# Bioconductor overview

Mikhail Dozmorov Fall 2016

# Bioconductor packages

- · Bioconductor software consists of R add-on packages.
- An R package is a structured collection of code (R, C, or other), documentation, and/or data for performing specific types of analyses.
- E.g. **affy**, **limma**, **sva** packages provide implementations of specialized statistical and graphical methods.

### **Bioconductor Project**

· The Bioconductor project started in 2001

**Goal**: make it easier to conduct reproducible consistent analysis of data from new high-throughput biological technologies

- Core maintainers of the Bioconductor website located at Fred Hutchinson Cancer Research Center
- Updated version released biannually coinciding with the release of R
- Many contributed software packages

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# Goals of the Bioconductor Project

- Provide access to statistical and graphical tools for analysis of highdimensional biological data
- 1. Microarray analysis
- 2. High-throughput 'omics' data

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### Goals of the Bioconductor Project

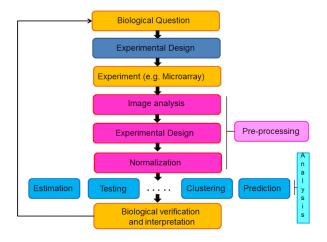
- Include comprehensive documentation describing and providing examples for packages
- Packages have associated vignettes that provide examples of how to use functions
- Have additional tools to work with publically available databases and other meta-data

### **Vignettes**

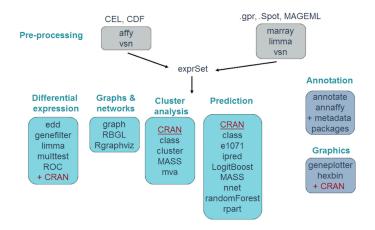
- Bioconductor has adopted a new documentation paradigm, the vignette.
- A vignette is an executable document consisting of a collection of documentation text and code chunks.
- Vignettes form dynamic, integrated, and reproducible statistical documents that can be automatically updated if either data or analyses are changed.
- Vignettes can be generated using the sweave function (or, roxygen2 package)

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### Microarray data analysis



# Microarray data analysis



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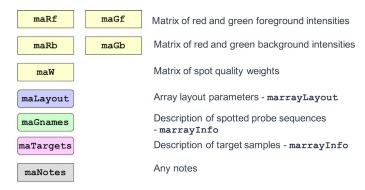
#### **Bioconductor** website

Lets take a look at the website...

http://bioconductor.org/

### marrayRaw class

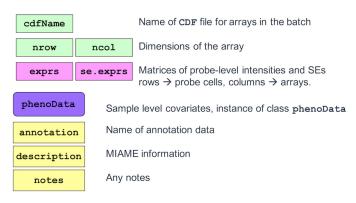
#### Pre-normalization intensity data for a batch of arrays



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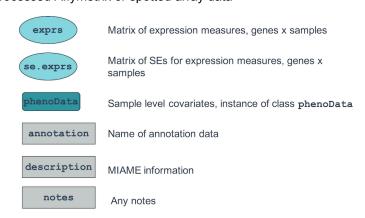
# AffyBatch class

Probe-level intensity data for a batch of arrays (same CDF)



# **ExpressionSet class**

#### Processed Affymetrix or spotted array data



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#### **MIAME**

Minimum Information About a Microarray Experiment (MIAME) http://fged.org/projects/miame/

The six most critical elements contributing towards MIAME are:

- 1 The raw data for each hybridization (e.g., CEL or GPR files)
- 2 The final processed (normalized) data for the set of hybridizations in the experiment (study) (e.g., the gene expression data matrix used to draw the conclusions from the study)
- 3 The essential sample annotation including experimental factors and their values (e.g., compound and dose in a dose response experiment)

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# **Pre-processing packages**

- 1. marray: Spotted DNA microarrays.
- 2. affy: Affymetrix oligonucleotide chips.
- 3. limma: all, from spotted arrays to Affy to RNA-seq
- Reading in intensity data, diagnostic plots, normalization, computation of expression measures.
- The packages start with very different data structures, but produce similar objects of class ExpressionSet.
- One can then use other Bioconductor and CRAN packages for exploratory data analysis and visualization, differential expression detection

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- 4 The experimental design including sample data relationships (e.g., which raw data file relates to which sample, which hybridizations are technical, which are biological replicates)
- 5 Sufficient annotation of the array (e.g., gene identifiers, genomic coordinates, probe oligonucleotide sequences or reference commercial array catalog number)
- 6 The essential laboratory and data processing protocols (e.g., what normalization method has been used to obtain the final processed data)