

Measuring Gene Expression Part 2

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Bioinformatics 301

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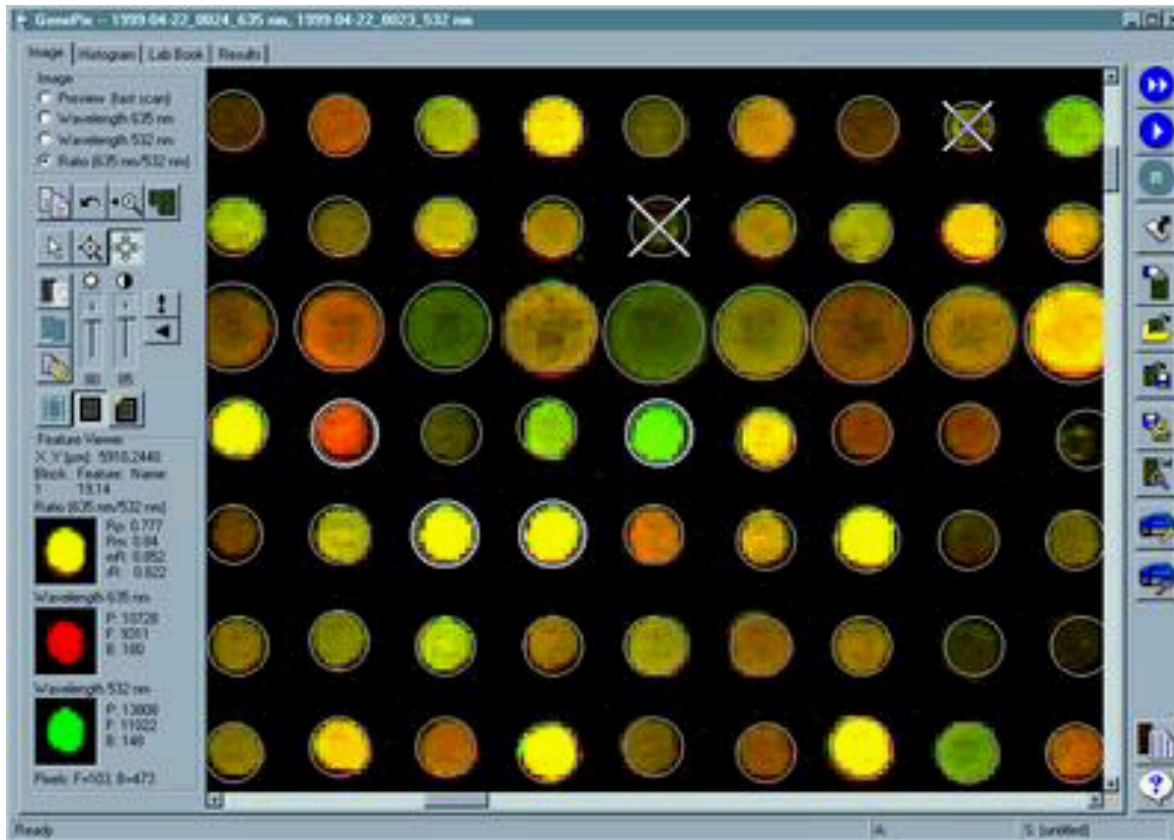
Objectives

- **Review of detailed principles of microarrays (methods, data collection)**
- **Understand differences between spotted arrays versus Affy gene chips (advantages/disadvantages)**
- **Steps to doing microarrays and possible sources of error**

Measuring Gene Expression*

- **Differential Display**
- **Serial Analysis of Gene Expression (SAGE)**
- **RNA-Seq**
- **RT-PCR (real-time PCR)**
- **Northern/Southern Blotting**
- **DNA Microarrays or Gene Chips**

Microarrays



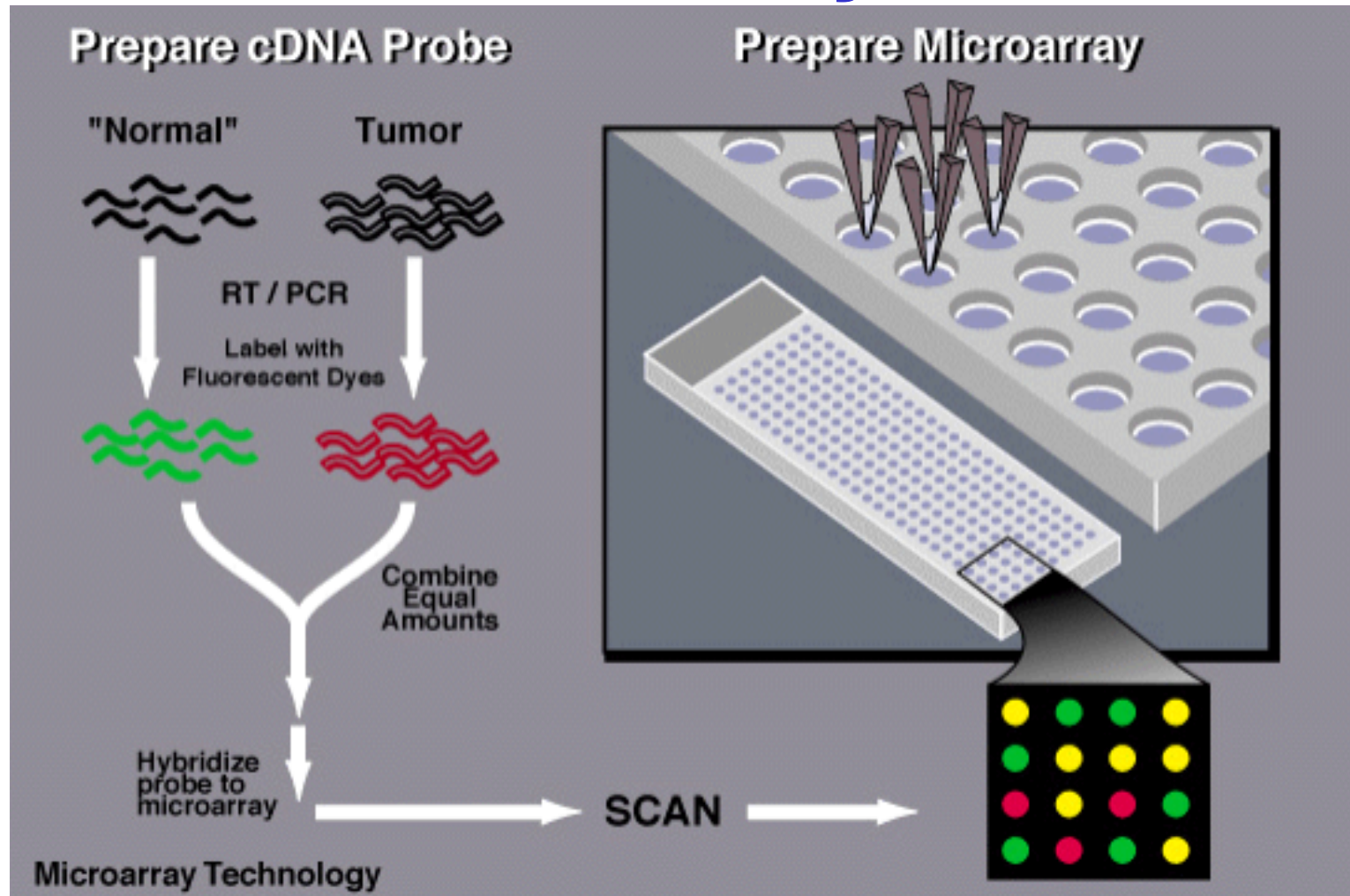
DNA Microarrays*

- **Principle is to analyze gene (mRNA) or protein expression through large scale non-radioactive Northern (RNA) or Southern (DNA) hybridization analysis**
- **Essentially high throughput Northern Blotting method that uses Cy3 and Cy5 fluorescence for detection**
- **Allows expressional analysis of up to 20,000 genes simultaneously**

Four Types of Microarrays*

- **Photolithographically prepared short oligo (20-25 bp) arrays (1 colour)**
- **Spotted glass slide cDNA (500-1000 bp) arrays (2 colour)**
- **Spotted nylon cDNA (500-1000 bp) arrays (1 colour/radioactive)**
- **Spotted glass slide oligo (30-70 bp) arrays (1 or 2 colour)**

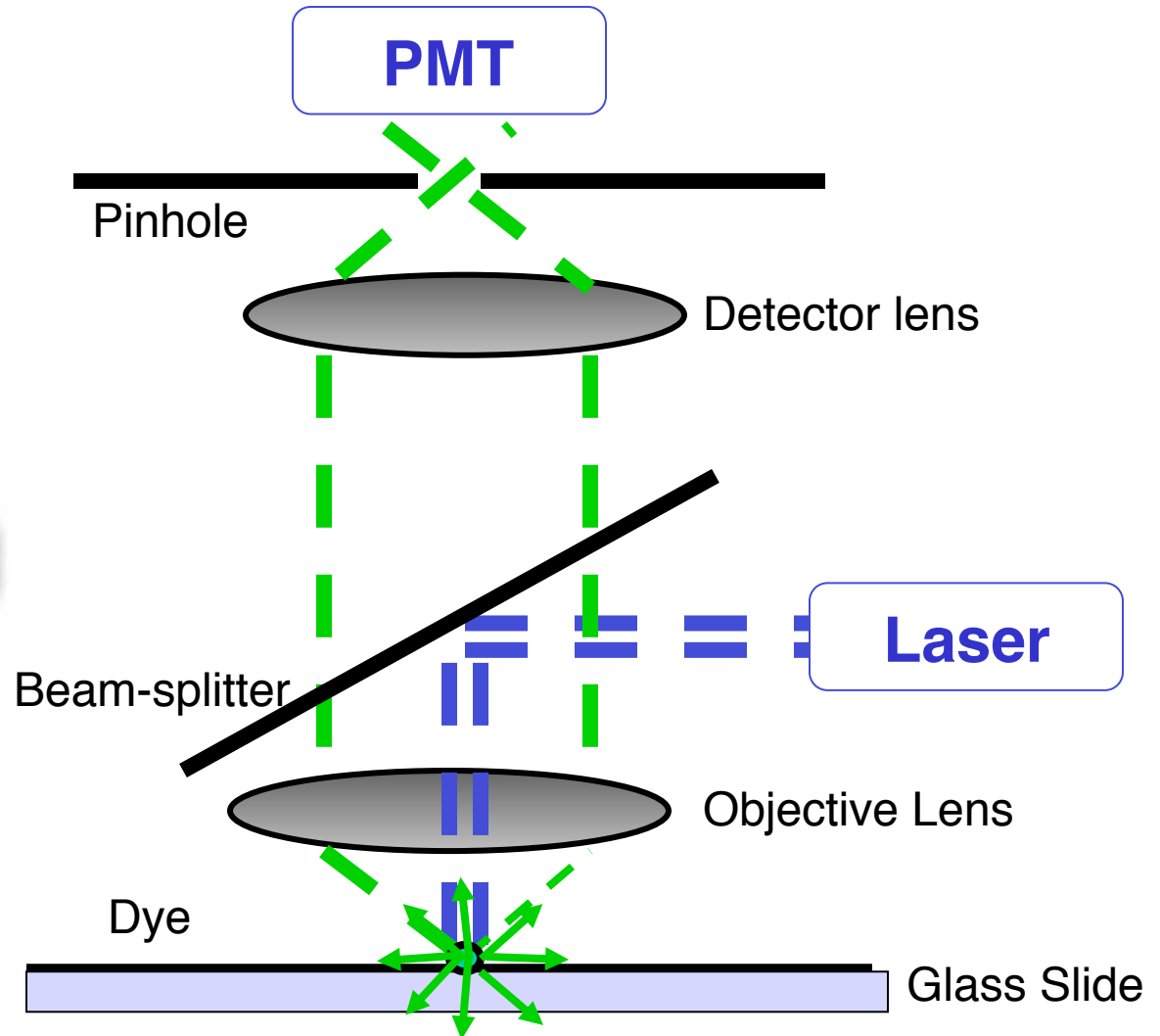
Principles of 2 Colour Microarrays*



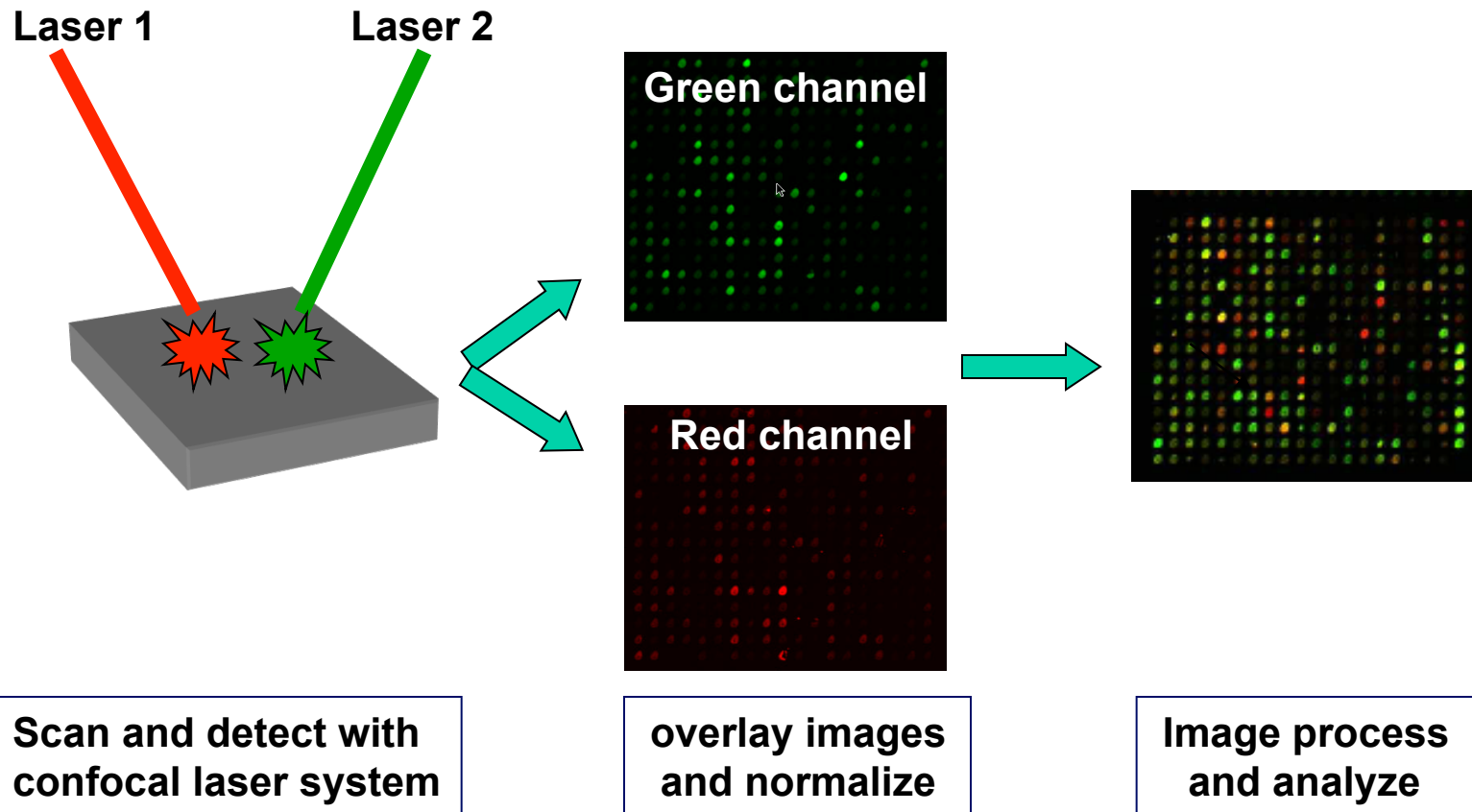
Microarray Definition of Probe and Target

- There are two acceptable and completely opposite definitions. We will use:
- **Target** = the DNA that is spotted on the array
- **Probe** = the DNA that is labeled with the fluorescent probe

