# Nextflow and Singularity enabling heterogeneous CPU/GPU bioinformatics containers in workflows

Kevin Sayers September, 2017





#### Overview

- Technologies
  - Nextflow
  - Containers
  - GPU
  - AWS
  - Machine learning
- SRAGPU-nf workflow
- Results
- Conclusions













#### Nextflow

- Domain specific workflow language for bioinformatics
- Deploy workflows locally, in an HPC cluster, or on Amazon web services (AWS)
- Supports Docker and Singularity containers
- GitHub integration
- Automatic parallelization

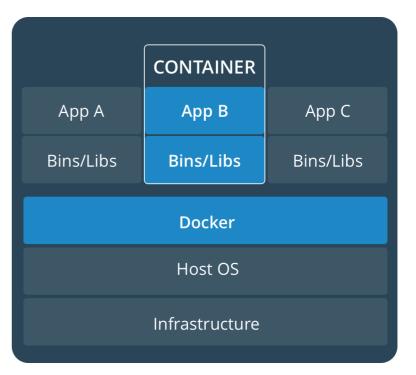
## Nextflow script

```
process setup{
            container = "docker://sayerskt/samtools"
3
            publishDir './', mode: 'copy', overwrite: true
            output:
            file "Homo_sapiens.GRCh38.cdna.all.fa" into reference
            file "Homo_sapiens.GRCh38.cdna.all.fa.fai" into refindex
8
            wget ftp://ftp.ensembl.org/pub/release-88/fasta/homo_sapiens/cdna/Homo_sapiens.GRCh38.cdna.all.fa.gz
            gunzip Homo_sapiens.GRCh38.cdna.all.fa.gz
            samtools faidx Homo_sapiens.GRCh38.cdna.all.fa
14
    process barracudaIndex{
            container = 'shub://KevinSayers/BarraCUDA_Singularity'
19
            storeDir 'index/'
            input:
            file ref from reference
            output:
24
            file "${reference.baseName}.*" into indexOut, indexFiles
            barracuda index -p ${reference.baseName} ${ref}
29
```

#### Containers

- Software portability
  - Packaged together
  - No conflicting dependencies
- Reproducibility
  - Created from an image
  - Control over software versions
- Bioinformatics respositories

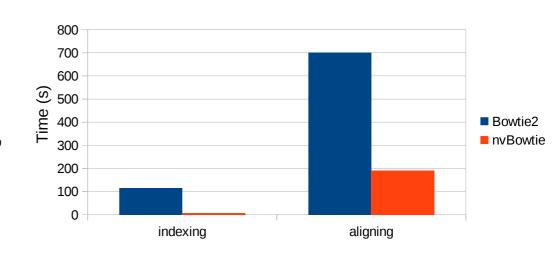




https://www.docker.com/what-container

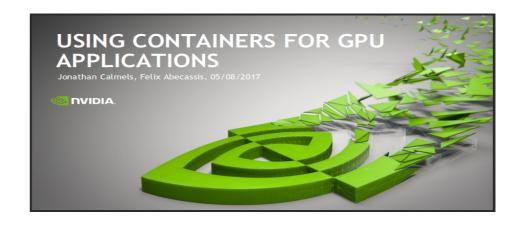
#### **GPUs in Bioinformatics**

- Thousands of parallel cores
- Can substantially reduce processing time
- Bioinformatics tools
  - Short read aligners (BarraCUDA, nvBowtie, SOAP3)
  - GPU-BLAST
  - Molecular modeling
- Machine learning



### **GPU** containers

- Portability of difficult to compile GPU programs
- Recent work
- Implementations
  - Nvidia-docker
  - Shifter
  - Singularity
- Containerized single tools



#### Portable, high-performance containers for HPC

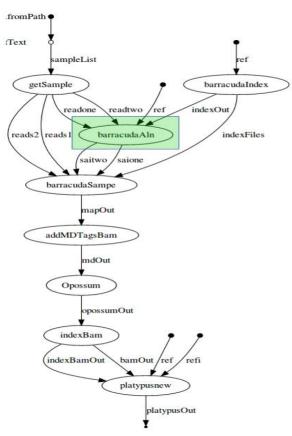
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### Experimental data

- Single cell RNA-seq
- 4 classes
  - Estrogen receptor positive (ER+)
  - Human epidermal growth factor receptor 2 (HER2+)
  - Triple-negative breast cancer (TNBC)
  - ER2+ and HER2+
- 381 samples
- Reference transcriptome
- BarraCUDA GPU enabled short read aligner
- TensorFlow machine learning classifier

