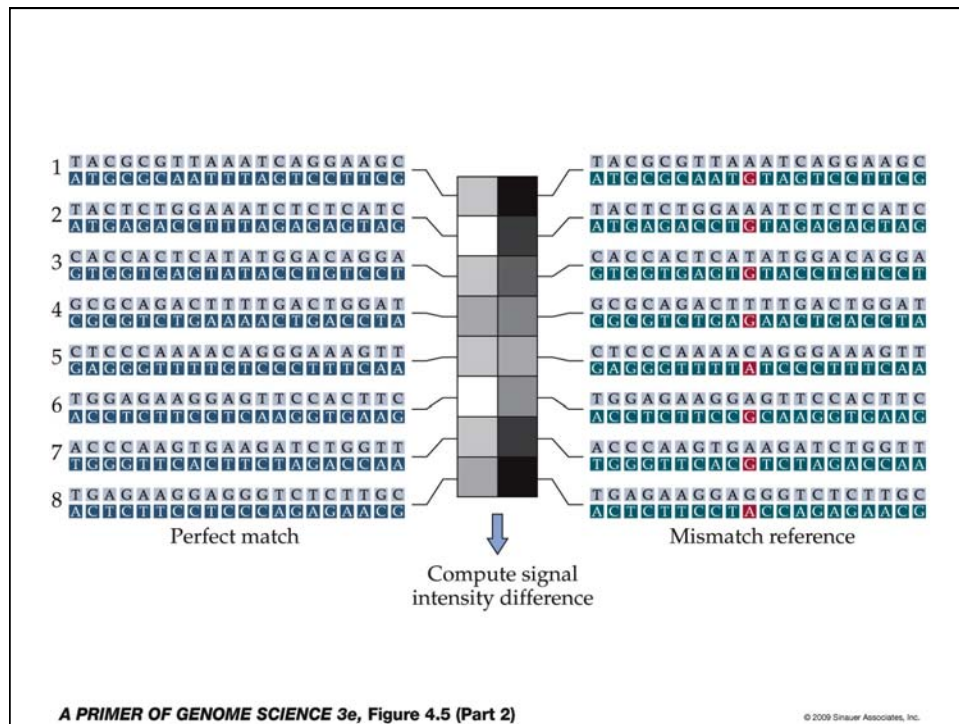
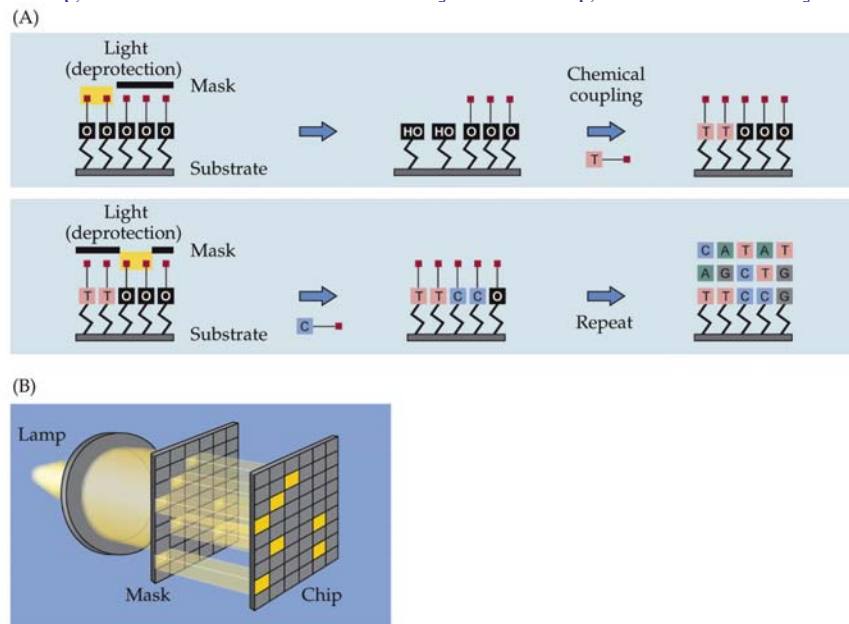
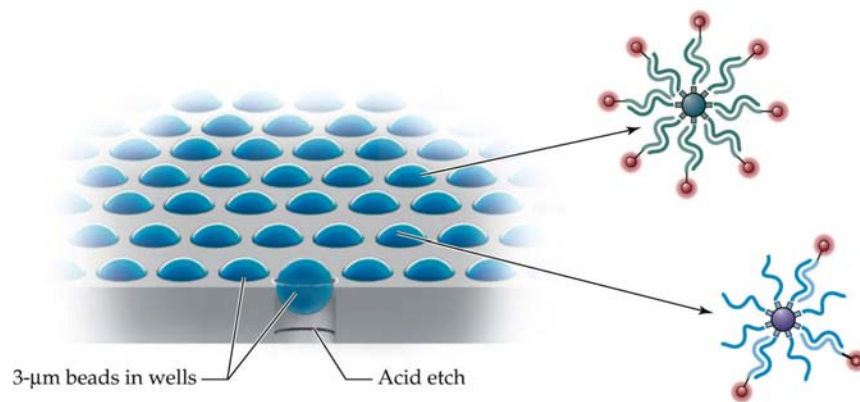


Figure 4.6 Construction of Affymetrix oligonucleotide arrays



Oligonucleotide (Affymetrix) microarrays

- Oligonucleotides are synthesized directly on a silicon wafer by a patented method of photolithography and combinatorial chemistry.
- One advantage of this method is that a very high spot density can be achieved, and so 10-20 spots are typically allocated per gene.
- This allows multiple sequences within a gene, as well as similar control sequences, to be tested. It provides a superior method of discriminating between gene family members, as well as between splice variants of a single gene.
- Some of the disadvantages include cost (which generally preclude a large sample), limited numbers of genes (they are gradually catching up to Unigene sets), a lack of flexibility (you cannot add your favorite genes), and multiple proprietary steps in the data analysis (you can not get your hands on all of the raw data).
- Sensitivity tends to be slightly better than ds cDNA microarrays.



A PRIMER OF GENOME SCIENCE 3e, Figure 4.4

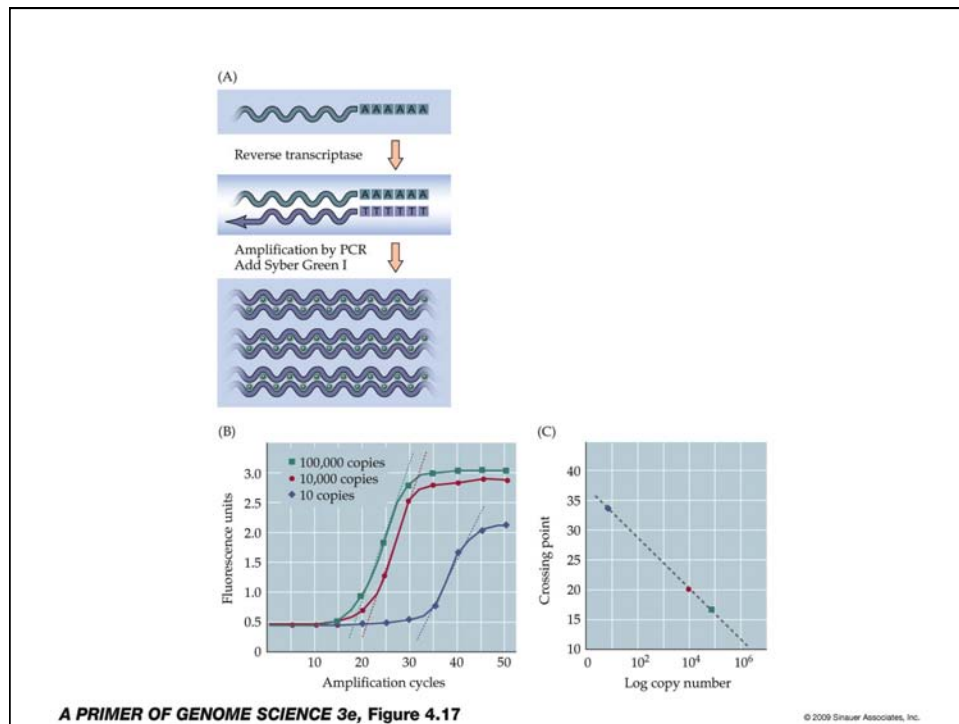
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Long oligonucleotide microarrays