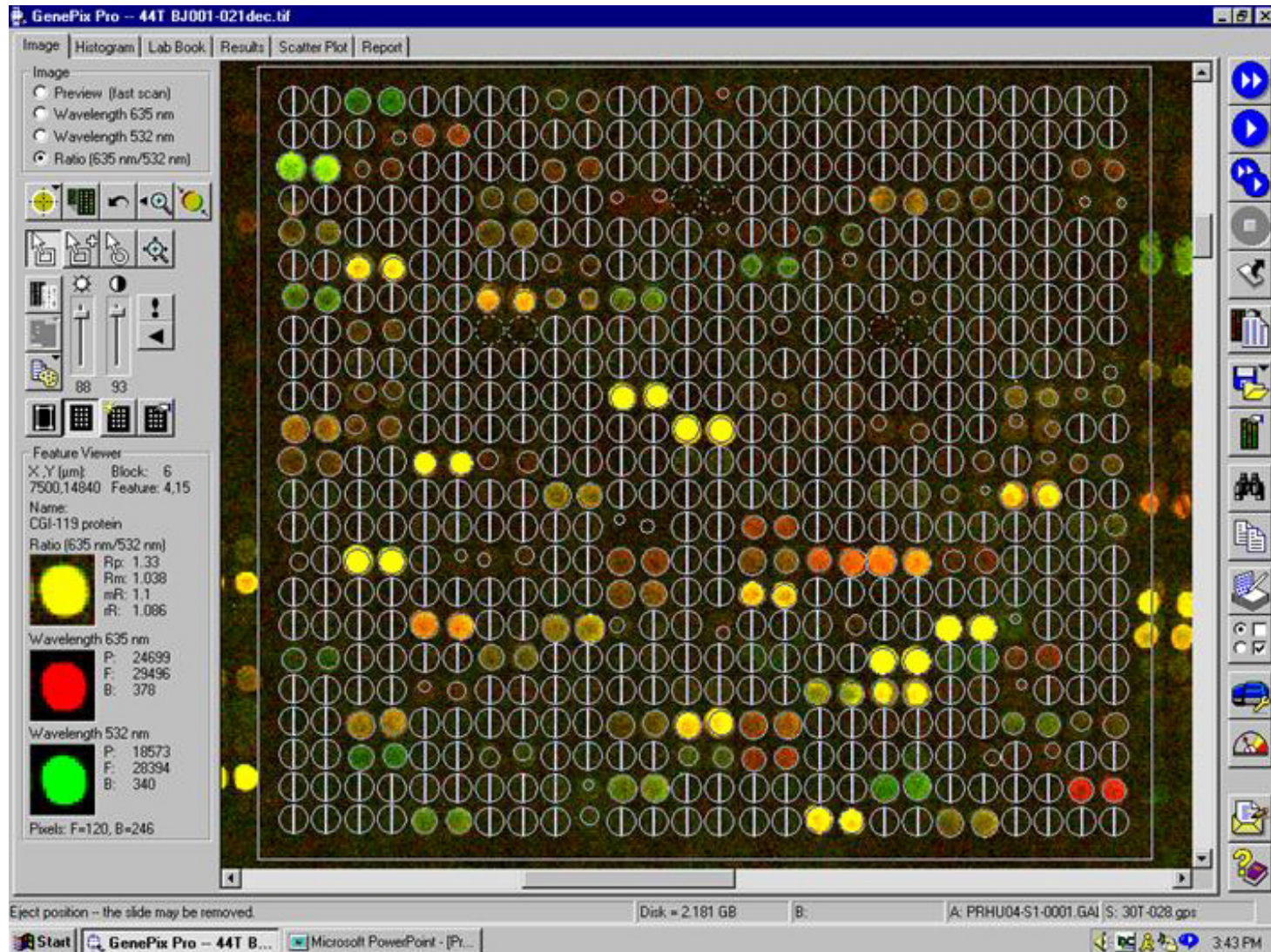
Microarray Scanning



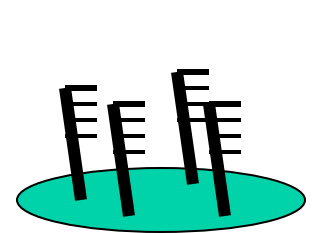
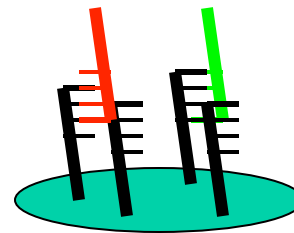
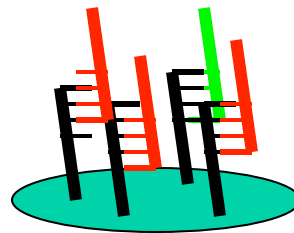
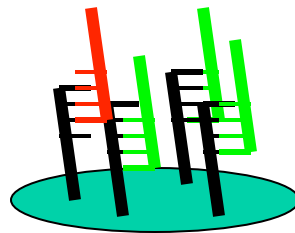
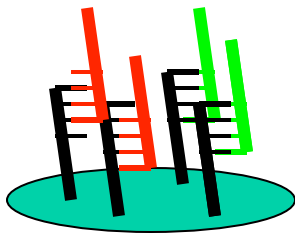
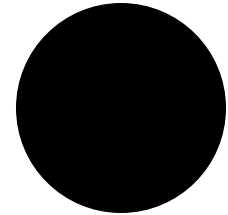
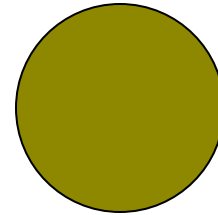
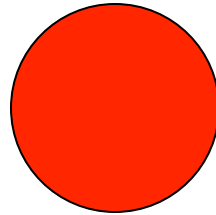
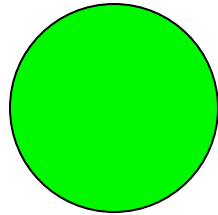
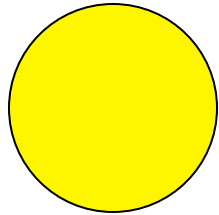
2-Colour Microarray Principles*



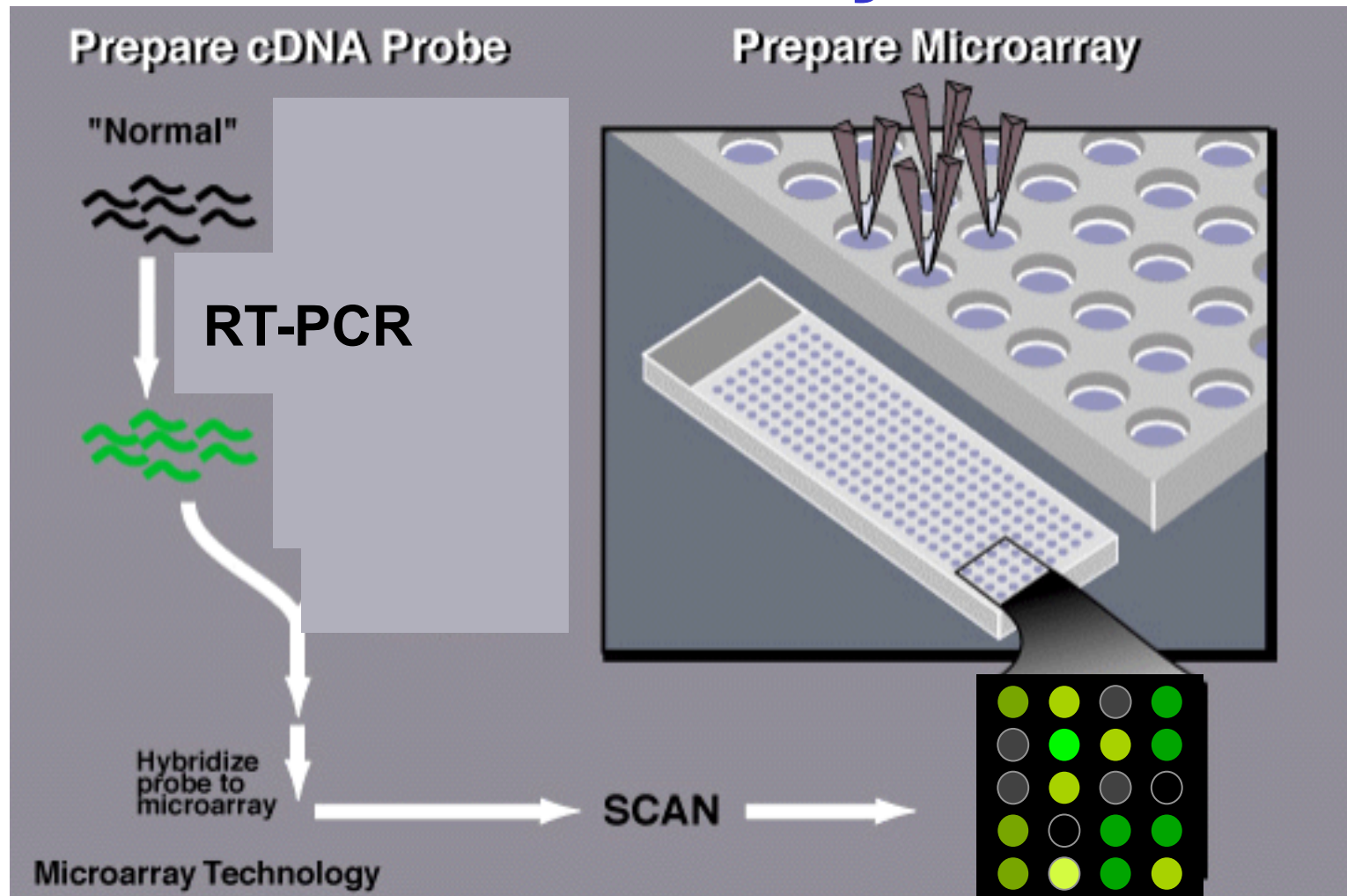
Typical 2-Colour Data



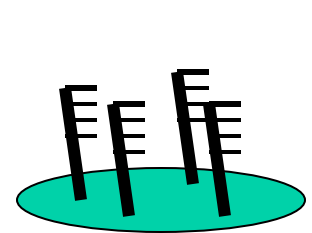
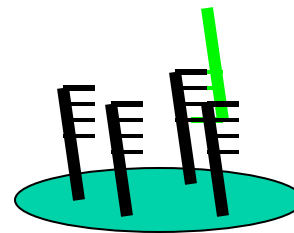
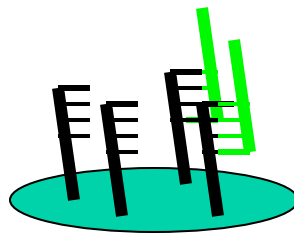
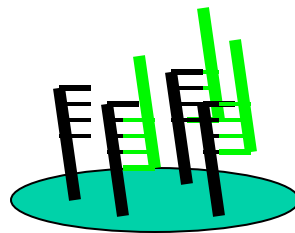
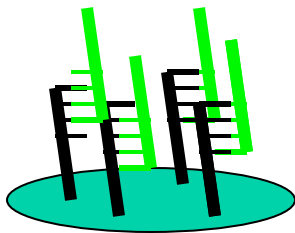
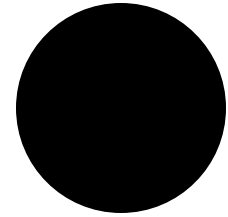
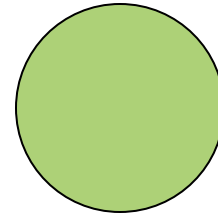
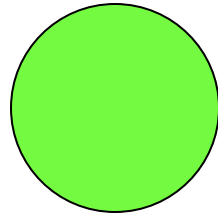
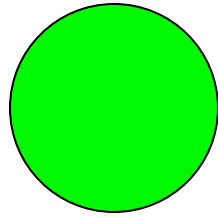
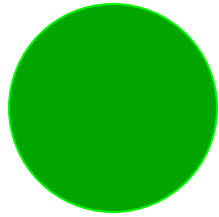
Microarrays & Spot Colour*



Principles of 1 Colour Microarrays



Microarrays & Spot Colour*



Two Colour vs. One Colour

- **Two-colour hybridization eliminates artifacts due to variation in:**
 - quantity of DNA spotted
 - stringency of hybridization
 - local concentration of label
- **However,**
 - both samples ***must*** label with equivalent efficiency
 - Information is lost for genes not expressed in the reference or control sample

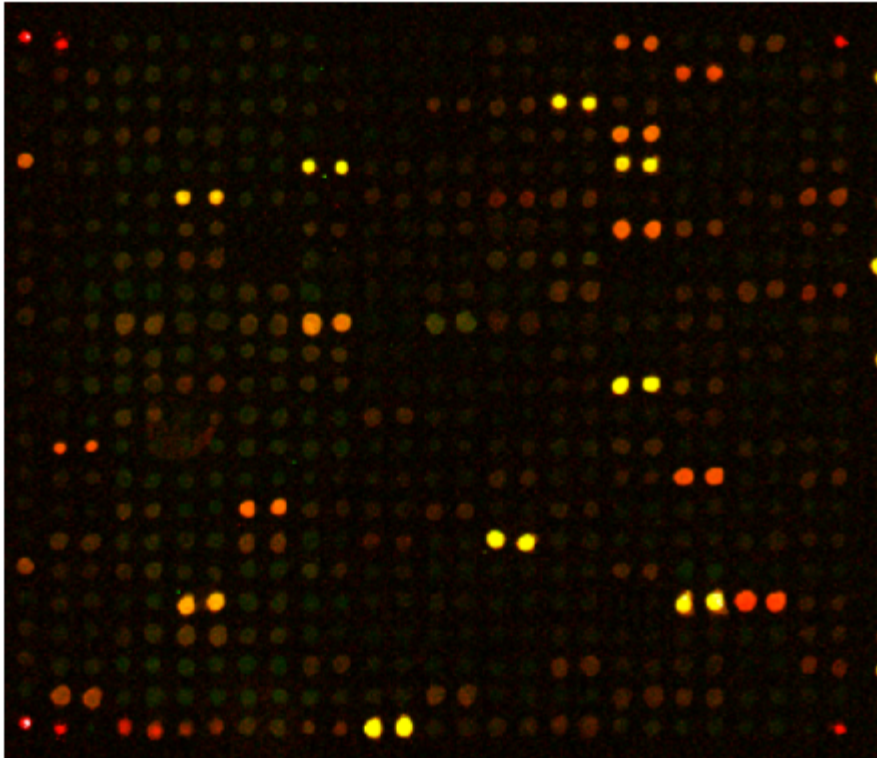
Two Colour vs. One Colour

- **One-colour hybridization may have artifacts due to variation in:**
 - quantity of DNA spotted
 - stringency of hybridization
 - local concentration of label
- **However good quality control (QC) means,**
 - fewer artifacts
 - less manipulation, lower cost
 - reduced loss of information (due to reference sample transcript content)

Specific Arrays of Interest

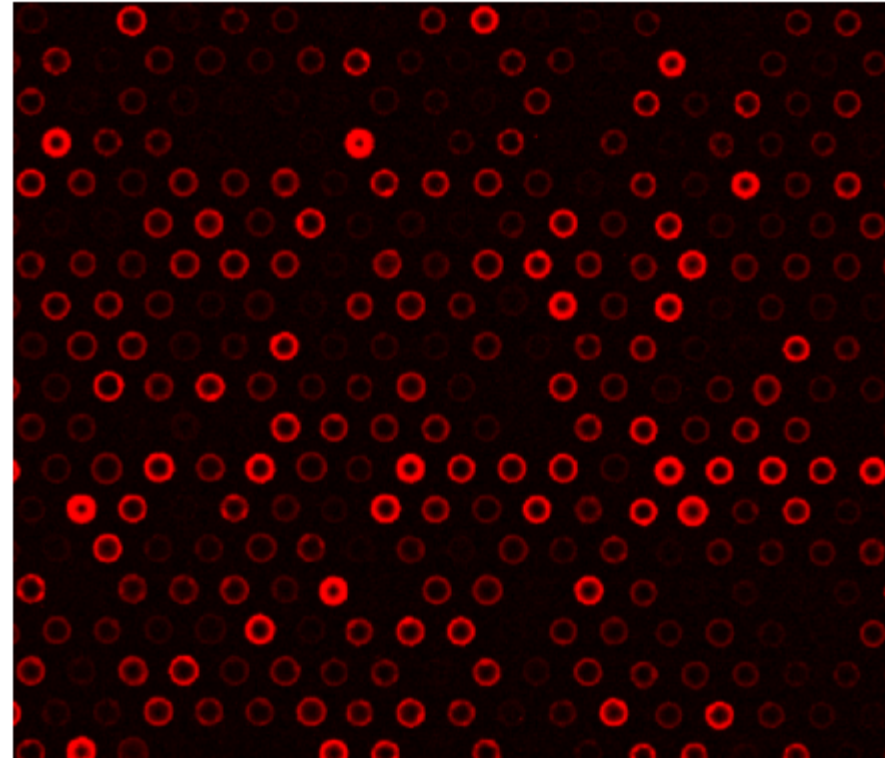
- **Home-made Spotted Oligo Arrays**
 - Made using glass slides, Operon oligos and robotic spotting equipment
- **Applied Microarrays CodeLink Arrays**
 - Made using specially treated slides, QC'd oligos and robotic spotting equipment
- **Affymetrix Gene Chips**
 - Made using photolithographically produced systems with multi-copy oligos