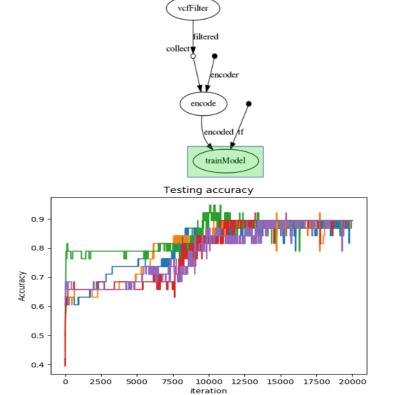
### **SRAGPU-nf**

#### Sample processing

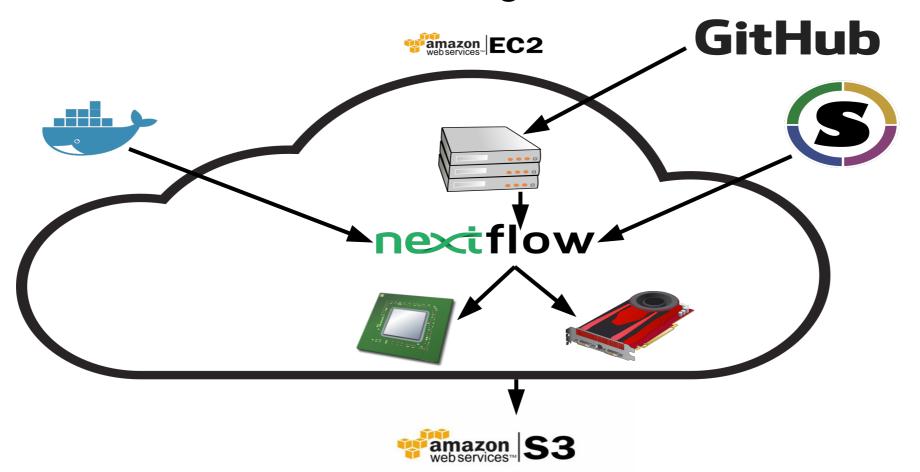


#### Classification

Channel.fromPath



## Cloud configuration



### Conclusions

- GPU bioinformatics tools can decrease processing times
- Nextflow and Singularity can be used to deploy heterogeneous container workflows
- Publicly published nvBowtie and BarraCUDA GPU containers
- Machine learning steps can be incorporated into Nextflow using GPU containers
- Opening up new workflow possibilities that rely heavily on GPU based tools

#### **Future works**

- Add support for each process being a different instance type
- Singularity still actively developing GPU features
- Improve the parameters for the SRAGPU-nf workflow
- Improve the machine learning models
- Validate with other RNA-seq data

### Thank you for listening!

- 1. Di Tommaso, P., Chatzou, M., Floden, E. W., Barja, P. P., Palumbo, E., & Notredame, C. (2017). Nextflow enables reproducible computational workflows. Nature Biotechnology, 35(4), 316-319.
- 2. Benedicic, L., Cruz, F. A., Madonna, A., & Mariotti, K. (2017). Portable, high-performance containers for HPC. arXiv preprint arXiv:1704.03383.
- 3. Kurtzer, G. M., Sochat, V., & Bauer, M. W. (2017). Singularity: Scientific containers for mobility of compute. PloS one, 12(5), e0177459.
- 4. Oikkonen, L., & Lise, S. (2017). Making the most of RNA-seq: Pre-processing sequencing data with Opossum for reliable SNP variant detection. Wellcome open research, 2.
- 5. Abadi, M., Agarwal, A., Barham, P., Brevdo, E., Chen, Z., Citro, C., ... & Ghemawat, S. (2016). Tensorflow: Large-scale machine learning on heterogeneous distributed systems. arXiv preprint arXiv:1603.04467.

### Questions?

- BarraCUDA: shub://KevinSayers/BarraCUDA\_Singularity
- nvBowtie: shub://KevinSayers/nvBowtie\_Singularity
- SRAGPU-nf: https://github.com/KevinSayers/SRAGPU-nf
- OneHotVCF: https://github.com/KevinSayers/OneHotVCF
- Paper in the works!
- I presented portions of this work at the 2017 Bioinformatics Open Source Conference (BOSC) in Prague as a lightning talk.