- Long oligonucleotide microarrays are increasingly popular. These are based on conventional methods of oligonucleotide synthesis and microarray printing (on polylysine or etc) of 60-80 base oligos, typically one per gene.
- These in many respects represent a compromise between the advantages and disadvantages of spotted cDNAs vs. proprietary short oligos.
- Long oligonucleotide microarrays have moderate cost, good sensitivity, and good reproducibility.
- Some long oligonucleotide microarrays are commercially available. It is also possible to make your own, and hence control the gene content of your assay.
- In general, the correlations between microarray platforms are low to moderate, due to a variety of factors (3' bias in probes, probe length, hybridization stringency, diffusion limits, etc).

qRT-PCR

- The first step of RT-PCR is reverse transcription of mRNA for form single-stranded cDNA.
- The second step is PCR with specific primers, typically about 75-150 bp apart on two neighboring exons.
- The progress of the reaction is monitored during each cycle with a variety of specialized dye technologies (most popular is SYBR green).
- Transcript levels are quantified based on the time taken for the amplified product to reach a certain level above background.
- Some of the advantages of this method include - quantitative, specific, and sensitive. Can distinguish gene family members and alternative splice variants. A useful independent test, as a complement to either spotted cDNA or Affymetrix microarrays.
- Disadvantages include - moderately expensive, must analyze one (or a few) genes at a time.



Gene expression analysis

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Microarrays: initial data analysis

- Affymetrix data is based on single-color hybridizations, computed as (perfect match - mismatch), which are then log-normalized. Thus, a separate slide must be purchased if you wish to use a reference sample.
- A similar method of initial data analysis can be used for spotted cDNA microarrays. This approach eliminates problems with dyes and reference samples. It should also facilitate data mining.
- Alternatively, some labs prefer competitive two-color hybridizations (red/green). This can help to control for variation between printed spots, as well as variation in hybridization conditions.
- Some of the disadvantages of two-color hybridizations are that experiments can only be compared if they used the same reference sample, genes not expressed in the reference sample can not be analyzed, and ratios cause serious statistical problems.
- LOESS normalization, sometimes used with either one- or two-color spotted cDNA arrays, can correct for variations between printer pins and/or regional variations in background.

Red	Green	Difference	Ratio (G/R)	Log ₂ Ratio	Centered R
16,500	15,104	-1,396	0.915	-0.128	-0.048
357	158	-199	0.443	-1.175	-1.095
8,250	8,025	-225	0.973	-0.039	0.040
978	836	-142	0.855	-0.226	-0.146
65	89	24	1.369	0.453	0.533
684	1,368	529	2.000	1.000	1.080
13,772	11,209	-2,563	0.814	-0.297	-0.217
856	731	-125	0.854	-0.228	-0.148