Array Images*



Oligo Microarray

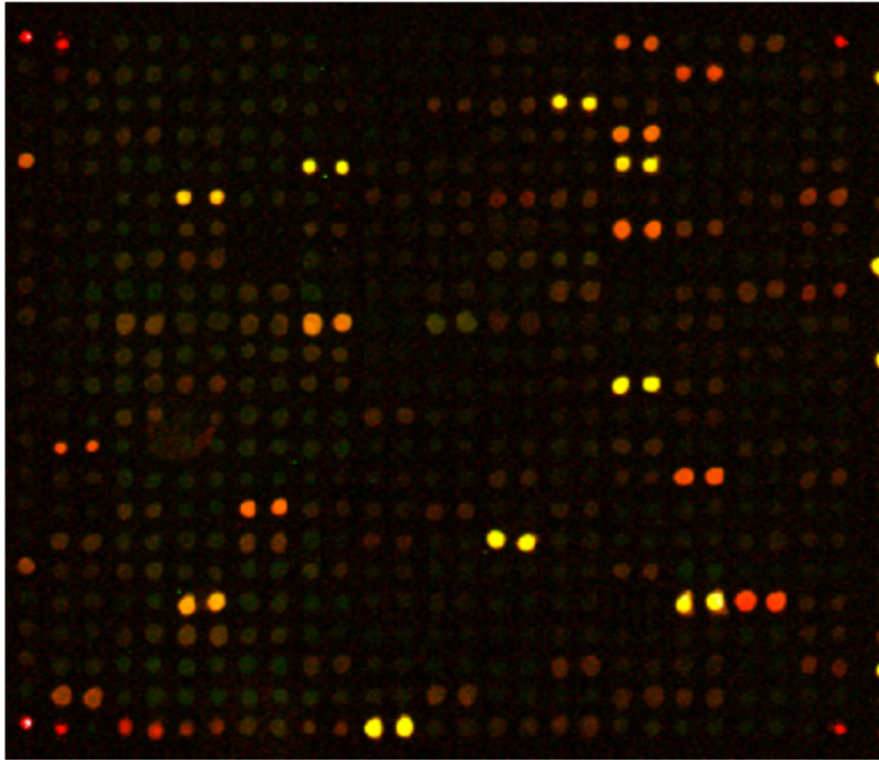
2 colour



Applied Microarrays

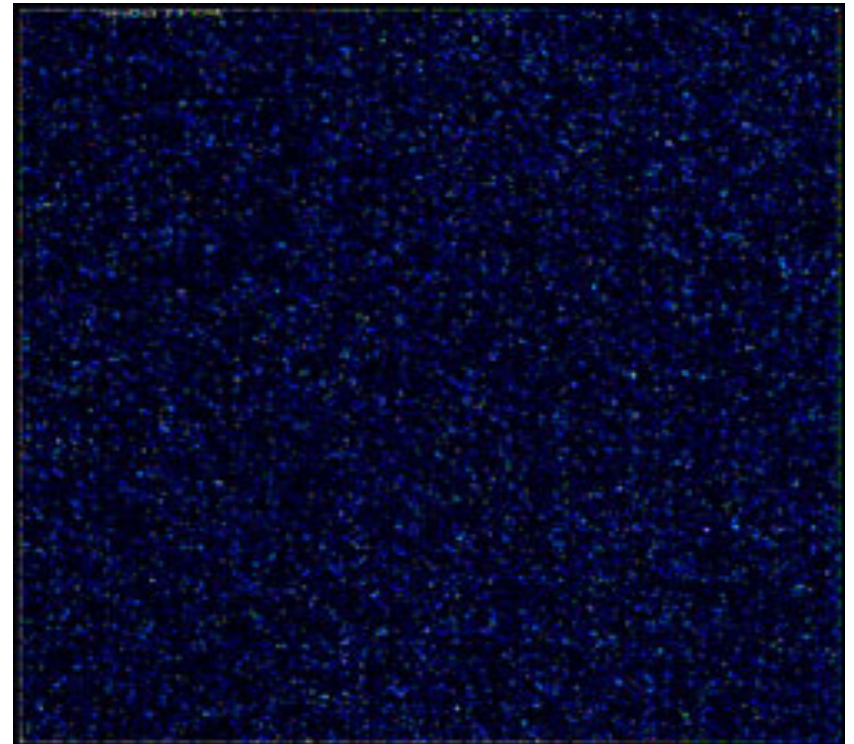
1 colour

Array Images*



Oligo Microarray

2 colour



Affymetrix Gene Chip

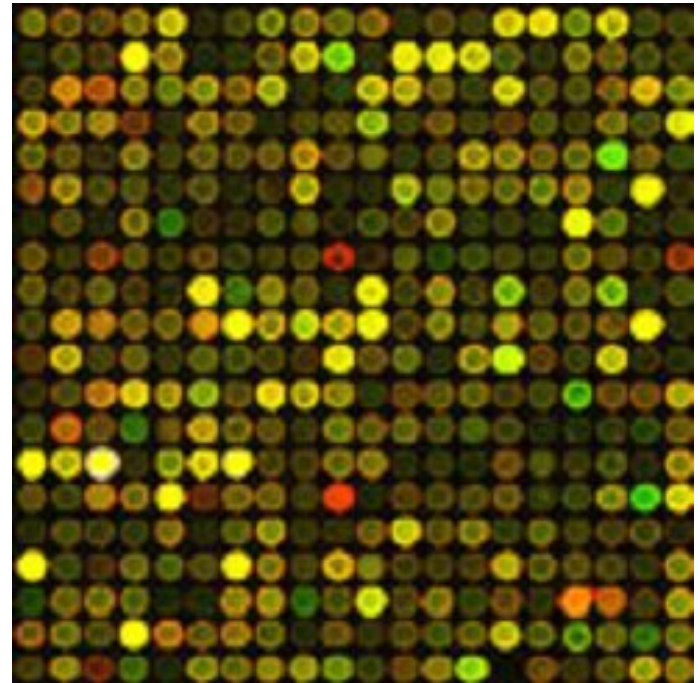
1 colour

Home-made Spotted Arrays

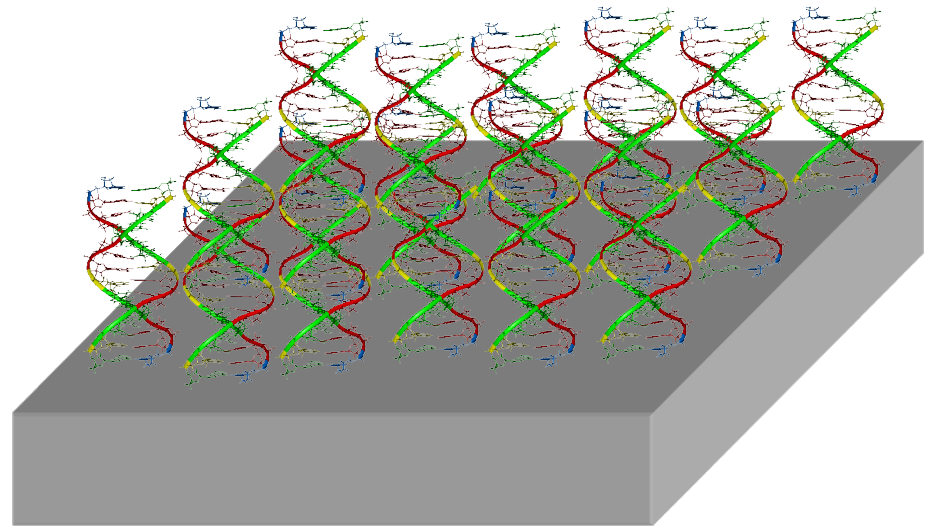
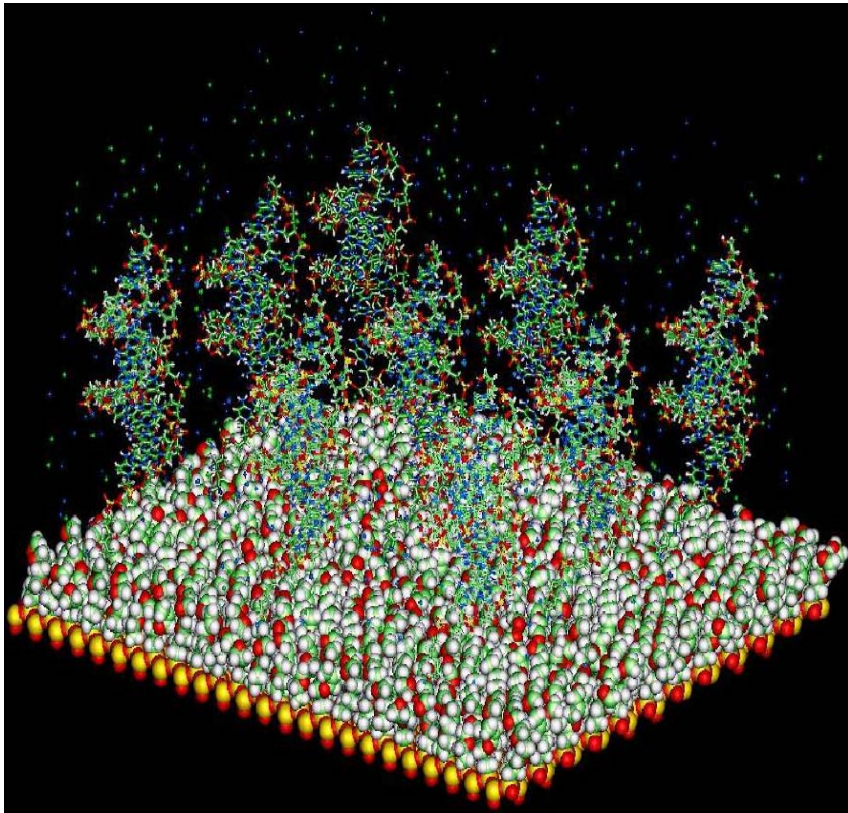


Spotted Microarrays*

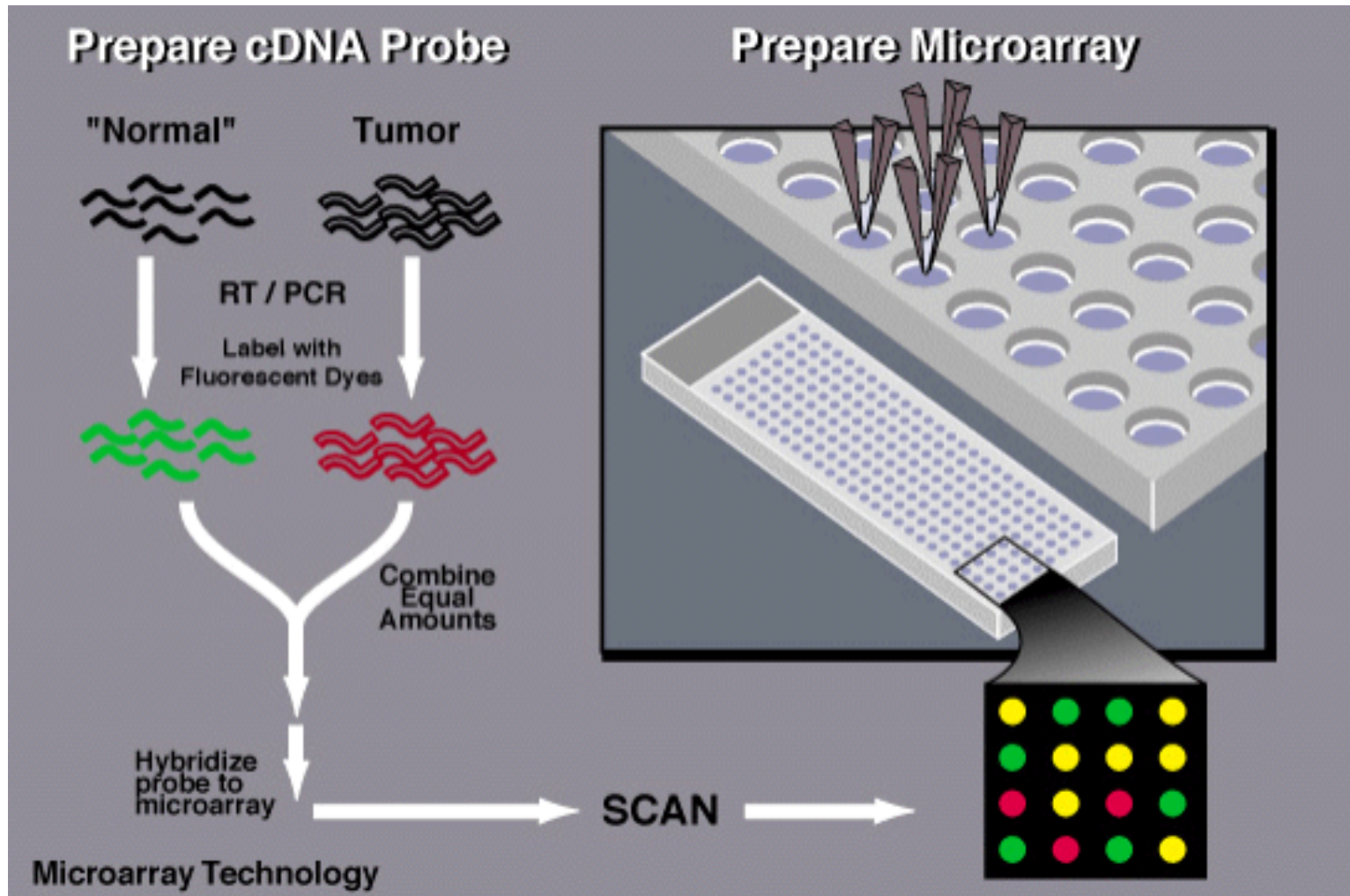
- Target spots are $>100\mu\text{m}$ and are usually deposited on glass
- Targets can be:
 - oligos (usually $>40\text{mers}$)
 - PCR fragments from cDNA/EST or genomic templates (rarely done)
- Not reused; 2-colour hybridizations



