







ISCB Workshop WK03: Bioinfo-core Workshop

Developing high-performance analysis pipelines in a core setting



### **Outline**

- The UF ICBR Bioinformatics Core
- What's "big" in big data?
- The Actor framework
- Conclusions / discussion points



### **ICBR**

- ICBR: Interdisciplinary Center For Biotechnology Research. Founded in 1987 to create a common administrative structure for existing University of Florida (UF) core facilities.
- Enables molecular life sciences research by reducing barriers to implementation and practice of molecular technologies.
- Serves a very large and diverse scientific environment: colleges of Medicine, Sciences, Pharmacy, Dentistry, Veterinary Sciences, Genetics Institute, Cancer Center, Emerging Pathogens Institute, CTSI, Florida Museum of Natural History.





Not just medicine:





Not just medicine: from viruses







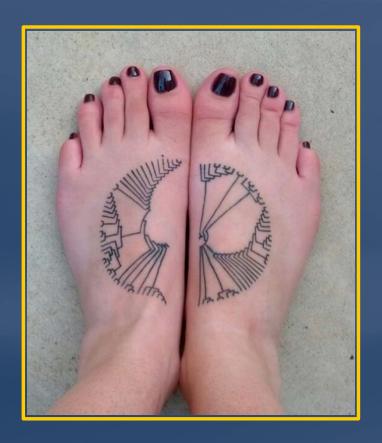
Not just medicine: from viruses to forests,







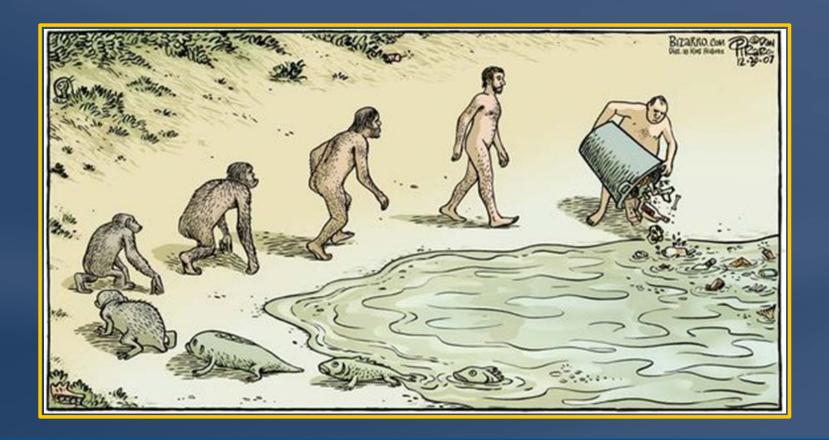
Not just medicine: from viruses to forests, from molecular evolution







Not just medicine: from viruses to forests, from molecular evolution to human evolution,



 Not just medicine: from viruses to forests, from molecular evolution to human evolution, from bacteria







 Not just medicine: from viruses to forests, from molecular evolution to human evolution, from bacteria to horses,



 Not just medicine: from viruses to forests, from molecular evolution to human evolution, from bacteria to horses, cows,







 Not just medicine: from viruses to forests, from molecular evolution to human evolution, from bacteria to horses, cows, manatees,





Not just medicine: from viruses to forests, from molecular evolution to human evolution, from bacteria to horses, cows, manatees, alligators...





• Not just medicine: from viruses to forests, from molecular evolution to human evolution, from bacteria to horses, cows, manatees, alligators... often under the same roof!







## 1988 ICBR Core Portfolio

- Cytometry
- Electron Microscopy
- Monoclonal Antibody
- Protein Analysis
- Sanger Sequencing



# 2016 ICBR Core Portfolio

- Cytometry
- Electron Microscopy
- Monoclonal Antibody
- Protein Analysis
- Sanger Sequencing
- Gene Expression and Genotyping
- Next-Gen DNA Sequencing
- Bioinformatics





### **Bioinformatics Core**

- Four full-time bioinformatics specialists, with complementary backgrounds and several decades of combined expertise in the field.
- Strong links with Sequencing, Gene Expression, and Proteomics cores. Part-time faculty director to increase visibility with research faculty.
- Mission: support genomic research at UF by providing data analysis services for large scale DNA sequencing, genotyping, methylation analysis, gene expression (microarray, RNAseq), genome assembly and annotation, etc...





# What is "big" in big data?

- The absolute size of datasets is not the main issue. Disk space is cheap and getting cheaper.
- Computational complexity: get a more powerful computer (UF just did that)! Or rent it.
- Other dimensions of complexity:
  - Wide range of research areas, scientific questions;
  - No two projects are ever identical;
  - Field in constant evolution (technology, tools, methods, questions, standards, requirements, ...)



### The three Rs...

1. ReliabilityClients want correct results!

# 2. Reproducibility

We should be able to re-run an analysis six months later and get the same results. Or run the same analysis on similar input datasets and get consistent results.

# 3. Reusability

Pipelines share basic components (e.g. alignment). We don't have time and resources to re-write pipelines from scratch every time, and it does not make sense anyway.