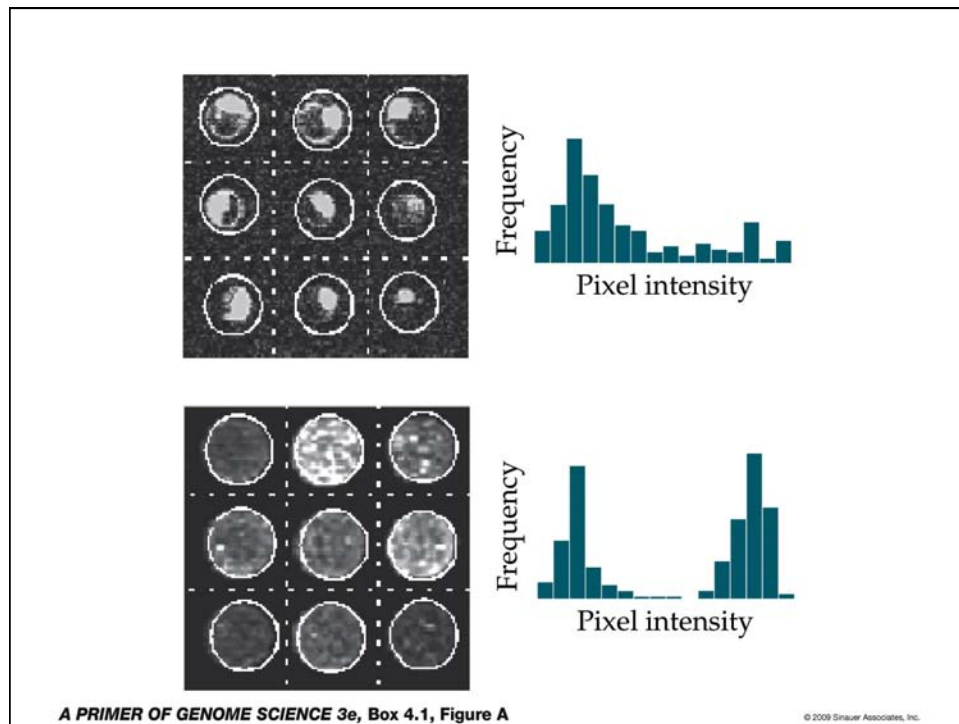


Figure 4.9 Analysis of variance (ANOVA) for gene expression data

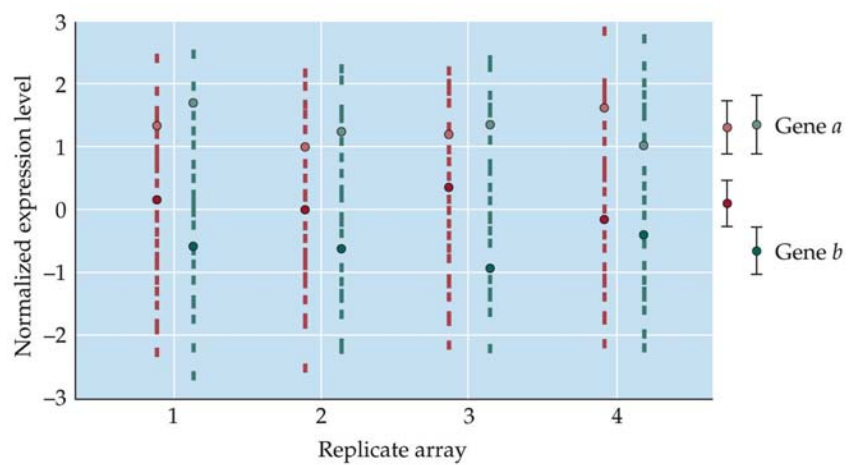
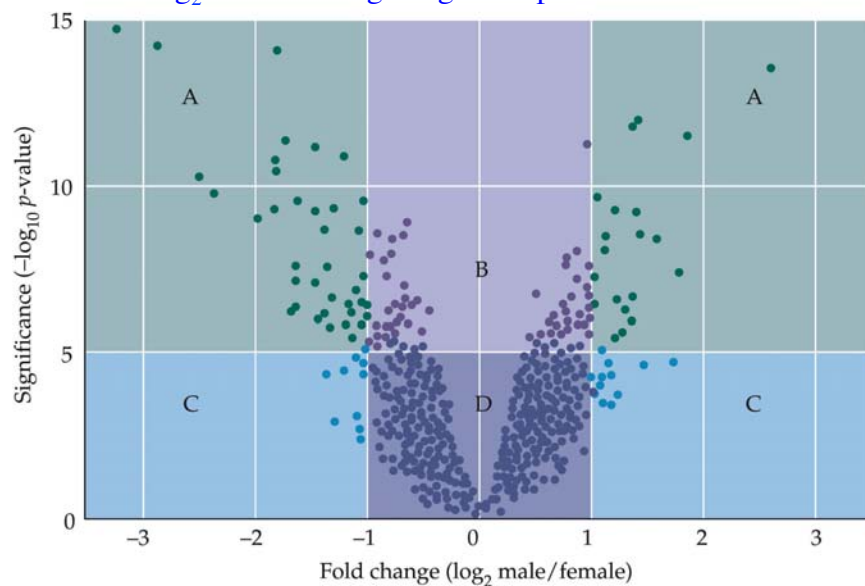


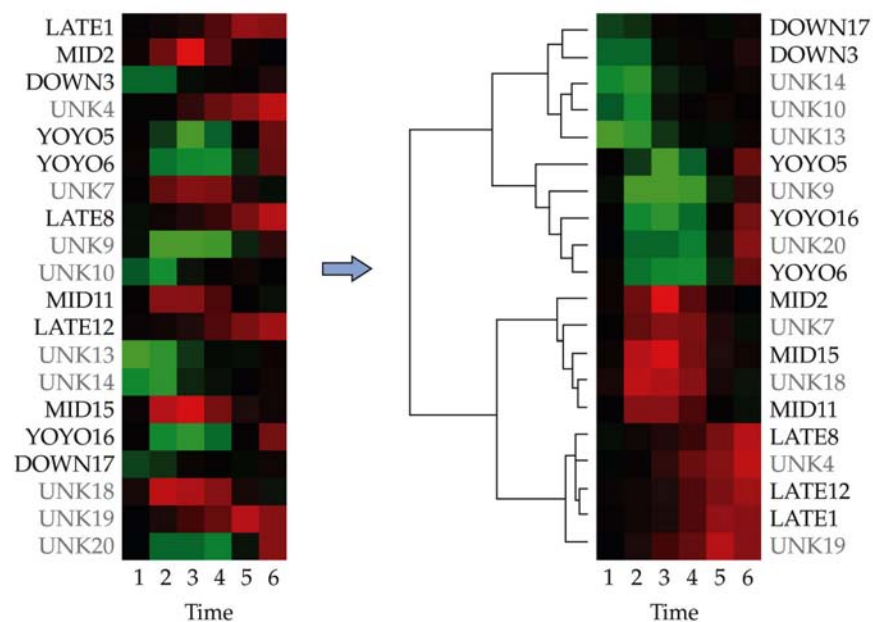
Figure 4.10 - the “volcano” plot of statistical significance versus \log_2 of fold-change in gene expression values.



A PRIMER OF GENOME SCIENCE 3e, Figure 4.10

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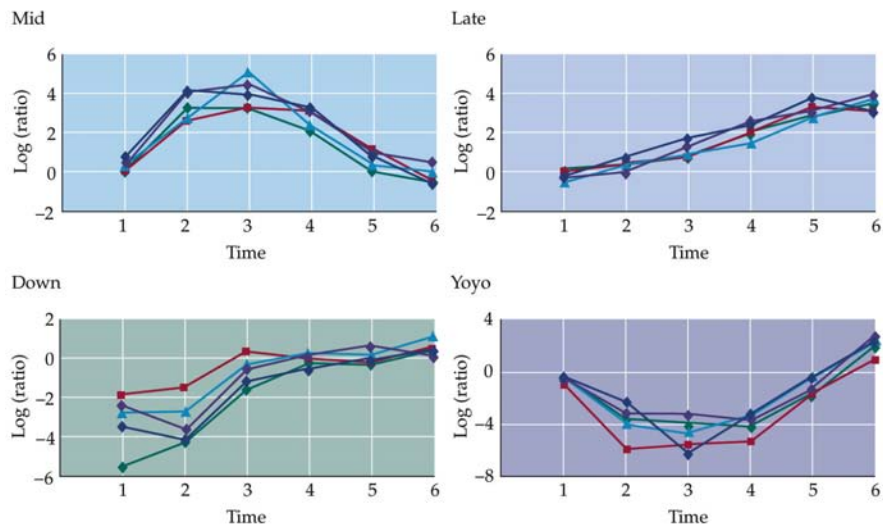
Figure 4.11 - Hierarchical clustering of gene expression patterns.



A PRIMER OF GENOME SCIENCE 3e, Figure 4.11

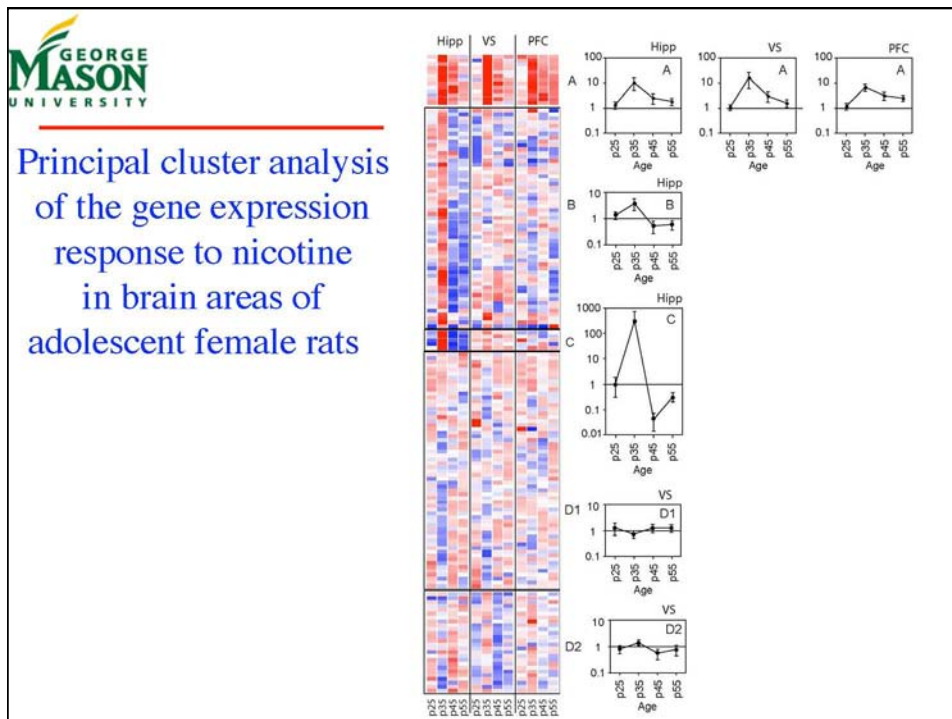
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Figure 4.12 - Profile plots of gene expression data in each cluster.