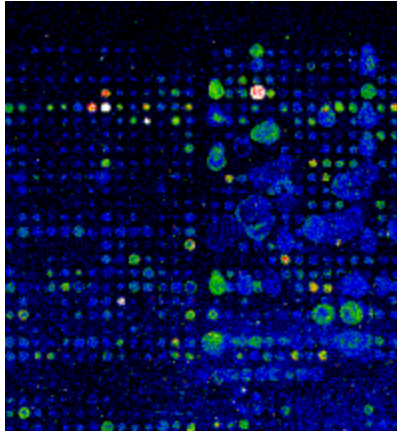
Standard Spotted Array



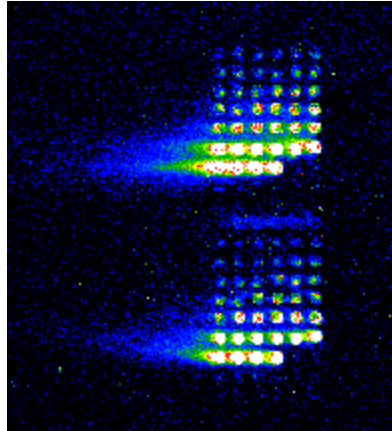
Home-made Microarrays



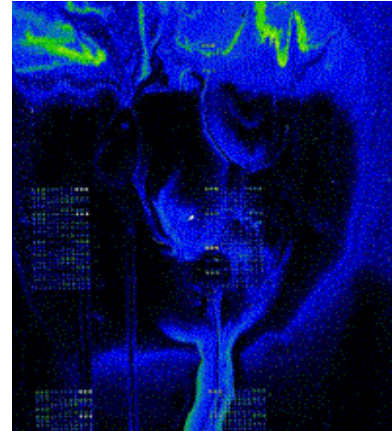
Common Home-made Microarray Errors*



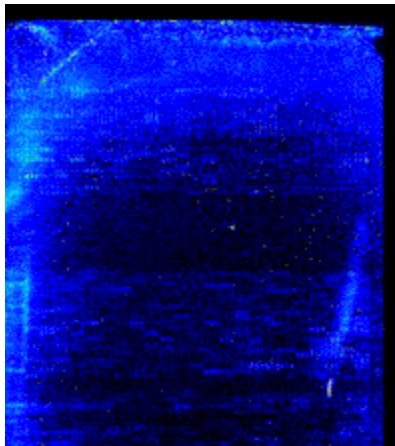
Irregular Spot



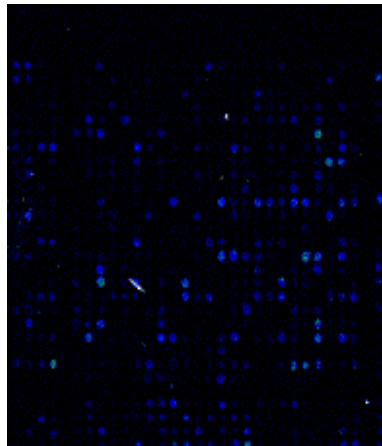
Comet Tail



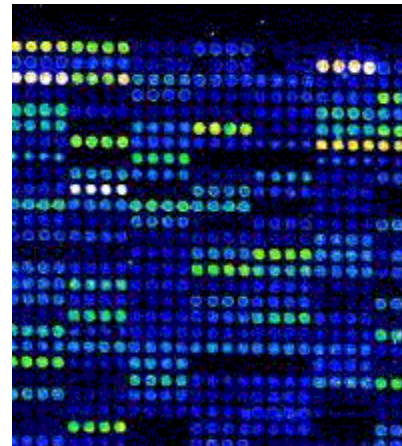
Streaking



Hi Background



Low Intensity

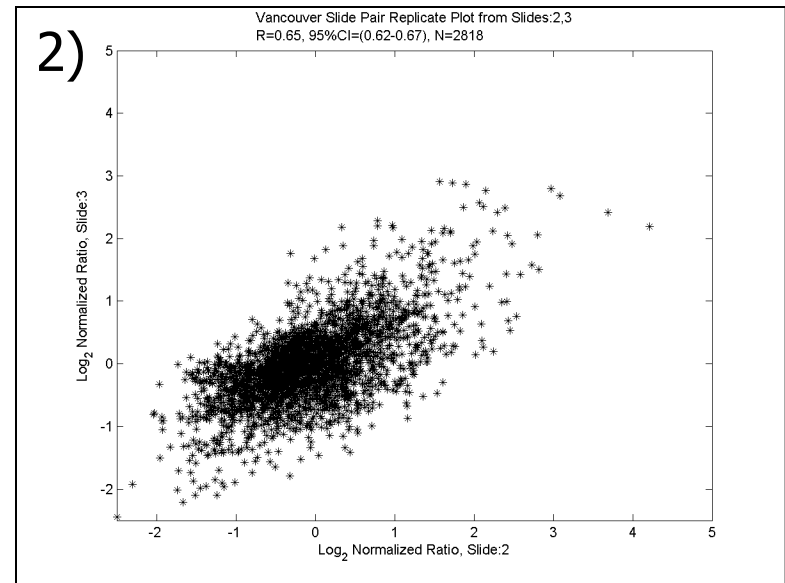
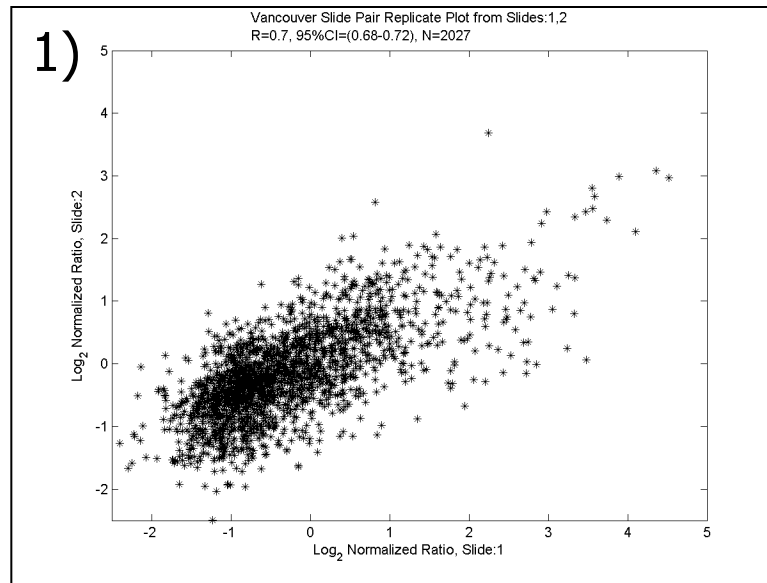


A Good Array

Testing Reproducibility

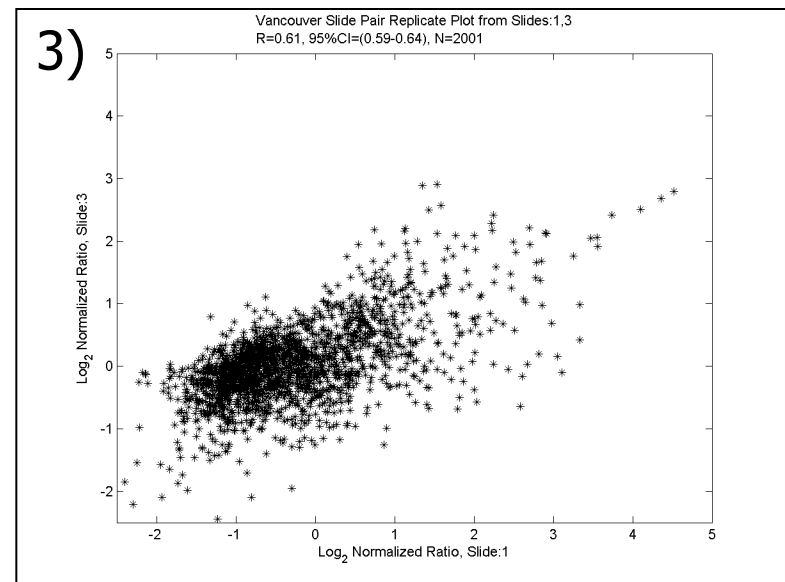
- **Breast tumor tissue biopsy**
- **mRNA prepared using standard methods**
- **Control sample made from pooled mRNA from several cell types**
- **3 RNA samples prepared from 1 tissue source – arrayed onto two sets of home-made chips from different suppliers**
- **Conducted pairwise comparison of intensity correlations & no. of spots**

Home-made Arrays

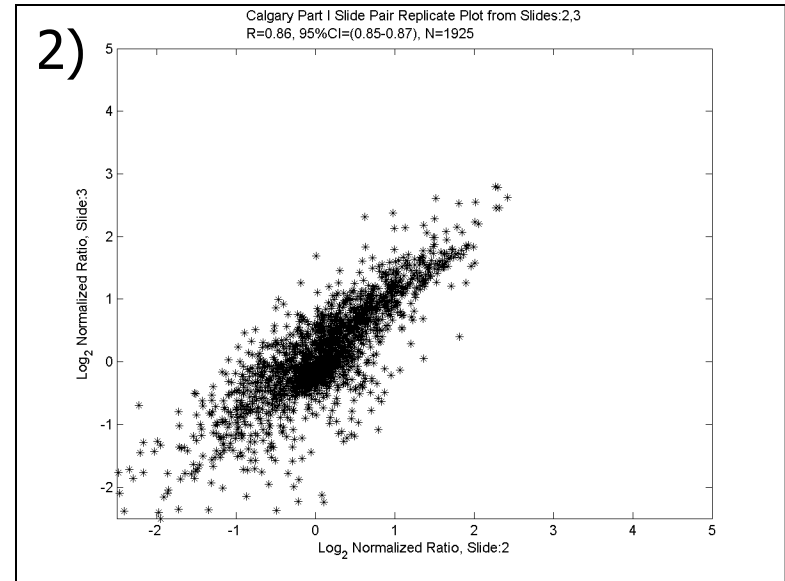
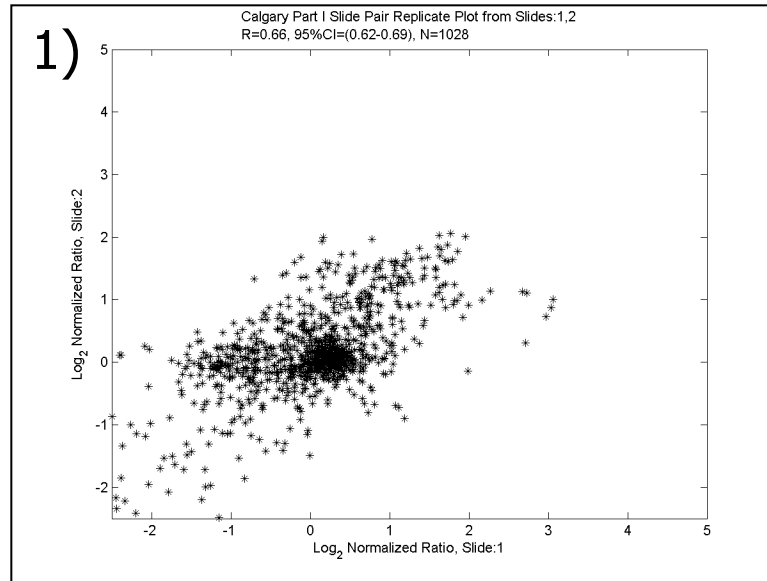


Oligo Microarray 1

1) R=0.7	95%CI=(0.68-0.72)	N=2027
2) R=0.65	95%CI=(0.62-0.67)	N=2818
3) R=0.61	95%CI=(0.59-0.64)	N=2001

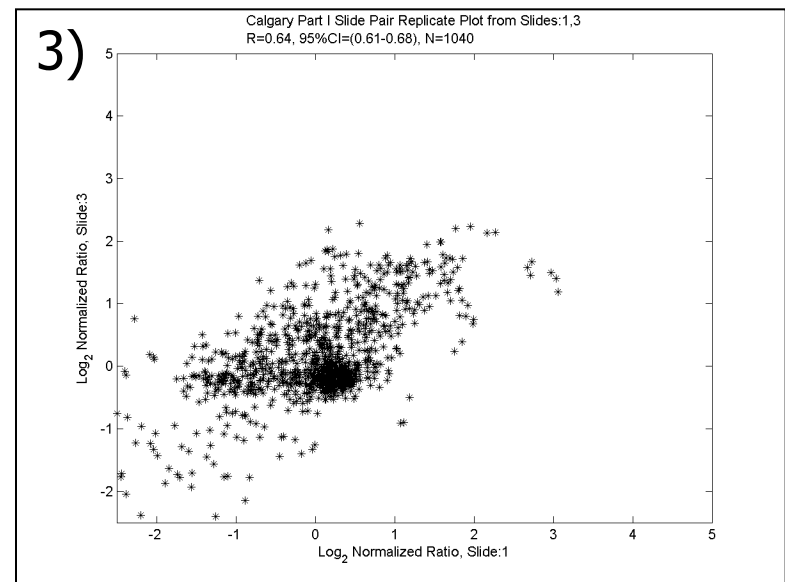


Home-made Arrays



Oligo Microarray 2

1) R=0.66 95%CI=(0.62-0.69) N=1028
2) R=0.86 95%CI=(0.85-0.87) N=1925
3) R=0.64 95%CI=(0.61-0.68) N=1040



Advantages to Home-made Systems*

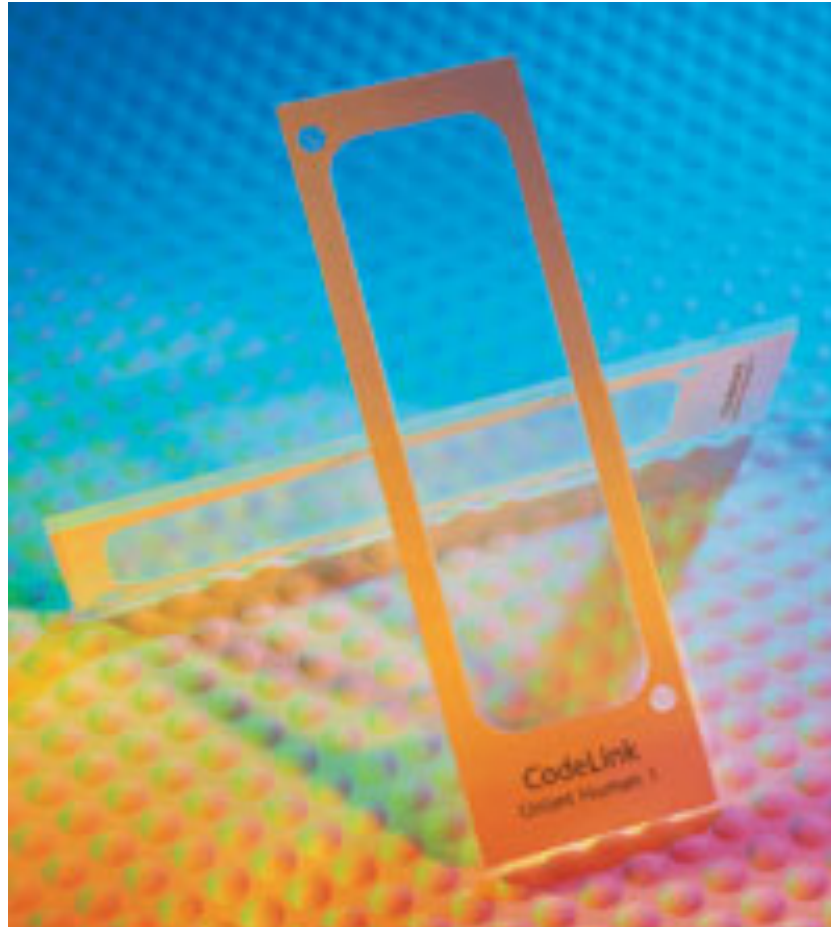
- **Cheapest method to produce arrays (\$100 to \$300/slide)**
- **Allows lab full control over design and printing of arrays (customizable)**
- **Allows quick adaptation to new technologies, new target sets**
- **Allows more control over analysis**

Disadvantages to Home-made Systems*

- **Quality and quality-control of oligo target set is highly variable**
- **Quality of spotting and spot geometry is highly variable**
- **Technology is very advanced, difficult and expensive to maintain (robotics)**
- **Reproducibility is poor**

Applied Microarrays

CodeLink Arrays



Applied Microarrays

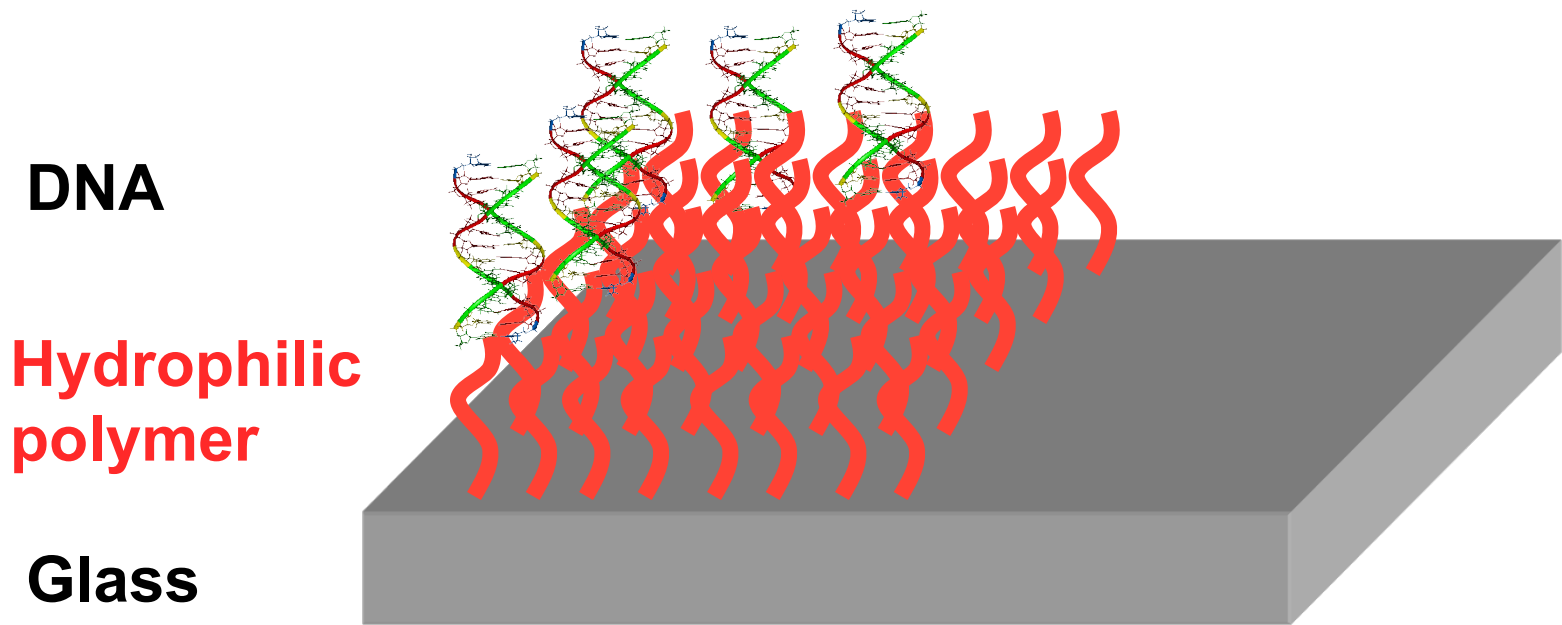
CodeLink Arrays

- Applied Microarrays synthesizes its 30-nucleotide oligos offline, tests them by mass spectrometry, deposits them on specialty coated (polyacrylamide) array, and then assays them for quality control
- Uses a special Flex Chamber™—a disposable hybridization chamber already attached to the slide to improve hybridization consistency

