## What is



Principally a collaborative software development project But it is also:

- a software repository
- a bioinformatics support site
- data repository
- publisher for supplementary materials
- source for tutorials and instructional documentation

Managed and maintained by a core team of ~6 people, with contributions coming from all over the world





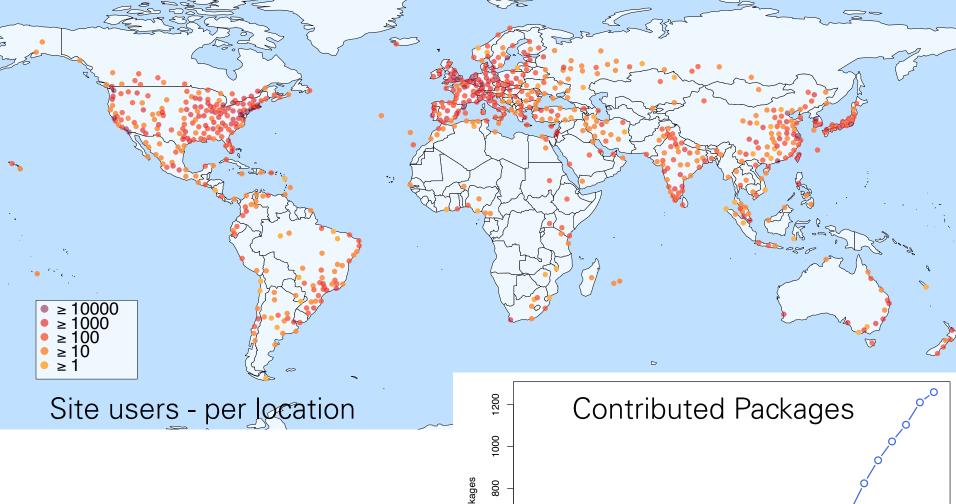
Started 2001 as a platform for analysis & understanding of microarray data

More than 1,600 packages. Domains of expertise:

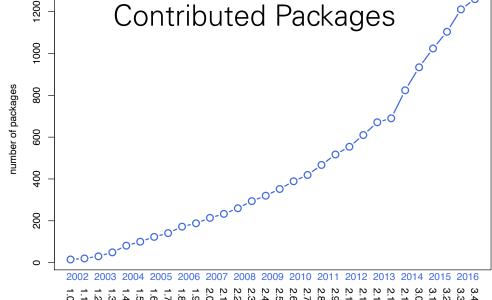
- Sequencing (RNASeq, ChIPSeq, single-cell, called variants, ...)
- Microarrays (methylation, expression, copy number, ...)
- Flow cytometry
- Proteomics
- Multi-Omics data integration

#### Important themes

- Reproducible research
- Interoperability between packages & workflows
  - ... even from different authors
- Usability



World largest bioinformatics project 10,000s users >18,000 papers in PubmedCentral





Collaborative and distributed development Open source

Lower barrier of entry
Train
Turn users into
developers

Data import, preprocessing Integration of data types

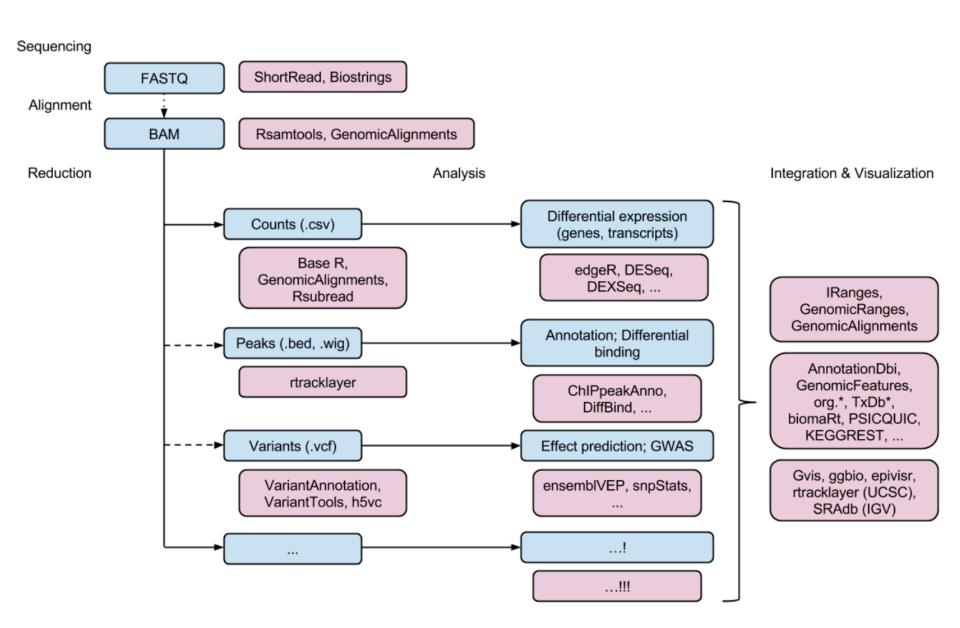
Based on R
Interoperable components
Rapid development
Code re-use

Publication of software Computational reproducibility

# Motivating principles

- → Provide a compelling user experience: documentation, demos, tutorials
  - workflows
  - package vignettes
  - function manual pages
- → Support active & open developer community
  - training on software development & programming techniques
  - distributed development by domain experts
     (→interoperability)
  - common data structures that enable workflows integrating multiple data types and disciplines

# Workflows for HT Sequencing



### Bioconductor Classes: e.g., Summarized Experiment

- Synchronized handling of multiple tables / matrices (subsetting, dangling pointers)
- Encapsulation: separation of interface from implementation
- Validity checking: enforces contracts with the user
- Specialized highly efficient methods for manipulation (e.g. GRanges class)

# **Annotation & Datasets**

Annotation of genes, transcripts, proteins, pathways, metabolites; GO, Reactome, Pubmed, ...