A PRIMER OF GENOME SCIENCE 3e, Figure 4.12

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Cluster A is specifically induced by nicotine.

Clusters B & C may be due, in part, to the delay of normal developmental profiles.

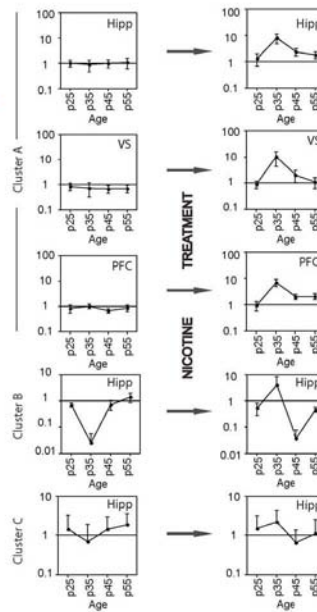
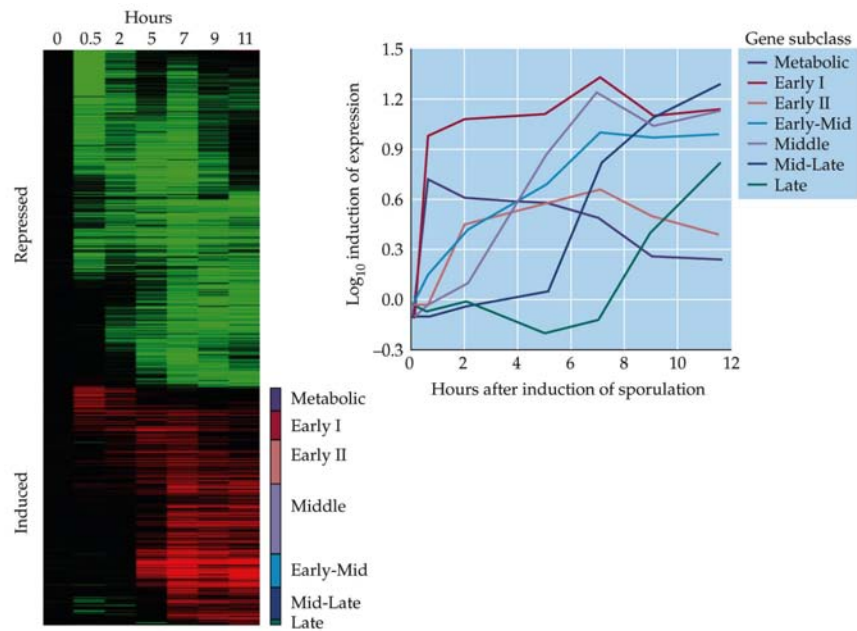


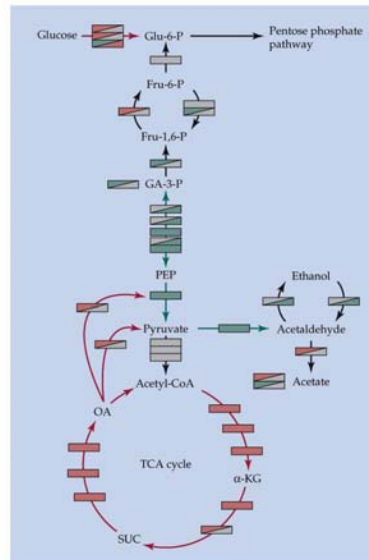
Figure 4.18 - microarray analysis of sporulation in budding yeast.



A PRIMER OF GENOME SCIENCE 3e, Figure 4.18

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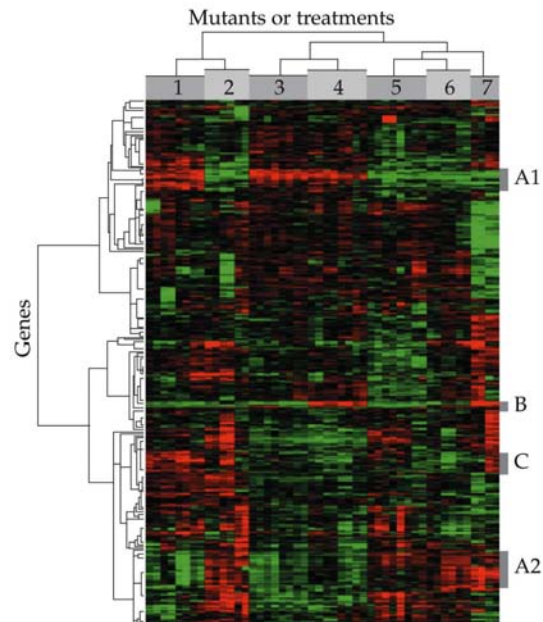
Figure 4.19 Gene expression changes in yeast - boxes represent genes that are repressed (green) or induced (red) at least 2-fold, either after glucose limitation (upper left quadrant), or 250 generations of adaptive evolution (lower right quadrant).



A PRIMER OF GENOME SCIENCE 3e, Figure 4.19

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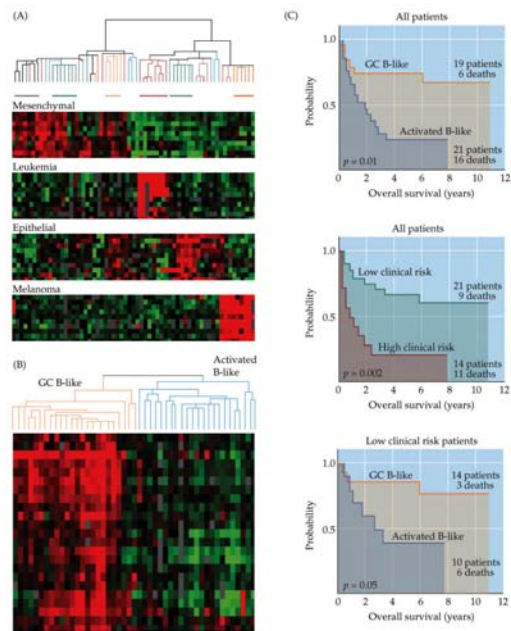
Fig. 4.20 - The compendium approach - can cluster both genes and treatments.



A PRIMER OF GENOME SCIENCE 3e, Figure 4.20

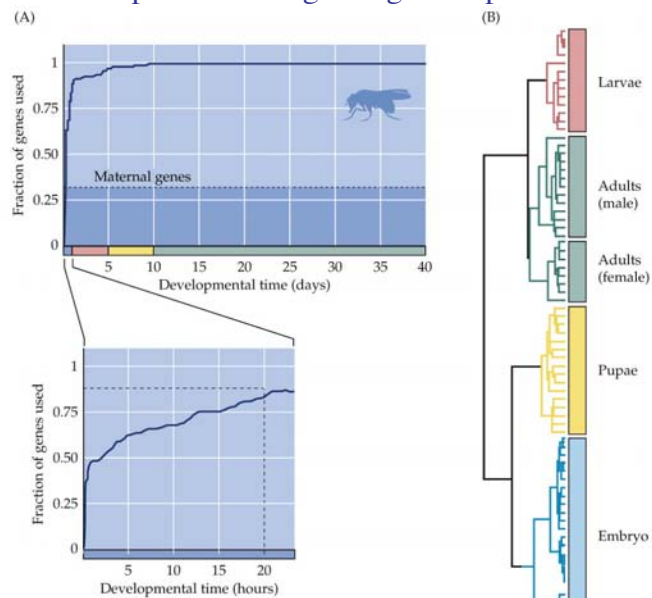
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Figure 4.21 - the molecular pharmacology of cancer.