Applied Microarrays

CodeLink

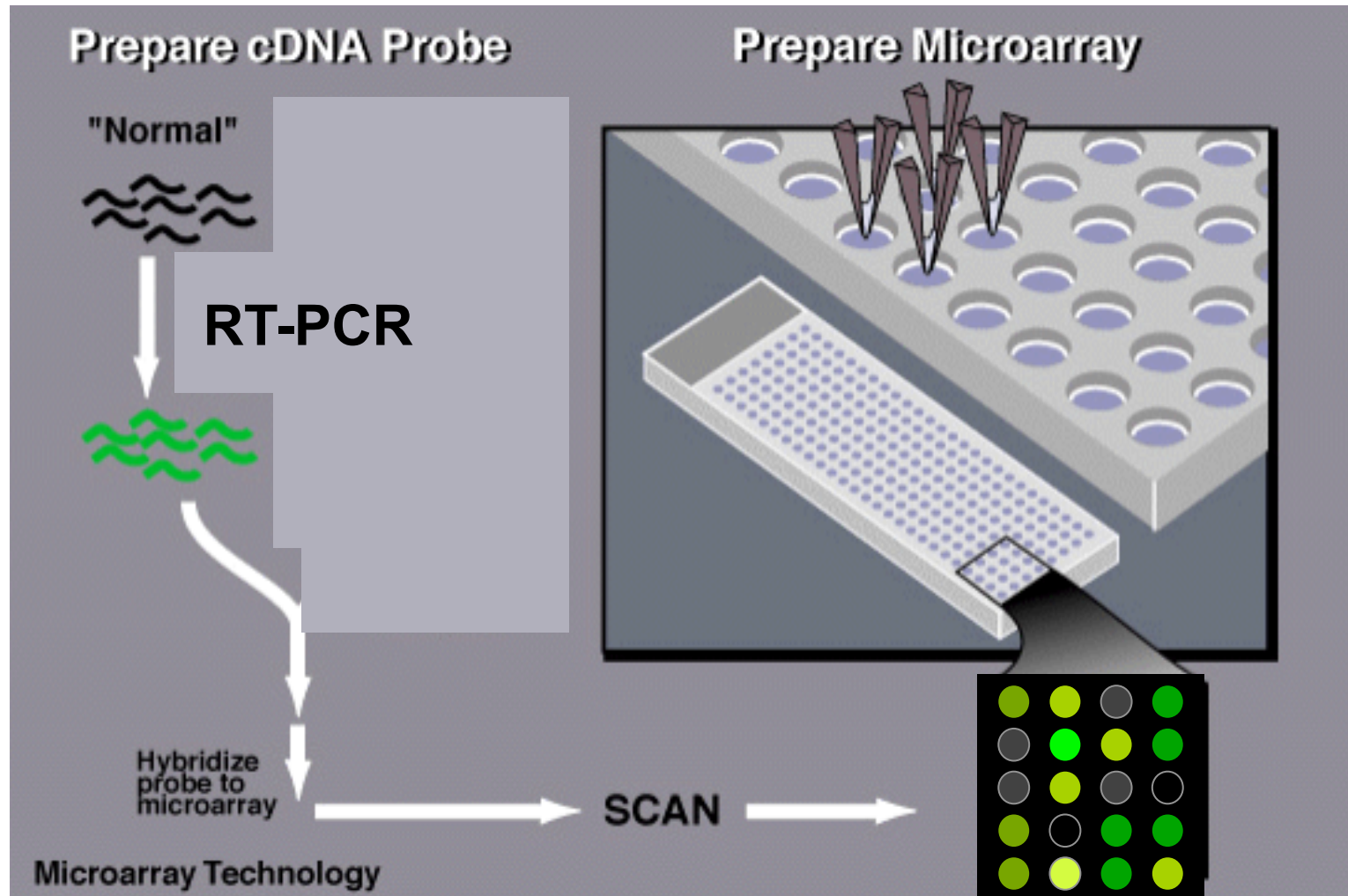
Oligo Chip



CodeLink Special Coating

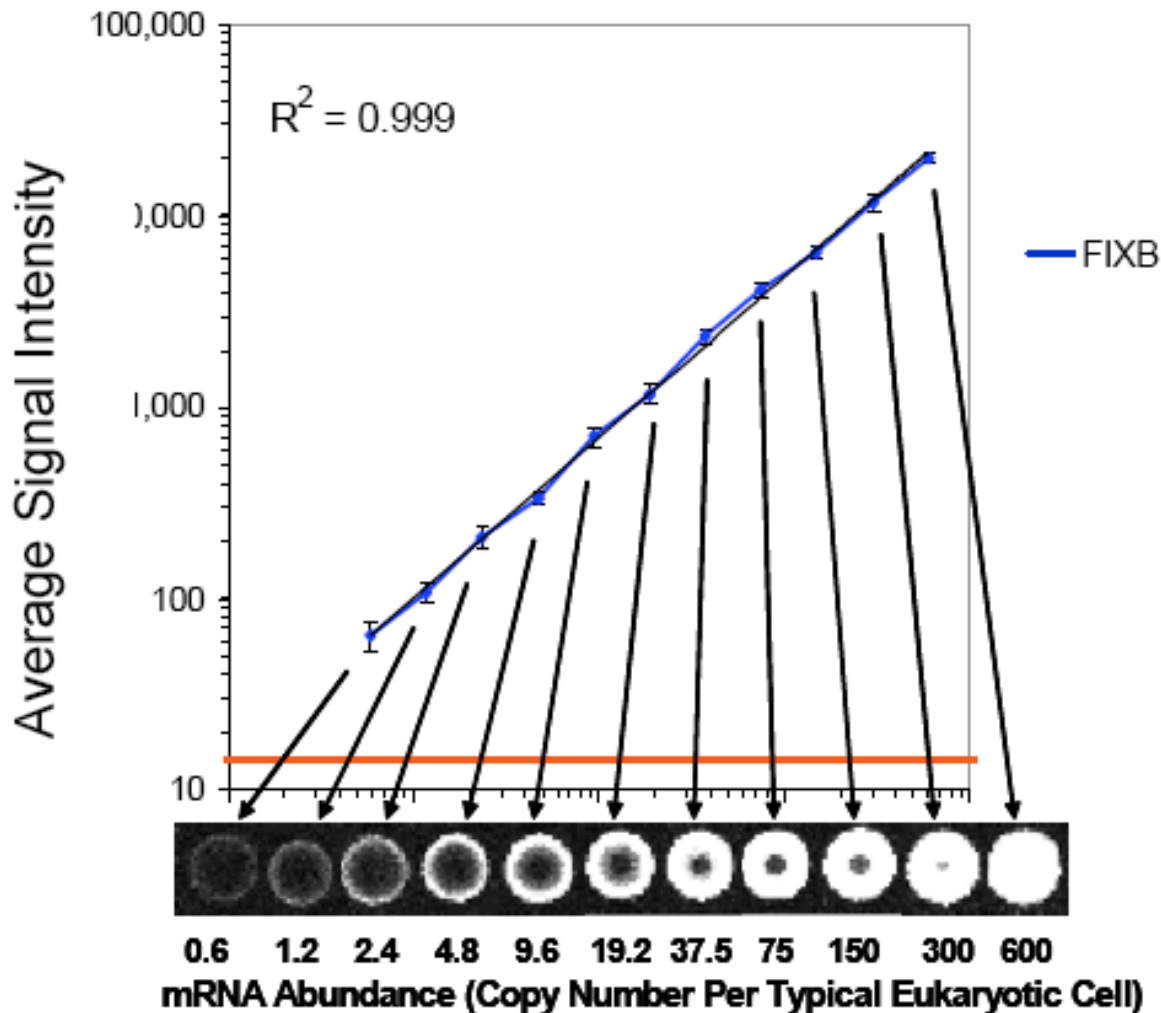
- **Most glass substrates are quite hydrophobic**
- **This hydrophobicity affects the local binding and surface chemistry of most glass-slide chips making most of the attached DNA oligo inaccessible**
- **Coating the slide with a hydrophilic polymer allows the cDNA to pair up with the substrate oligos much better**

Applied Microarrays Array



Morphology Does Not Affect Dynamic Range

CodeLink Bioarrays Can Achieve Linearity Across 3 Logs*



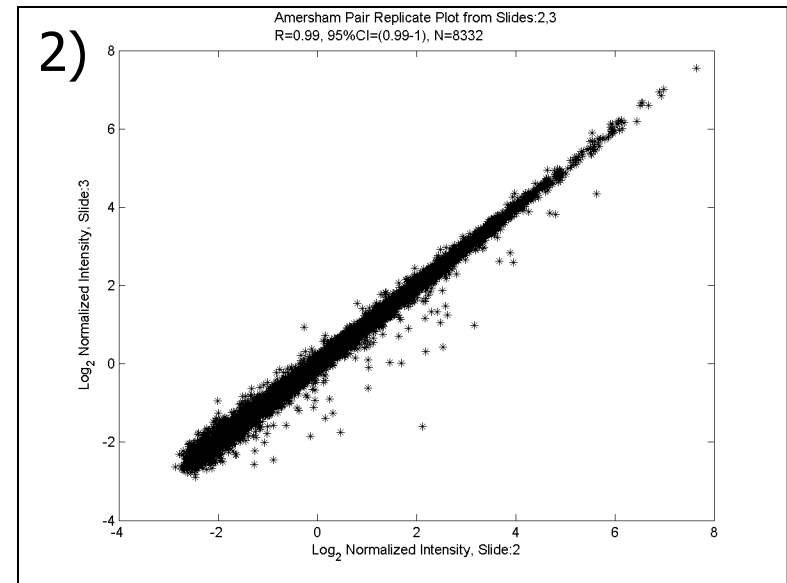
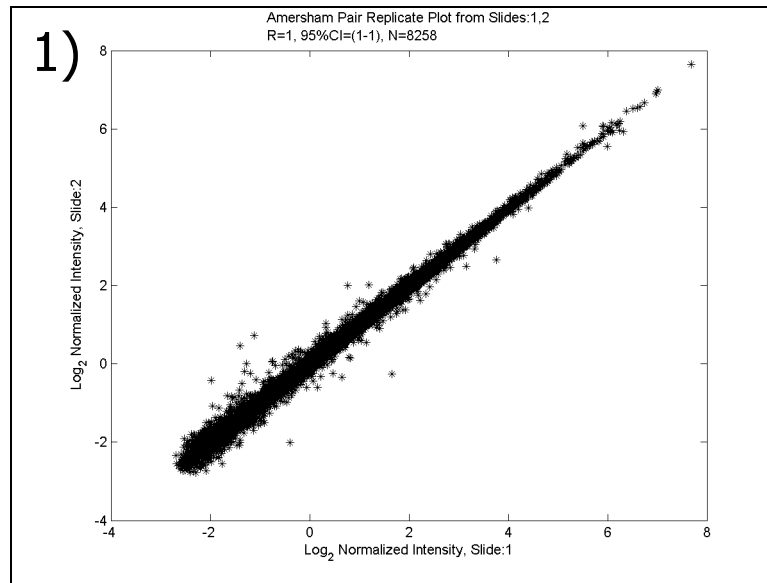
- The red line indicates the signal level for non-spiked target.
- Error bars represent one standard deviation for each mean (n=18) signal

*Data obtained from cRNA dilution series.

Testing Reproducibility

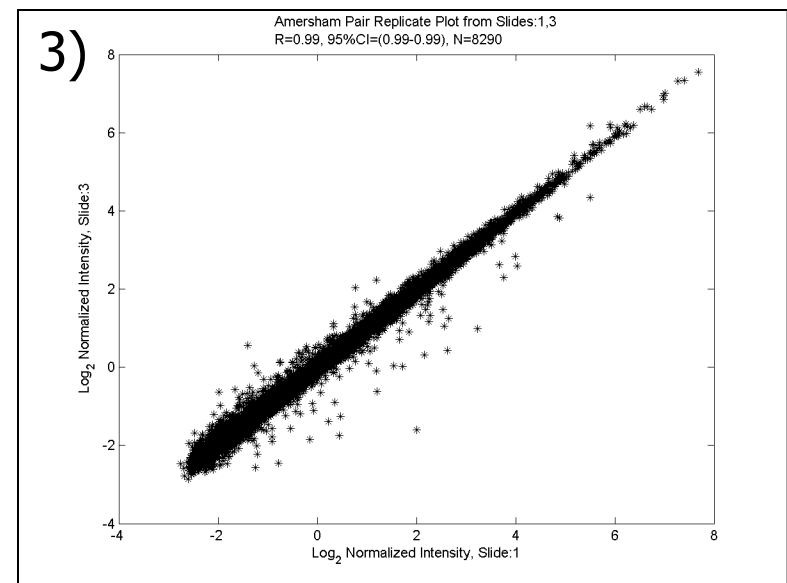
- **Breast tumor tissue biopsy**
- **mRNA prepared using standard methods**
- **3 RNA samples prepared from 1 tissue source – arrayed onto 3 different sets of CodeLink chips**
- **Conducted pairwise comparison of intensity correlations, intensity ratio correlations & number of “passed” spots**

Intensity, Pairwise Comparisons

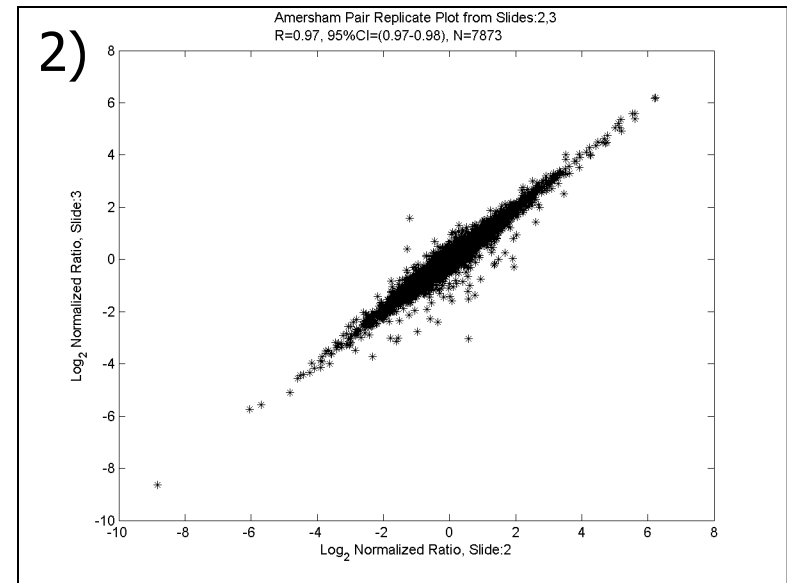
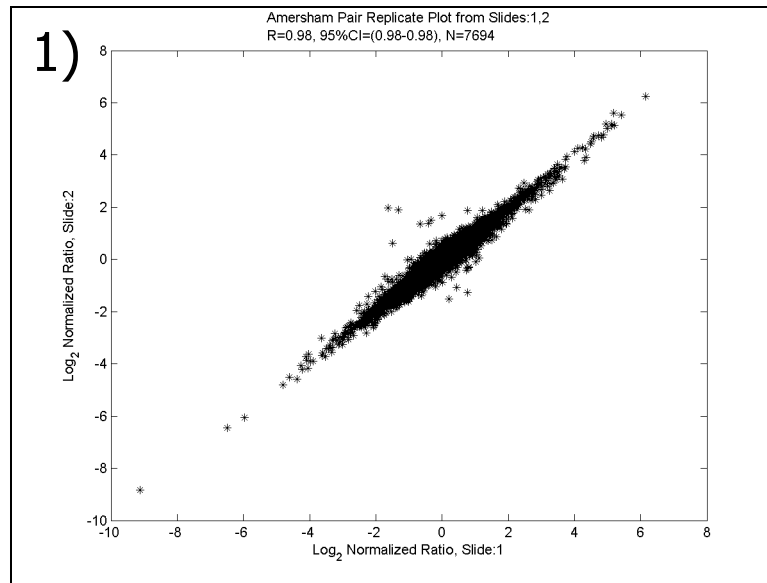