- **Actor** is a meta-scripting tool for reproducible computing.
- Actor scripts are similar to shell scripts, but:
  - They automatically generate an HTML report containing a description of all analysis steps;
  - They allow for easy inclusion of tables, images, plots, downloadable files;
  - Input and output files, analysis scripts, and the HTML report can be automatically packaged in a ZIP file and published on the web.



- Actor is implemented as a Python library. Actor calls can be freely mixed with standard Python code.
- The library is divided into sections dealing with: initialization and setup, execution of programs and scripts, report generation.
- The library provides data structures to represent conditions, samples, technical and biological replicates.



• Actor has been used to implement the following pipelines so far:

Description	Tools		
RNA-Seq processing	Trimmomatic / sickle, STAR, Picard, cufflinks / cuffdiff / rsem, FastQC, counts, coverage, tracks.		
ChIP-Seq processing	Trimmomatic / sickle, STAR / Bowtie, Picard, Homer, FastQC, counts, coverage, tracks.		
Differential methylation analysis	Trimmomatic / sickle, bsmap, Picard, cscall, mcomp, FastQC, counts, coverage, plots.		
Regulatory network reconstruction	ARACNE, apple.py.		
Multi-sample SNP calling	Trimmomatic / sickle, Bowtie, GATK / freebayes, SnpEff, FastQC		
De-novo	Trimmomatic / sickle, spades, prokka, roary, mauve, FastQC.		
Microarray analysis	R/Bioconductor (limma).		



 Script execution is controlled by a simple configuration file.

```
[General]
title = run1
staridx = <<path to STAR index>>
cufflinksGTF = <<pre>cufflinksGTF = 
# We compare two experimental conditions, wildtype (WT) and knock-out (KO)
conditions = WT, KO
contrasts = KO^{MT}
# Each condition may have any number of samples (biological replicates)
[WT]
samples = WT-1, WT-2, WT-3, WT-4, WT-5
[KO]
Samples = KO-1, KO-2, KO-3, KO-4
```





• Automatically generated HTML report.



**DiBiG** 

**ICBR Bioinformatics** 

Powered by Actor, v1.0

#### RNAseq - Alignment and differential expression analysis

Script: RNASeq1
Project: RNAseq

Started on: 2/28/2016 13:20:33

Hostname: gator2.ufhpc

Source: rnaseq.py

#### 1. General configuration

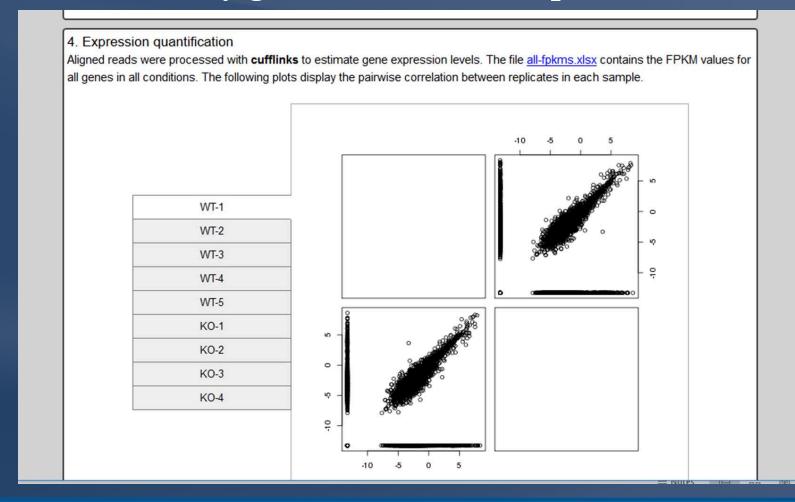
The analysis included 18 samples and a total of 185 readsets. The following table lists the samples with the number of readsets for each.

Name	Readsets	
WT-1	10	
WT-2	11	





# • Automatically generated HTML report.







Automatically generated HTML report.

pUTXDox_3d	pUTXDox_6d	30	14	16
KO-3	WT-5	0	0	0
KO-4	WT-5	59	42	17

File: gene\_exp.sig.xlsx

Size: 1.96 MB

Description: Differentially regulated genes.

File: gene\_exp.full.xlsx Size: 103.87 MB

Description: Fold changes and p-values for all genes.

#### 6. Other differential analysis

The following table reports the number of differentially expressed entities found in the following tests performed by **cuffdiff**: isoform, promoters, splicing, tss\_group. Tables containing all significant entries can be downloaded using the links in the last row.

Control	Test	Isoform	Promoters	Splicing	TSS group
KO-1	WT-1	908 (372 / 536)	0 (0 / 0)	0 (0 / 0)	1611 (690 / 921)
KO-1	WT-2	598 (209 / 389)	0 (0 / 0)	0 (0 / 0)	1153 (434 / 719)
KO-1	WT-3	1869 (813 / 1056)	0 (0 / 0)	0 (0 / 0)	2806 (1276 / 1530)



# Conclusions / discussion points

- Technology and analytical skills are not enough.
- *Process* and *infrastructure* are key to providing "big data" services in a reliable and efficient way.
- Process: a bioinformatics core facility should not be a "black box". Work is inherently exploratory and collaborative; we need to be nimble and adaptable.
- Infrastructure: investment in making work more efficient, reliable, reproducible. Short-term cost, long-term benefit.