A PRIMER OF GENOME SCIENCE 3e, Figure 4.21

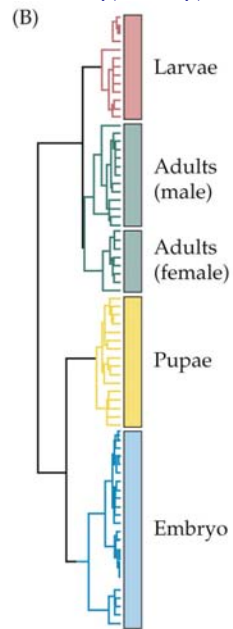
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Figure 4.22 Developmental changes in gene expression in *Drosophila*

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Figure 4.22 Developmental changes in gene expression in *Drosophila*



A PRIMER OF GENOME SCIENCE 3e, Figure 4.22 (Part 2)

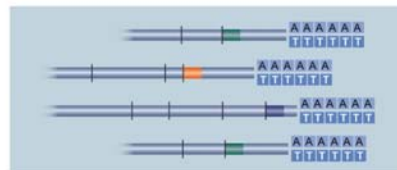
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Gene expression analysis

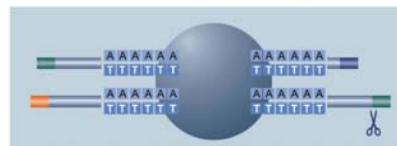
- From EST clusters to spotted cDNA microarrays
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Serial Analysis of Gene Expression (SAGE)

- SAGE essentially amounts to an accelerated version of 3' EST analysis.
- Briefly, double-stranded cDNA is cleaved with a restriction enzyme that has a 4-bp recognition sequence, 3'UTRs purified on streptavidin beads, ligated in pairs by using synthetic oligonucleotide adaptors, then cloned as 1 kb concatemers and sequenced.
- Some of the advantages of this method are that it is extremely sensitive, specific, and quantitative. All annotated genes are included. Comparison of different samples (data mining) is straightforward.
- Some of the disadvantages of this method are similar to those of EST analysis - non-specific transcripts will be included, alternative polyadenylation will confuse gene identities, cloning artifacts and sequencing errors further complicate the analysis.
- SAGE is slow and expensive. Hence it is usually not used in studies that require analysis of multiple samples.



Cleave with anchoring enzyme
Isolate 3' ends on beads



Ligate tagging primer
Liberate and purify tags



Create ditags
Amplify by PCR
Purify

A PRIMER OF GENOME SCIENCE 3e, Figure 4.14 (Part 1)

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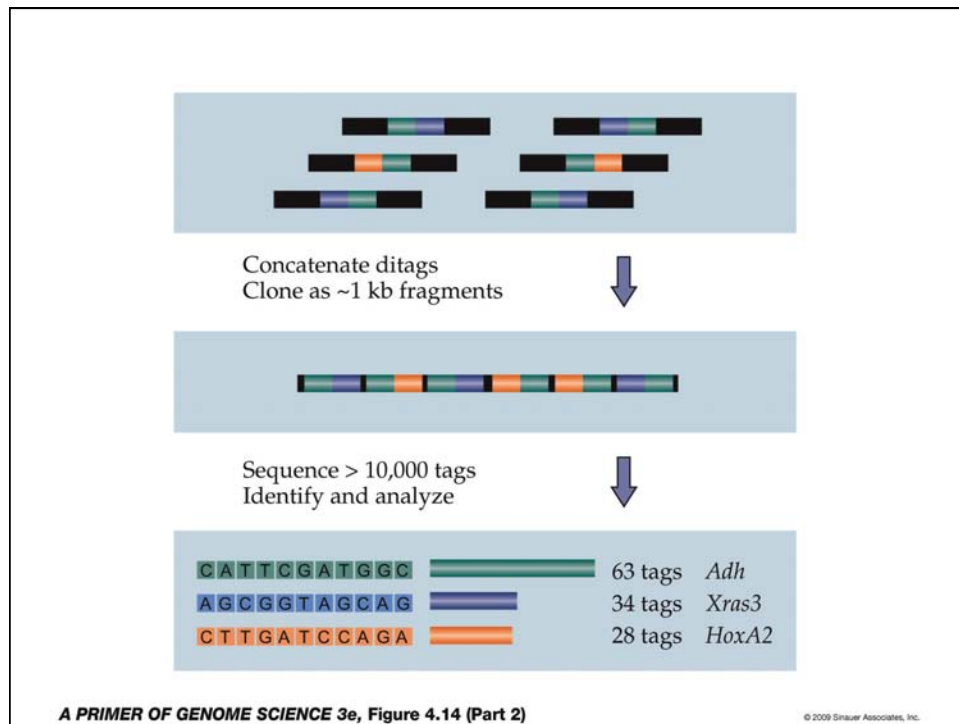
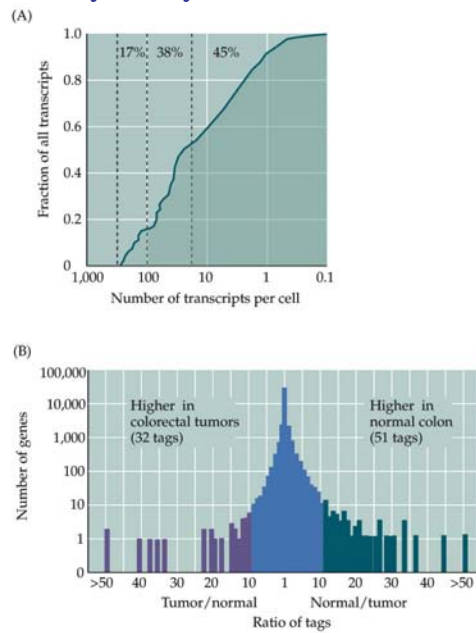
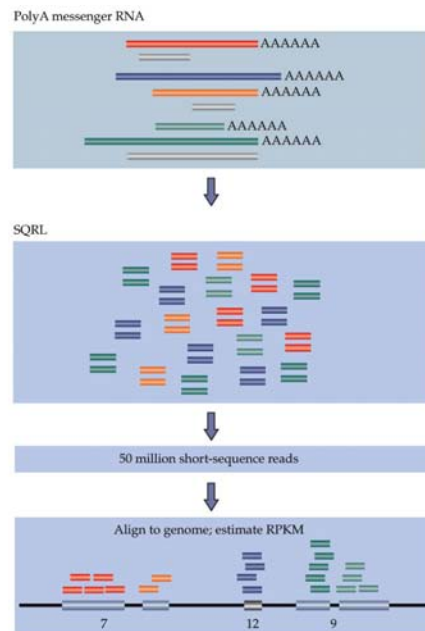