Applied Microarrays Slides

1)	R=1	95%CI=(1-1)	N=8258
2)	R=0.99	95%CI=(0.99-1)	N=8332
3)	R=0.99	95%CI=(0.99-0.99)	N=8290

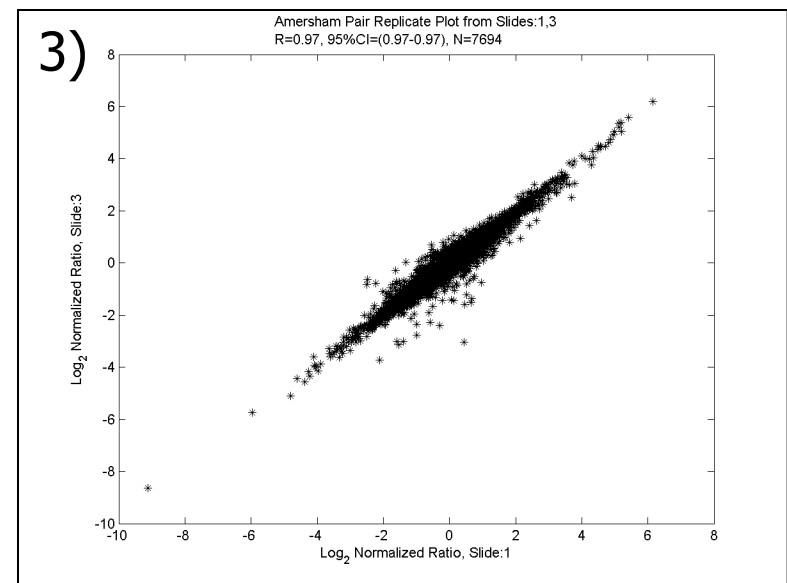


Ratio, Pairwise Comparisons



Applied Microarrays Slides

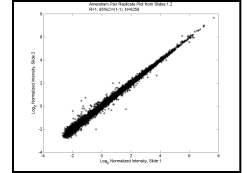
- 1) R=0.98 95%CI=(0.98-0.98) N=7694
- 2) R=0.97 95%CI=(0.97-0.98) N=7873
- 3) R=0.97 95%CI=(0.97-0.97) N=7694



General Comparison

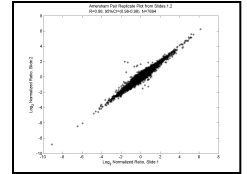
Appl Micro Intensity

1)	R=1	95% CI=(1-1)	N=8258
2)	R=0.99	95% CI=(0.99-1)	N=8332
3)	R=0.99	95% CI=(0.99-0.99)	N=8290



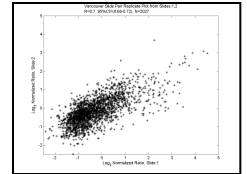
Appl Micro Ratio

1)	R=0.98	95% CI=(0.98-0.98)	N=7694
2)	R=0.97	95% CI=(0.97-0.98)	N=7873
3)	R=0.97	95% CI=(0.97-0.97)	N=7694



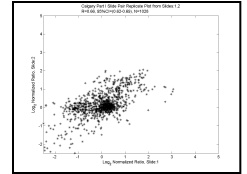
Vancouver

1)	R=0.7	95% CI=(0.68-0.72)	N=2027
2)	R=0.65	95% CI=(0.62-0.67)	N=2818
3)	R=0.61	95% CI=(0.59-0.64)	N=2001



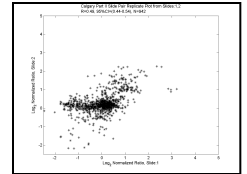
Calgary I

1)	R=0.66	95% CI=(0.62-0.69)	N=1028
2)	R=0.86	95% CI=(0.85-0.87)	N=1925
3)	R=0.64	95% CI=(0.61-0.68)	N=1040



Calgary II

1)	R=0.49	95% CI=(0.44-0.54)	N=942
2)	R=0.81	95% CI=(0.8-0.83)	N=1700
3)	R=0.57	95% CI=(0.52-0.61)	N=973



Comparative Accuracy

GENES	RT-PCR	Spotted Array	CodeLink
	Expression Pattern TaqMan	Expression Pattern Operon	Expression Pattern Applied Micr
hENT1	+	-	+
hENT2	+	-	+
hCNT1	-	-	-
hCNT2	-	+	-
dck	+	-	+
ER	+	-	+

CodeLink Advantages*

- **Exceptional reproducibility because of:**
 - careful target design
 - QC of oligo preparations and spotting
 - high proportion of oligo binding to cDNA substrate due to hydrophilic coating
 - well controlled/uniform hybridization
- **Allows users to continue using same scanners/software as in spotted arrays**

CodeLink

Disadvantages*

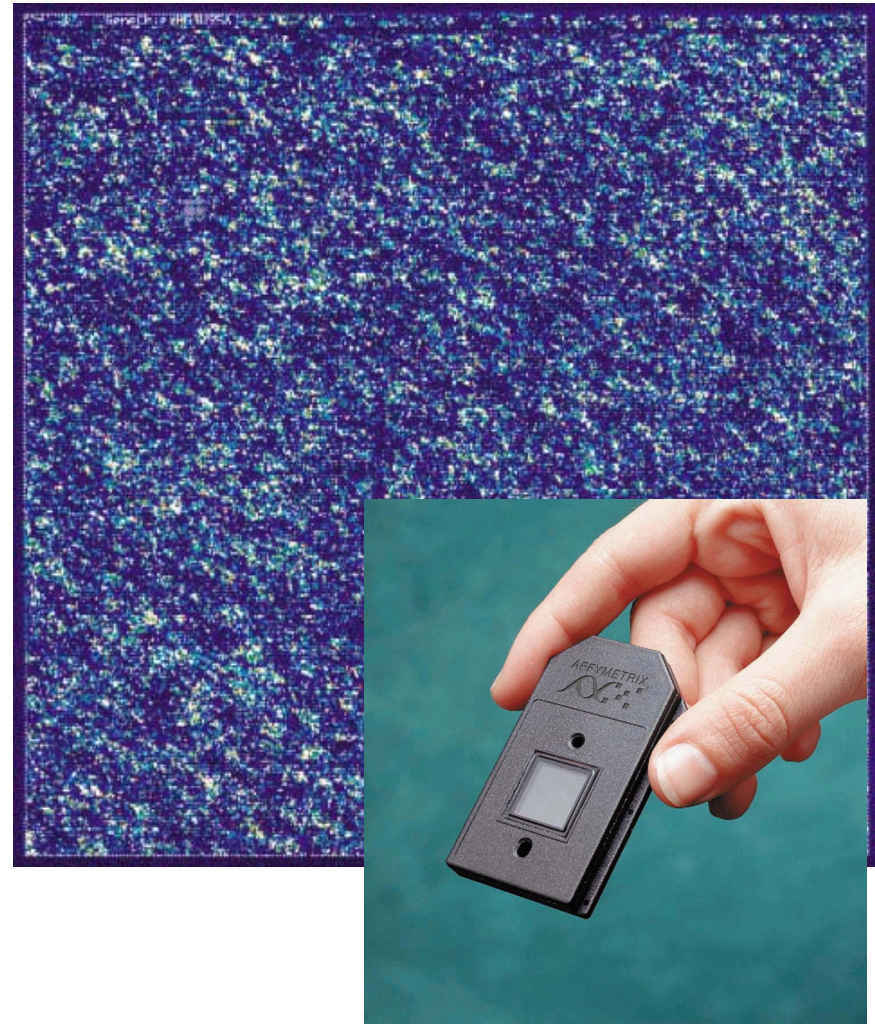
- **Lack of flexibility or customizability (users depend on Applied Microarrays to provide & design chips)**
- **Dependent on proprietary kits and reagents**
- **More expensive than spotted arrays (\$700/chip)**

Cost per Sample in Triplicate

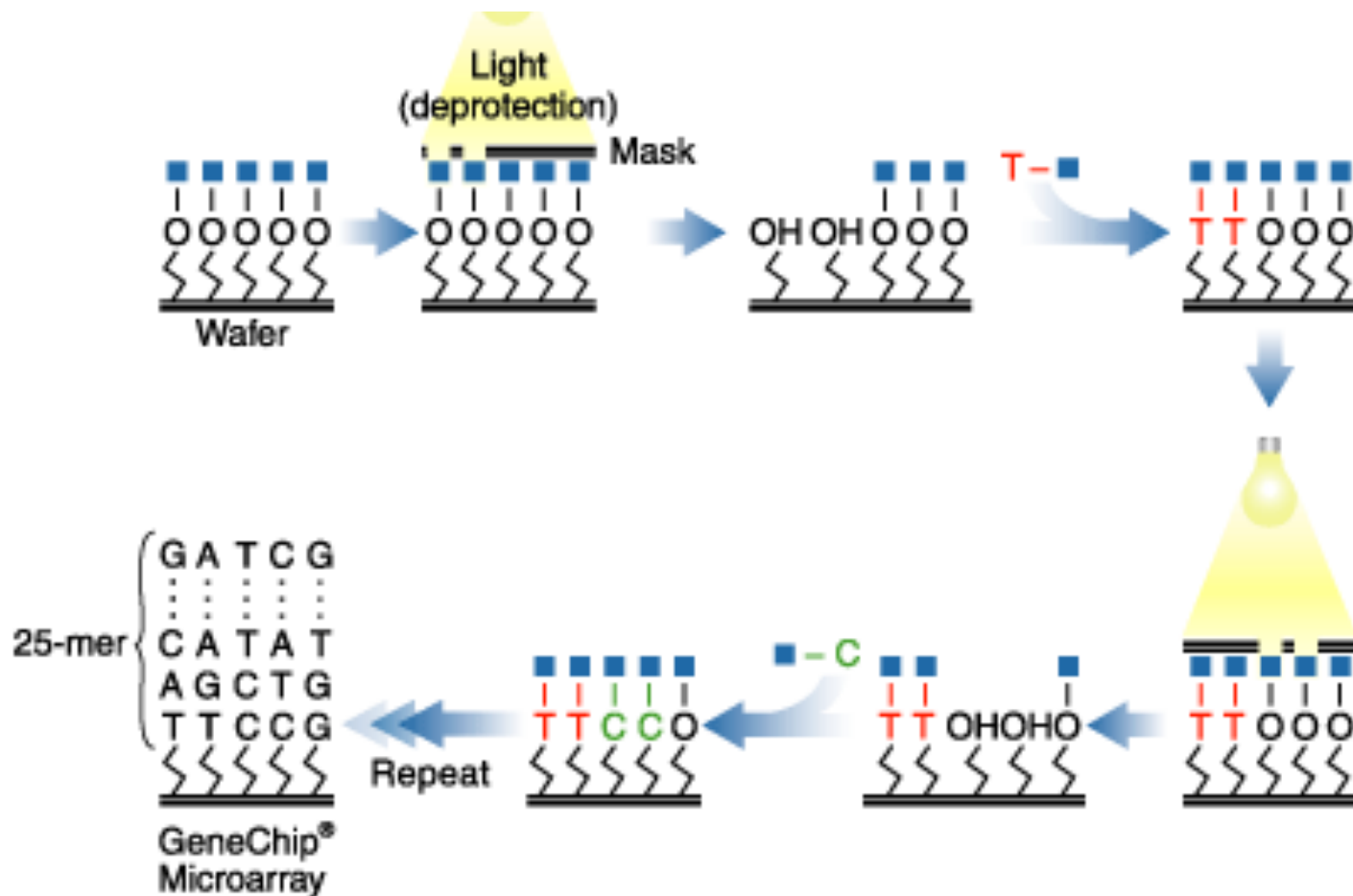
- **Applied Microarrays Slides (single channel)**
 - **\$2000**
- **Vancouver Spotted Arrays (two colour)**
 - **\$800**
- **Calgary Spotted Arrays (two colour)**
 - **\$1100**

Affymetrix Gene Chips*

- Chips are 1.7 cm²
- 400,000 oligo set pairs
- Probe “spots” are 20 μ x 20 μ
- Each target is 25 bases long
- 11-20 “match” targets and 11-20 “mismatch” targets per gene



Affymetrix Gene Chip*



Affy Chip*

Match target 1

Mis-Match target 1

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

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

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

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

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

T T
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A A
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A A
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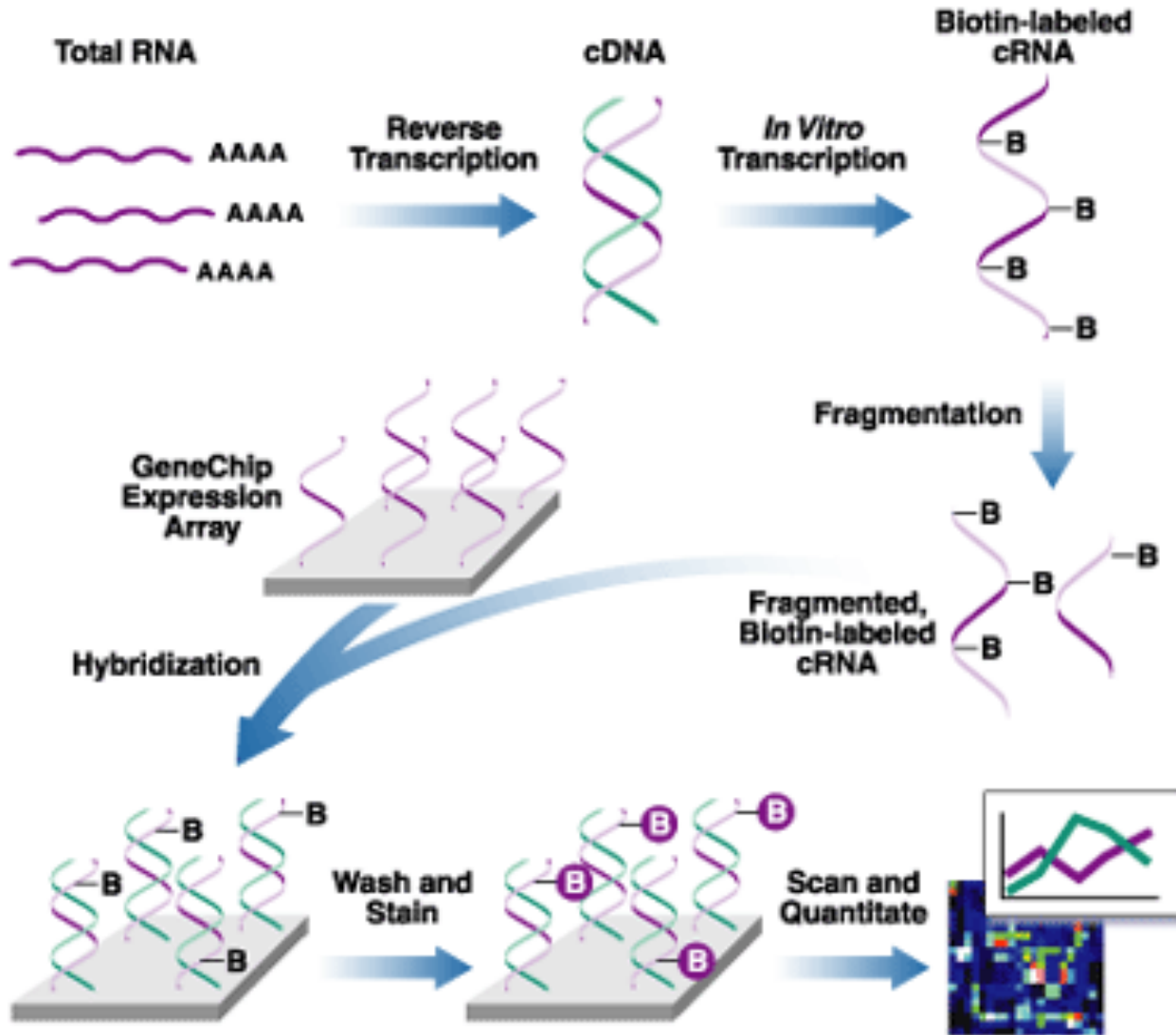
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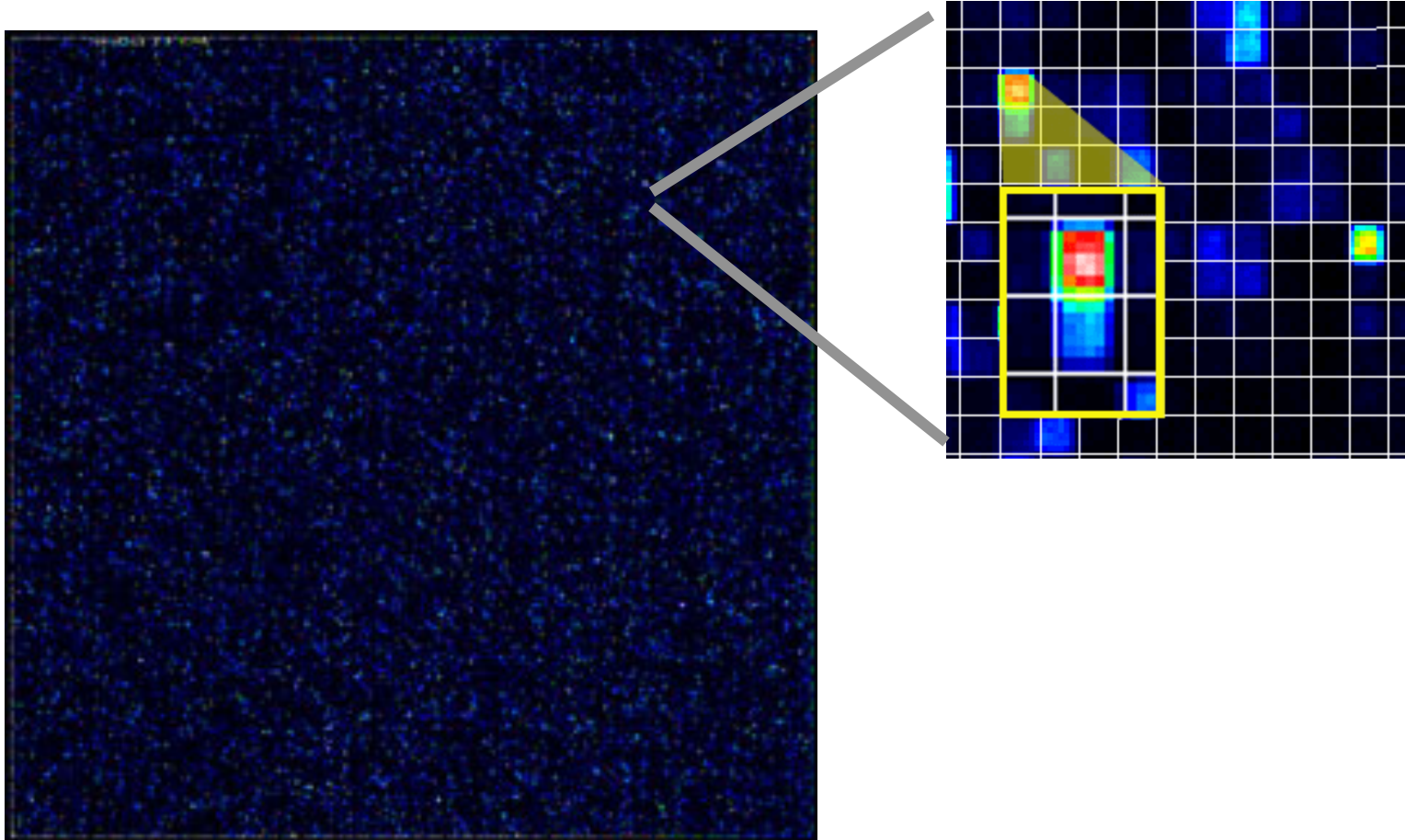
Affy Chip*