#### Sequences

You don't have to download text files from NCBI / EBI and parse them into R - use ready made packages with nice interfaces.

ExperimentHub: published datasets already curated into efficient R objects, with documentation

## Modes of documentation

- Manual Pages (for each function)
- Vignettes: Narrative overviews on what you can do with a package
- Workflows: end-to-end descriptions of a scientific question
- F1000Research papers, Bioinformatics application notes: peer-reviewed, citable

## Support Forum -



#### **Etiquette (Posting Guide)**

- Make sure you use most recent versions
- Read the documentation
- Use Google to see if a similar question has already been asked
- Prepare a minimal working example and post its code
- Remember your manners when reporting "bugs" or "missing features"
- Use descriptive subject line and precise language
- Post 'devtools::session\_info()'

https://www.bioconductor.org/help/support/posting-guide/

# Scientific software should be assessed by similar criteria as a scientific publication

- Reproducible
- Peer-reviewed
- Easy to access by other researchers & society
- Builds on the work of others
- Others will build their work on top of it

```
♥ - Go to file/function
 graphics.Rnw * Dab_2_Graphics-WH.Rmd *
    73 - ### Load Data
        First, we load the dataset and add two new variables:
        one to encode whether the day falls on a weekend or whether it is a weekday,
        and a three-level, discretized health score based on the APGAR 5 score.
        We also fix an ideosyncratic encoding of not available values by 99 with proper
    79
    80
        Finally, we define a subsampled version of the dataset ``births.small`` to
        speed up some of the plotting (feel free to try out the computations and plots
    83
        we see subsequently with the full dataset ``births``.)
    84
         ```{r setup-births, message = FALSE, warning = FALSE, results = "hide"}
        data("births2006.smpl", package = "nutshell")
        births <- mutate(births2006.smpl,
          WEEKEND = ifelse(DOB_WK %in% c(1, 7), "Weekend", "Weekday"),
          HEALTH = c("CritLow", "Low", "Normal")[ 1 +
    91
            findInterval(APGAR5, c(3.5, 6.5)) ],
          ESTGEST = replace(ESTGEST, ESTGEST==99, NA))
        births.small <- births[ sample(nrow(births), 40000), ]
          ``{r load-data, exercise = TRUE, ref.label="setup-births"}
    99
        You can find out more about this dataset by running the line below
   102 - ```{r findout, exercise = TRUE, exercise.setup = "setup-births", eval = FALSE}
        help("births2006.smpl", package = "nutshell")
   104
   105
   106 - ## Plot Creation & Geoms
   107
        The function ``ggplot`` starts a grammar of graphics "sentence". In particular,
        it usually contains the noun, the dataset to be plotted.
        The ``+`` operator is used to add further "verbs", "adjectives", etc. to the
        sentence. This enables use to construct sophisticated plots (sentences)
        from a few elementary concepts. The verbs are geometric objects, or ``geom``s.
        For example, ''geom_bar'' draws bars, ''geom_point'' draws points.
        Lab 2: Graphics $
  R Markdown
```

# Code re-use

- Writing good software is hard
- Existing, well-used and maintained software contains fewer bugs
- Common problems are already solved
- Avoid re-implementation produce interfaces
- Focus on new things
- → Lots of package interdependencies (>1000 packages, 100s developers)

# Don't reinvent the wheel

Shared code base, maintained by core team

Bioconductor already has code to:

- Read common file formats
- Represent common data types e.g. Genomic Ranges, Summarized Experiments
- Load genomes and annotation
- etc.

# Let users become developers

# What are the benefits from using the Bioconductor development environment?

Standardised and powerful data structures for representing datasets incl. metadata

Many tools for data I/O and preprocessing. Access to databases of primary data and annotation (ExperimentHub)

Support for writing good documentation

Support for supporting your users



# What are the benefits from using the Bioconductor development environment?

Free code review

Package system

Daily checks - continuous integration

Version control system

Release & devel branches

Six monthly release cycle

Stable version for most users, but easy to make new features public



# Why R?

- high-level, interpreted programming language
- rapid prototyping, creativity, flexibility and reproducibility
- scientific and statistical computing capabilities
- publication quality graphics system ('grammar of graphics')
- convenient data I/O & wrangling
- mature package management system
- inter-language interfaces (C, C++, Java, JavaScript)
- lots of momentum with recent language innovations (RStudio, tidyverse, Jupyter, commercial adaptations, ...)

#### LISP/Scheme inside