Figure 4.15 SAGE analysis of yeast and colorectal cancer transcriptomes

**A PRIMER OF GENOME SCIENCE 3e, Figure 4.15**

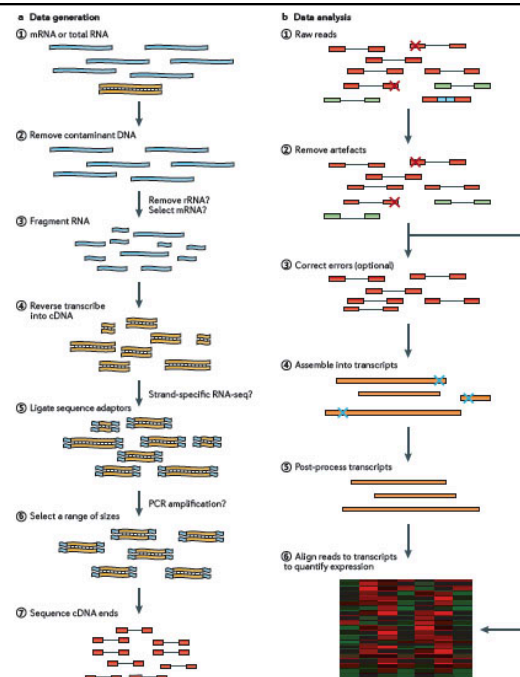
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RNA-Seq: sequencing 200 bp random fragments of cDNAs



A PRIMER OF GENOME SCIENCE 3e, Figure 4.16

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Martin and Wang (2011) Nat. Rev. Genet. 12, 671-682.

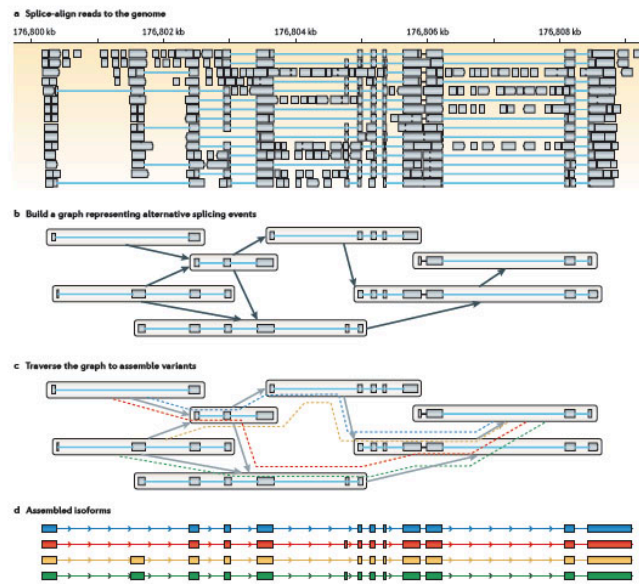
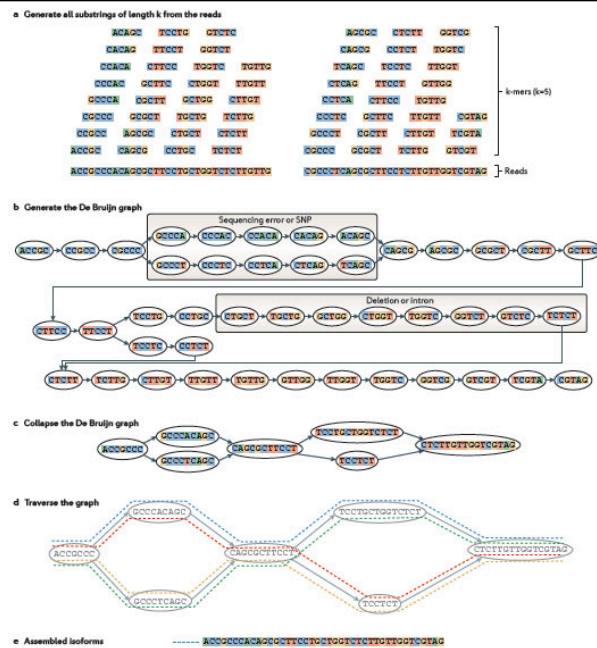
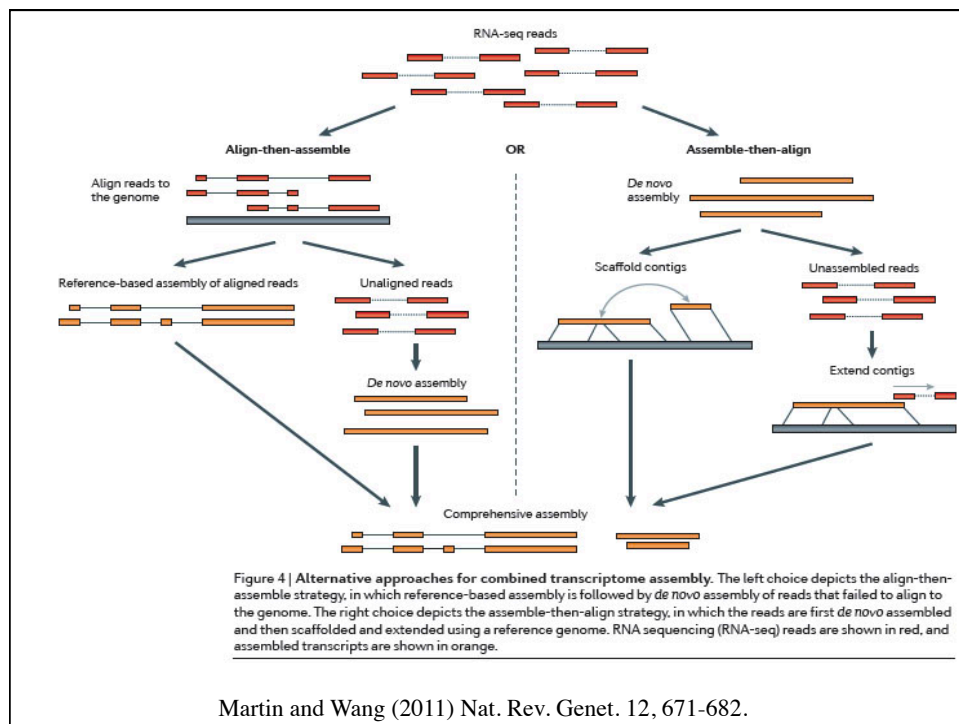


Figure 2 | Overview of the reference-based transcriptome assembly strategy. The steps of the reference-based transcriptome assembly strategy are shown using an example of a mouse gene (ORM2M2C080216). a) Reads (grey) are first splice-aligned to a reference genome. b) A connectivity or splice graph is then constructed to represent all possible isoforms at a locus. c,d) Finally, alternative paths through the graph (blue, red, yellow and green) are followed to join compatible reads together into isoforms.

Martin and Wang (2011) Nat. Rev. Genet. 12, 671-682.