- **11-20 targets for each gene/EST**
- **Each target is 25 bases long**
- **1 has exact match, the other is mismatched in the middle base**
- **Match (M) and mismatch (MM) pairs are placed next to each other**
- **Expression levels calculated using intensity difference between M & MM for all target pairs**

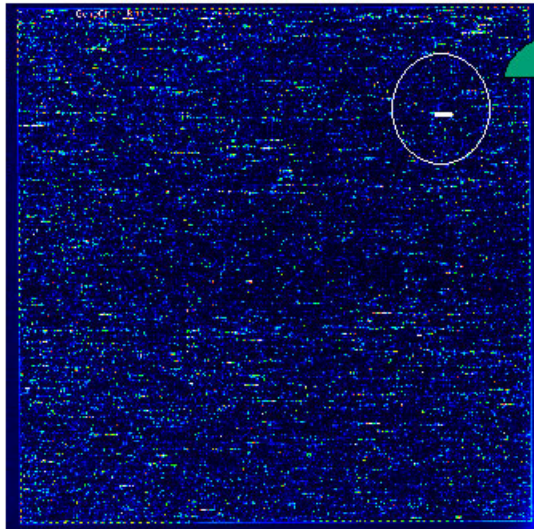
Affymetrix Hybridization*



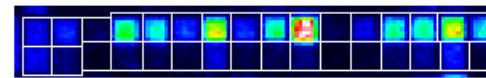
Affy Chips



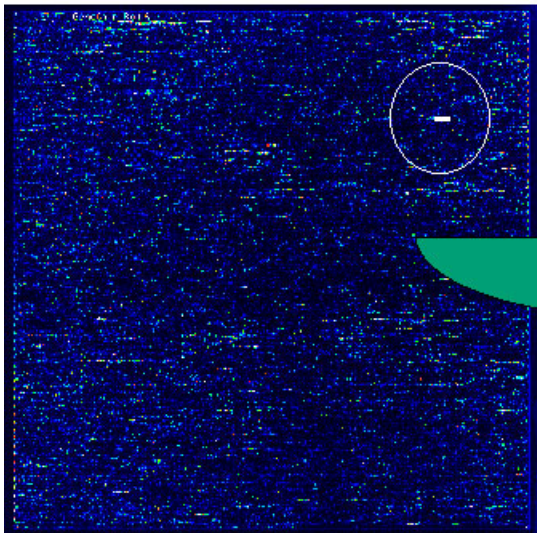
Affy Chips



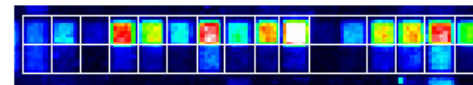
control



match
mismatch



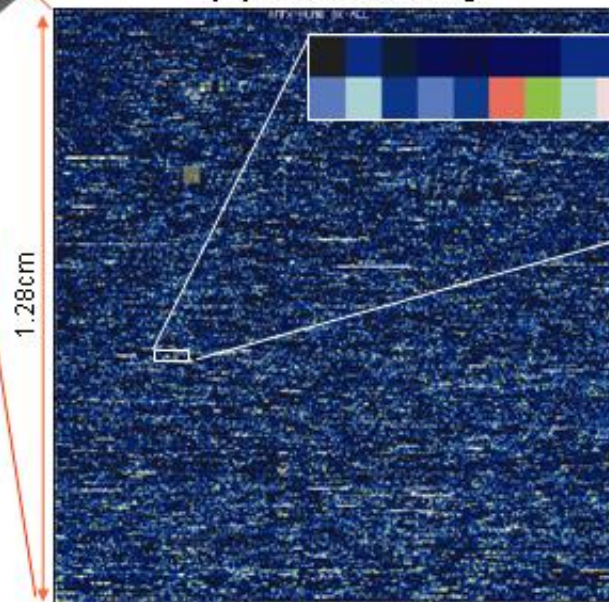
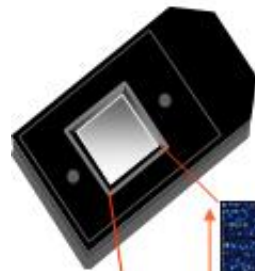
schizophrenic



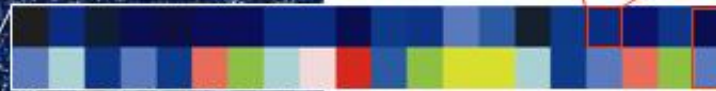
match
mismatch

Affy Chips

Human Genome U133A GeneChip® Array



(1) Probe Array



(2) Probe Set

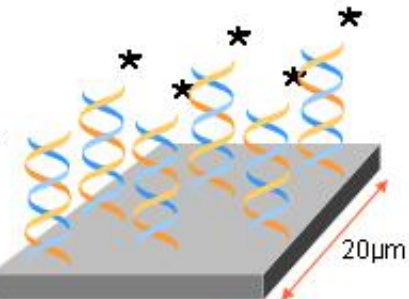
Each Probe Set contains
11 Probe Pairs (PM:MM)
of different probes

(3) Probe Pair

Each Perfect Match
(PM) and MisMatch
(MM) Probe Cells are
associated by pairs

(4) Probe Cell

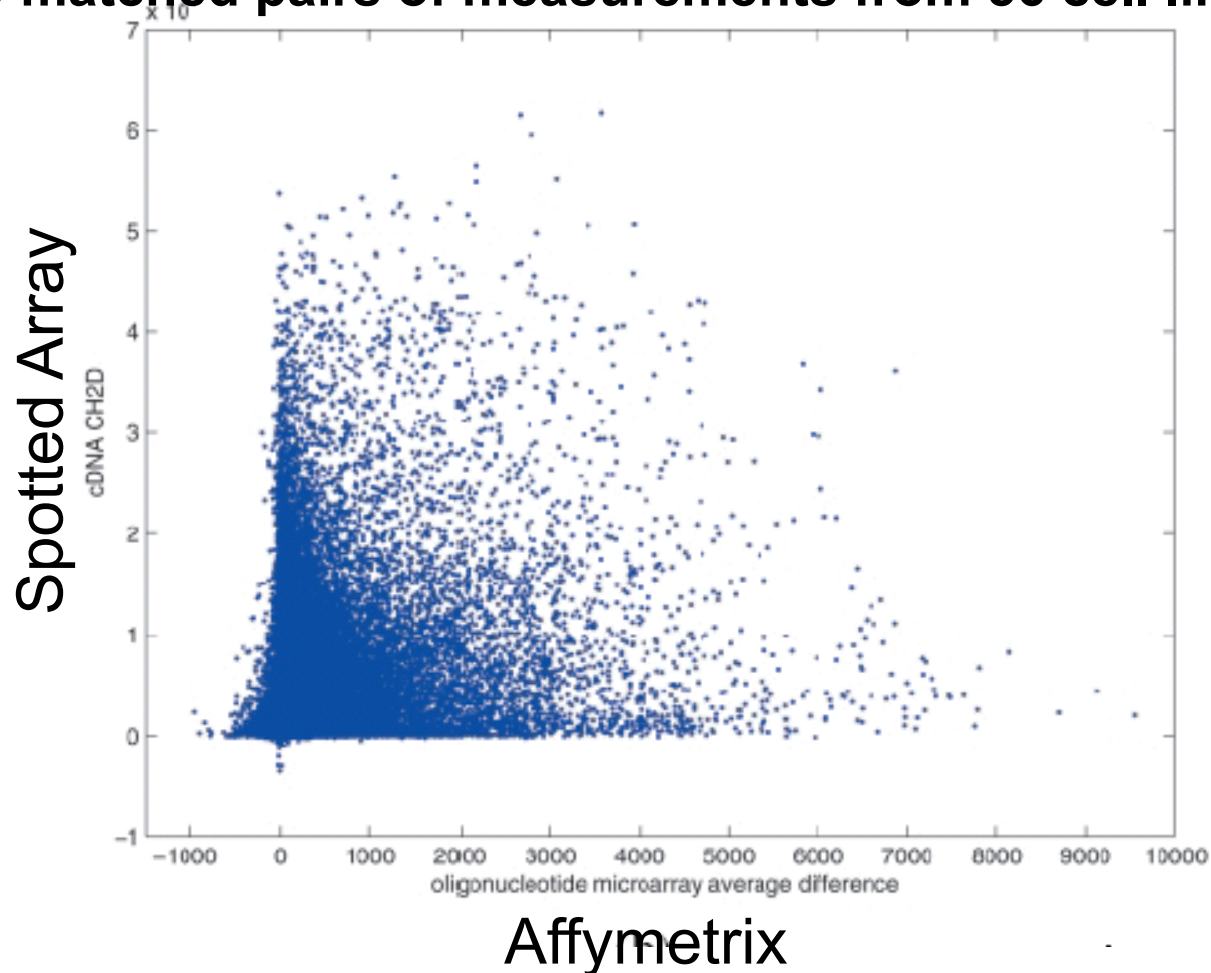
Each Probe Cell contains
 $\sim 40 \times 10^7$ copies of a specific
probe
complementary to genetic
information of interest
probe: single stranded,
sense, fluorescently labeled
oligonucleotide (25 mers)



The Human Genome U133 A
GeneChip® array represents
more than 22,000 full-length
genes and EST clusters.

Comparison of Affymetrix and Spotted cDNA Arrays

161 620 matched pairs of measurements from 56 cell lines



Affymetrix GeneChip Advantages*

- **High precision because of:**
 - careful target design
 - up to 20 targets per gene
 - up to 20 mismatch targets
- **Very precise measurements**
- **Very high density (500,000 elements/
array)**

Affymetrix GeneChips Disadvantages*

- **Inflexible: each array requires custom photolithographic masks**
- **More expensive than spotted arrays (\$600-\$800 per chip)**
- **Proprietary technology**
 - **not all algorithms, information public**
 - **only one manufacturer of readers, etc.**

General Comments*

- **Spotted arrays are still wildly popular and widely used – a great learning tool for expression analysis**
- **Problems have been resolved but spotted arrays are generally less reliable than commercial systems**
- **Commercial systems (CodeLink and Affy) offer much greater reliability but are expensive & inflexible**

Microarray Production*

- **Target design and selection**
 - **Printing**
 - **RNA extraction**
 - **Labeling**
 - **Hybridization and washing**
 - **Scanning**
 - **Data analysis**
- Slide making
- Experimental
-

Target Design & Selection*

- **Synthetic oligos 25-70 bases in length**
- **Choose sequences complementary to mRNA of interest**
- **Random base distribution and average GC content for organism**
- **Avoid long A+T or G+C rich regions**
- **Minimize internal secondary structure (hairpins or other loops)**
- **1 M salt + 65 °C thermostability**

Target Design & Selection*

- **Design and select oligo sequences that are less than 75% identical to existing genes elsewhere in the genome (i.e. do a BLAST search)**
- **Sequences with >75% sequence identity to other sequences will cross-hybridize – leading to confounding results**

Osprey - Software for Microarray Target Design

The screenshot shows a web browser window displaying the Osprey software interface. The browser's address bar shows the URL: http://www.visualgenomics.ca/index.php?option=com_wrapper&Itemid=8. The page header includes the Sun Center of Excellence for Visual Genomics logo and the University of Calgary logo. The main content area is titled "Oligonucleotide Microarray/Probe Design Calculation" and contains the following text:

This form should be used to calculate oligonucleotides meant for a common annealing environment against a DNA sample, such as found on an amino-linked oligonucleotide microarray (as opposed to a PCR product microarray). A single optimal probe oligo for each input sequence is calculated in an iterative process, widening the DNA duplex (i.e. oligo + sample cDNA) melting temperature range if no suitable candidates are found at the optimal temperature using any acceptable oligonucleotide length.

The thermodynamics used in these calculations are [described here](#).

Target Sequence Data

This should be one or more transcribed DNA sequences (e.g. open reading frames in bacteria/archaea/viruses, full-length mRNAs in eukarya).

Choose one of:

1. Paste in DNA sequence (FastA/Pearson format preferred, other formats may parse with less confidence):

[Text input field]

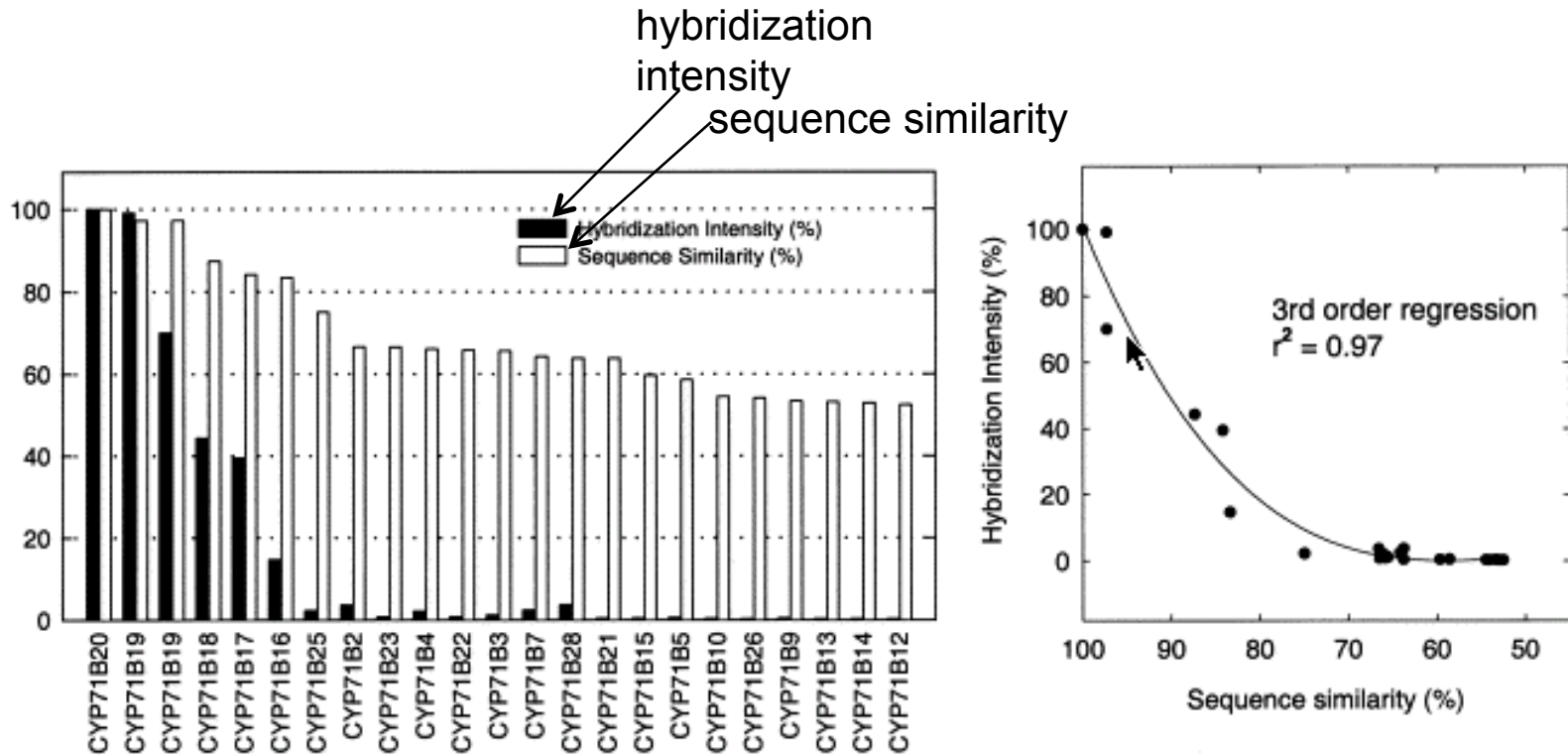
2. Upload a target DNA sequence file (max 10MB):

[Choose File] no file selected

The right sidebar contains a "Currently Funded By" section listing APRI, CFI, Genome Alberta, Genome Canada, ICORE, and Sun Microsystems. Below it is a "Login Form" with fields for Username and Password, a "Remember me" checkbox, and a "LOGIN" button. A "Lost Password?" link is also present.