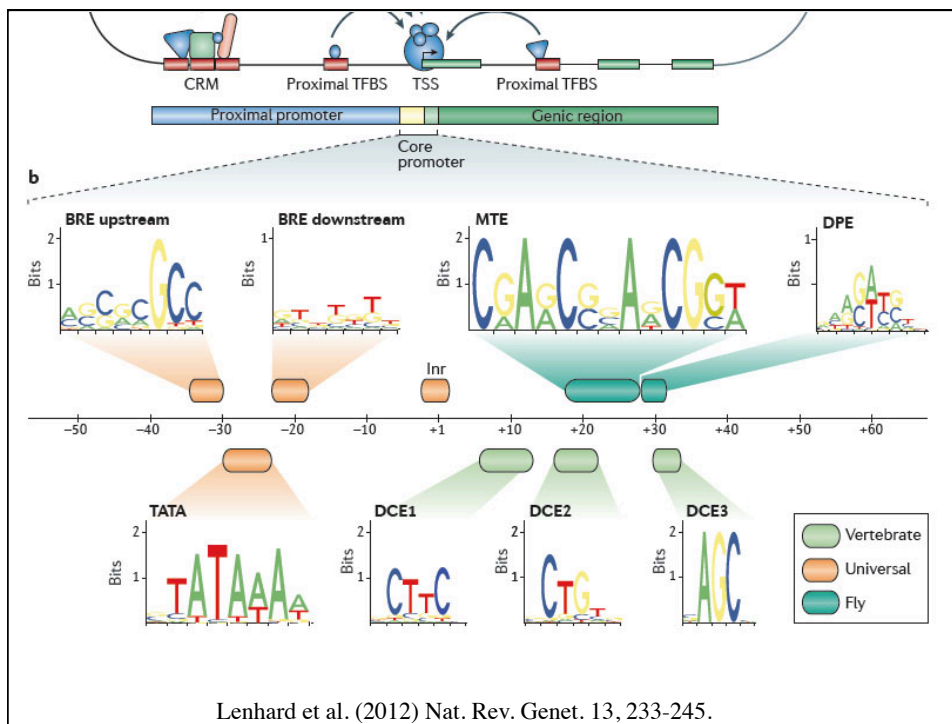


Martin and Wang (2011) Nat. Rev. Genet. 12, 671-682.



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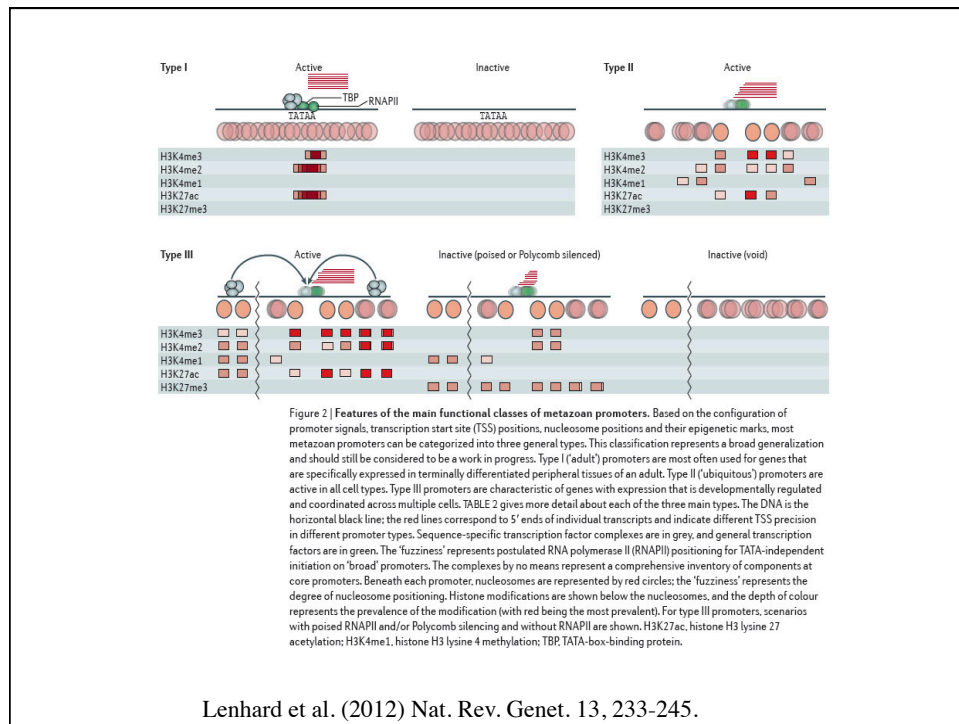
Types of promoters in Metazoa

Table 2 | Promoter types

Promoter type	Dominant gene function	Common properties	Vertebrate-specific	<i>Drosophila melanogaster</i> -specific	Refs
Major promoters					
Type I ('adult')	Tissue-specific expression in adult peripheral tissues	Sharp ('focused') TSS, TATA-box enrichment, disordered nucleosomes	Mostly no CpG islands		8,9,13,17
Type II ('ubiquitous')	Broad expression throughout organismal cycle	Broad ('dispersed') TSS, ordered nucleosome configuration	CpG islands, TATA-depleted	Enrichment of non-positionally fixed motifs (Motif 1 or 6, DRE)	8,9,13,17
Type III ('developmentally regulated')	Differentially regulated genes, often regulators in multicellular development and differentiation	Polycomb repression-regulated genes, broad H3K27me3 marks	Large CpG islands extending into the body of gene	Enriched for DPE	16
Minor promoters					
TCT promoter	Highly expressed genes of translational apparatus	Sharp, pyrimidine-stretch ('TCT') initiator sequence, often full TATA box, ubiquitous-promoter-like nucleosome configuration	CpG island overlapping		23

DPE, downstream promoter element; DRE, DNA recognition element; H3K27me3, histone H3 lysine 27 trimethylation; TSS, transcription start site.

Lenhard et al. (2012) Nat. Rev. Genet. 13, 233-245.



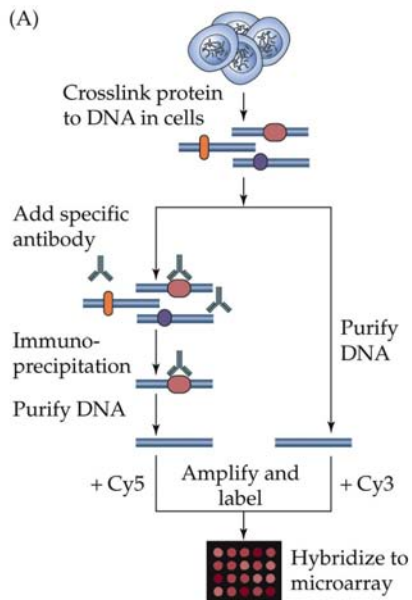
Gene expression analysis

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Chromatin immunoprecipitation (ChIP on chip)

- One goal for future microarray analysis methods is to use gene regulatory pathways to constrain (or inform) cluster analysis.
- A popular method that attempts to discover gene regulatory pathways at the whole genome level involves chromatin immunoprecipitation (first crosslink proteins to DNA in living cells, then shear the DNA and add specific antibody to one transcription factor, and immunoprecipitate the complexes).
- DNA fragments that were purified in this way can be fluorescently labeled, and hybridized to genomic microarrays (or promoter microarrays).
- The result is a high-resolution, physical map of the binding sites of a particular transcription factor, to all gene targets in the genome, under physiological conditions, in the living cell.
- Additional experiments are required to establish whether this binding has a positive, negative, or no effect on transcription.

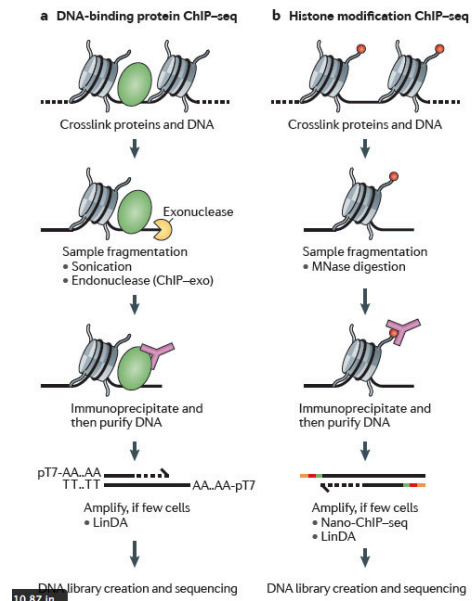
Figure 4.13 Chromatin immunoprecipitation and regulatory pathways



A PRIMER OF GENOME SCIENCE 3e, Figure 4.13 (Part 1)

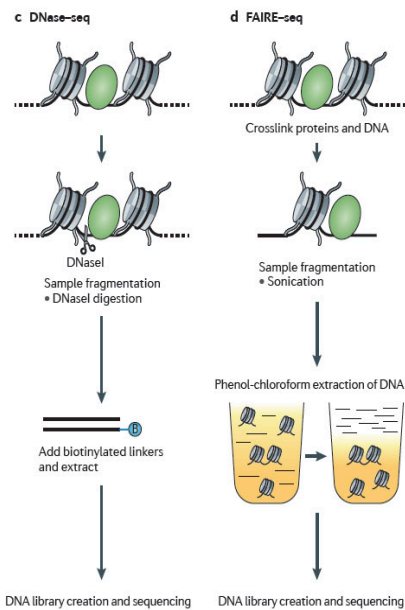
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ChIP for transcription factors or histone modifications



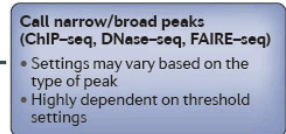
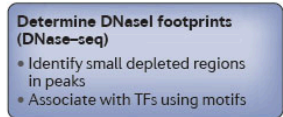
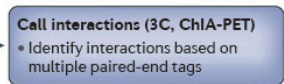
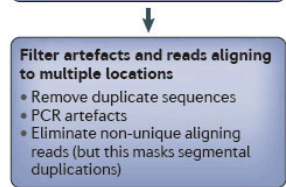
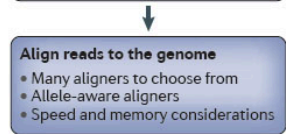
Furey (2012) Nat. Rev. Genet. 13, 840-852.

Dnase-hypersensitive domains, formaldehyde cross-linking



Furey (2012) Nat. Rev. Genet. 13, 840-852.

- **Filter poor-quality reads (optional)**
- Remove sequences with poor-quality bases
- Remove sequences with adapter sequence or other contaminants



Furey (2012) Nat. Rev. Genet. 13, 840-852.

DNase-seq (smoothed)

DNase-seq (raw)

DNase-seq footprints

DNase-seq

Peaks **Troughs**

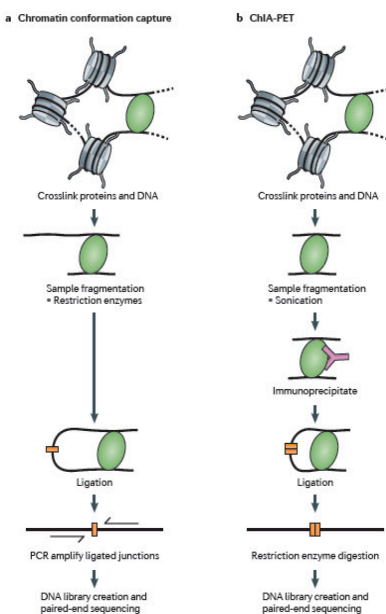
T C C G T T T C G G T T T C A C T T C C G

Motifs from JASPAR database

Model name	Score	Relative score	Start	End	Strand	Predicted site sequence
IRF1	12.906	0.904279917181229	3	14	-1	GAAACCGAAACG
IRF2	17.216	0.907706906384892	4	21	-1	CGGAGTGTGAACCGGAAC
SP1B	4.820	0.806987596140569	5	11	-1	ACCGAAA
BRCA1	4.228	0.802287513481405	8	14	-1	GAAACCG

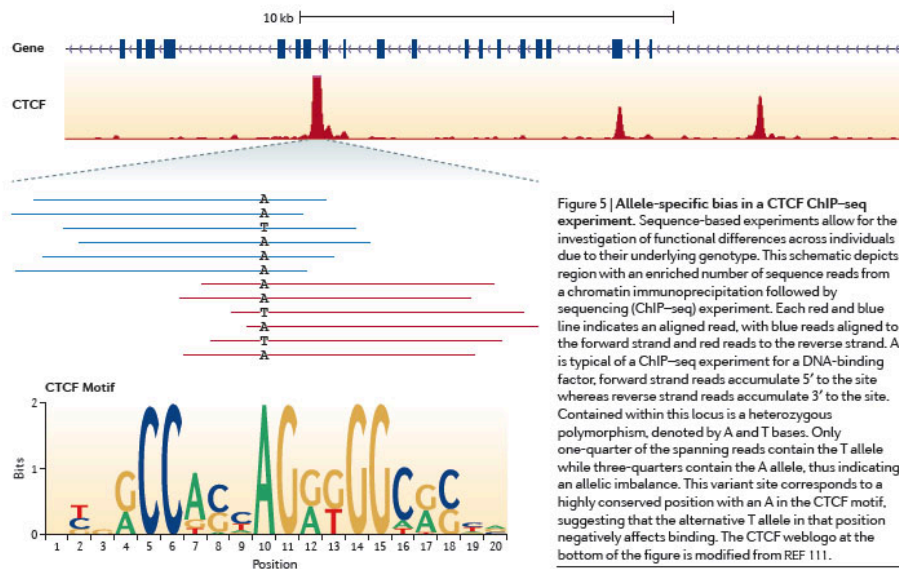
Furey (2012) Nat. Rev. Genet. 13, 840-852.

Chromatin-chromatin interactions



Furey (2012) Nat. Rev. Genet. 13, 840-852.

Detection of allele-specific bias in ChIP-seq



Furey (2012) Nat. Rev. Genet. 13, 840-852.

Discussion questions - week 5

- Discuss the advantages and disadvantages of various methods of gene expression analysis, including cDNA microarrays, long & short oligonucleotide microarrays, qRT-PCR, SAGE, and RNA-seq.
- Discuss the advantages and disadvantages of various methods of identifying and analyzing groups of co-regulated genes, including hierarchical clustering, principal cluster analysis, and ChIP.
- Discuss the quantitative considerations involved in using mathematical methods of clustering to cluster samples (or experiments) rather than genes, and some of the applications of this approach in developmental biology, cancer biology, and biomedical research. Which of these is compatible with RNA-seq? Why is RNA-seq rarely used with these analyses?
- Discuss the major types of Metazoan promoters, and the functional and structural (DNA sequence, chromatin modifications) characteristics of each.
- Discuss methods of chromatin immunoprecipitation, as a tool for understanding the role(s) of chromatin structure in gene regulation. Your answer should include some of the advantages and disadvantages of each method.