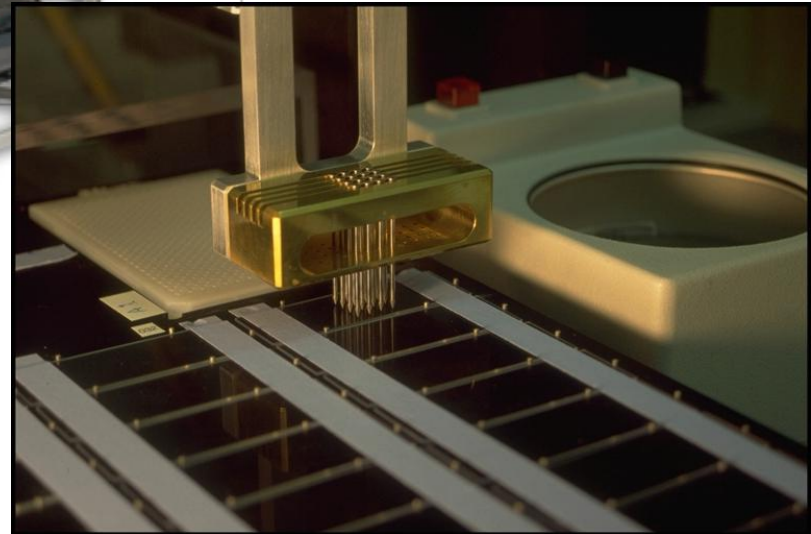
http://www.visualgenomics.ca/index.php?option=com_wrapper&Itemid=8

Cross-hybridization



Analysis of a cross-hybridization within the CYP450 superfamily

Microarray Printing



Microarray Printing

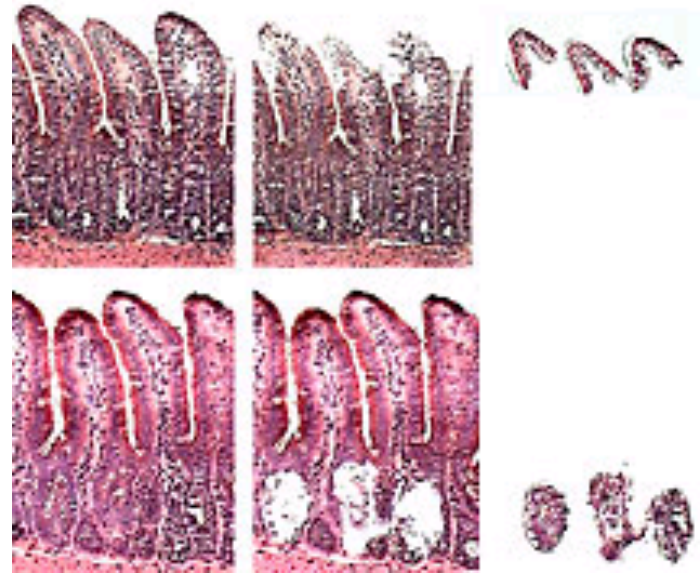
- **Targets are deposited by robots using:**
 - piezo-electric jets
 - microcapillaries
 - split or solid pins
- **Coated glass is the most common substrate**
 - aminosilane, poly-lysine, etc. give non-covalent linkages
 - covalent linkage is possible with modified oligos + aldehyde (etc.) coatings

RNA Extraction

- **RNA is extremely unstable**
- **Probably the most problematic step in all microarray analysis**
- **RNA is extracted as “total RNA”**
 - **only 1-2% is mRNA**
 - **remainder is rRNA, tRNA, etc.**
- **RNA extracted from tissue is often very heterogeneous (many cells and cell types) – watch selectivity**

Laser Capture Microdissection

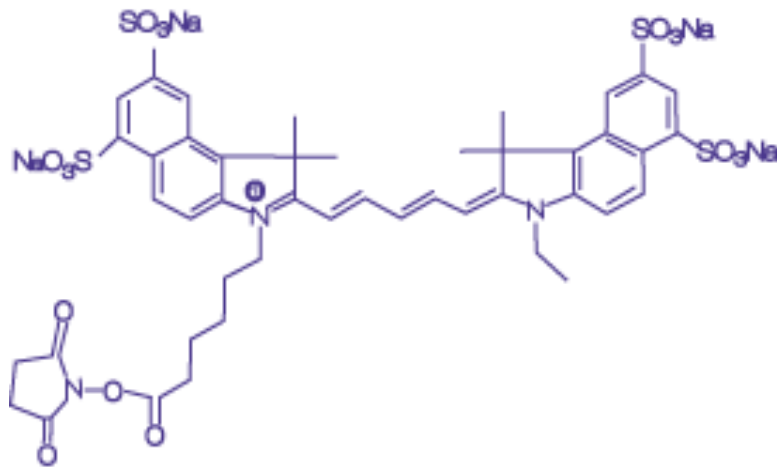
- **Cells of interest are visually selected and exposed to an IR laser, which adheres them to a transfer film**



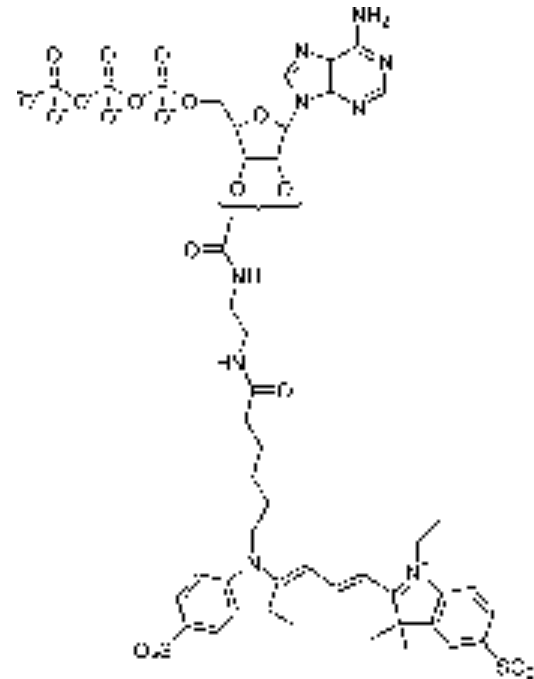
RNA Labeling*

- **Common source of systematic error (freshness, contaminants)**
- **Direct labeling**
 - fluorescent nucleotides are incorporated during reverse transcription (“first strand”)
- **Indirect labeling**
 - reactive nucleotides (aminoallyl-dUTP) are incorporated during RT; first strand product is mixed with reactive fluorescent dyes that bind to amino group

Direct Labeling*

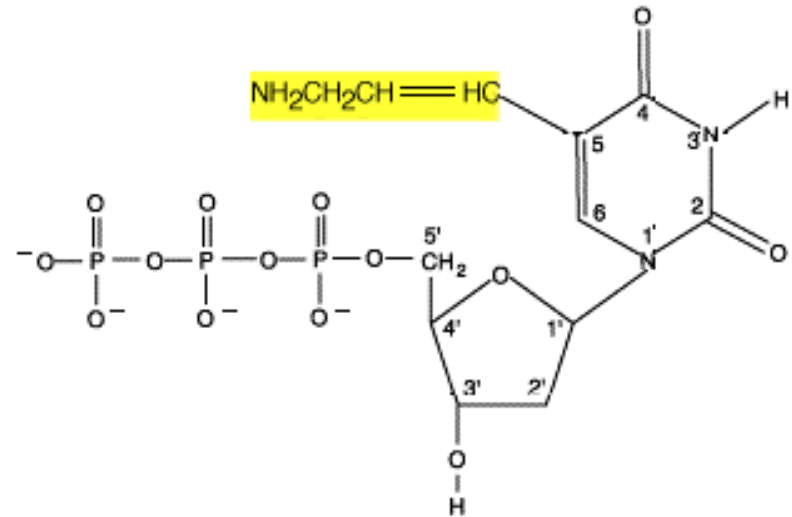
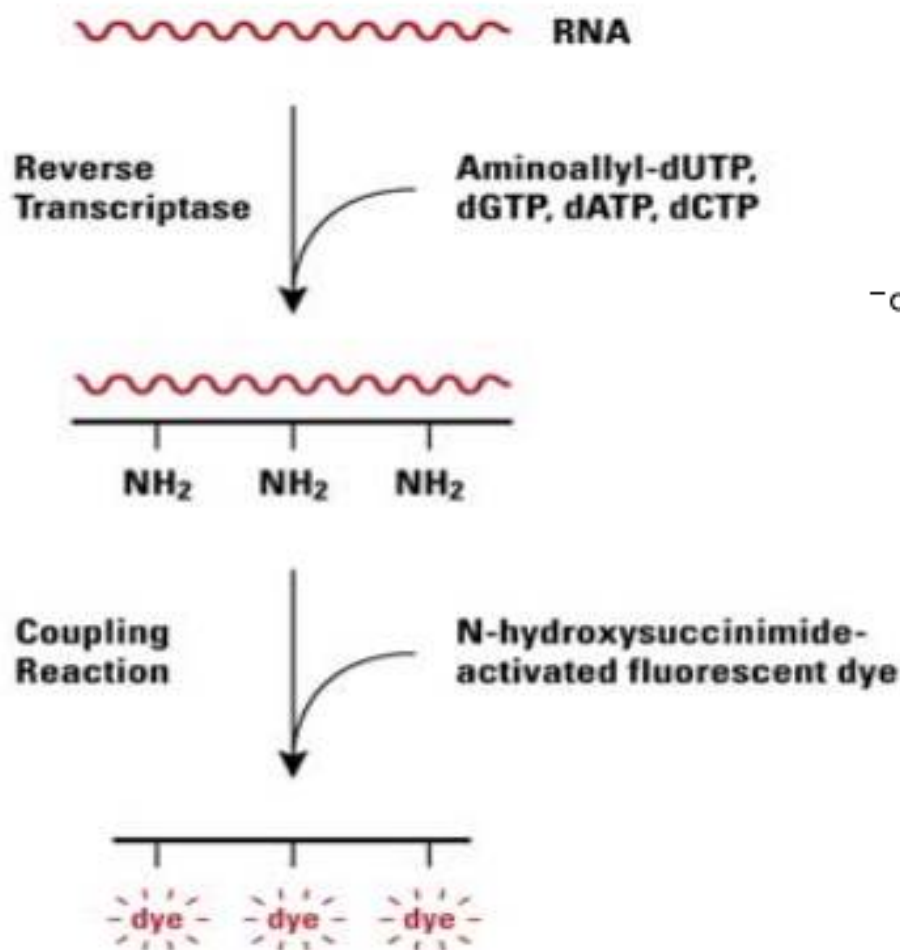


Cy5



Cy3-ATP

Indirect Labeling



aminoallyl-dUTP

Hybridization

- **Stringency of hybridization is affected by ions, detergents, formamide, temperature, time...**
- **Hybridization may be an important source of systematic error**
- **Automated hybridization systems exist; value is debatable**

How Many Replicates?

Table 5. Misclassification percentages for different combinations of replicates

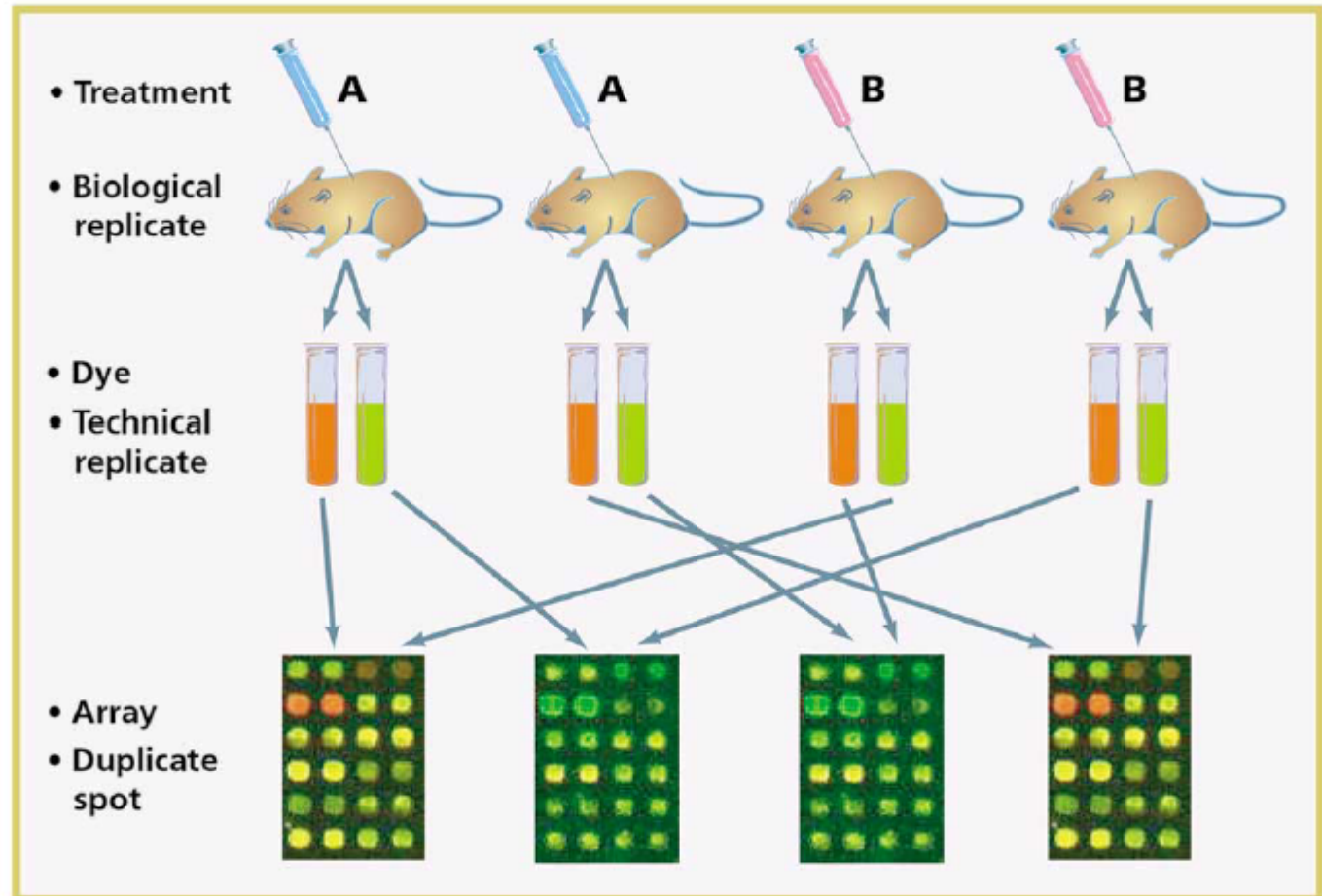
Classification Outcome	Combination of Replicates						
	(1)	(2)	(3)	(1, 2)	(1, 3)	(2, 3)	(1, 2, 3)
False positive, %	8.3	1.4	9.0	1.0	2.1	0.7	0.7
False negative, %	0.3	0.0	0.0	0.3	0.3	0.0	0.0
Misclassified, %	8.7	1.4	9.0	1.4	2.4	0.7	0.7

- **Substantial error when only one array analyzed, standard is to use 3 replicates**

What Types of Replicates?*

Biological replicates

Technical replicates



Biological replication is most important because it includes all of the potential sources for error

Microarray Production

- **Target design and selection**
- **Printing**
- **RNA extraction**
- **Labeling**
- **Hybridization and washing**
- **Scanning**
- **Data analysis**