

## A workflow for the quantification, miRNA target prediction and differential expression analysis of circRNAs

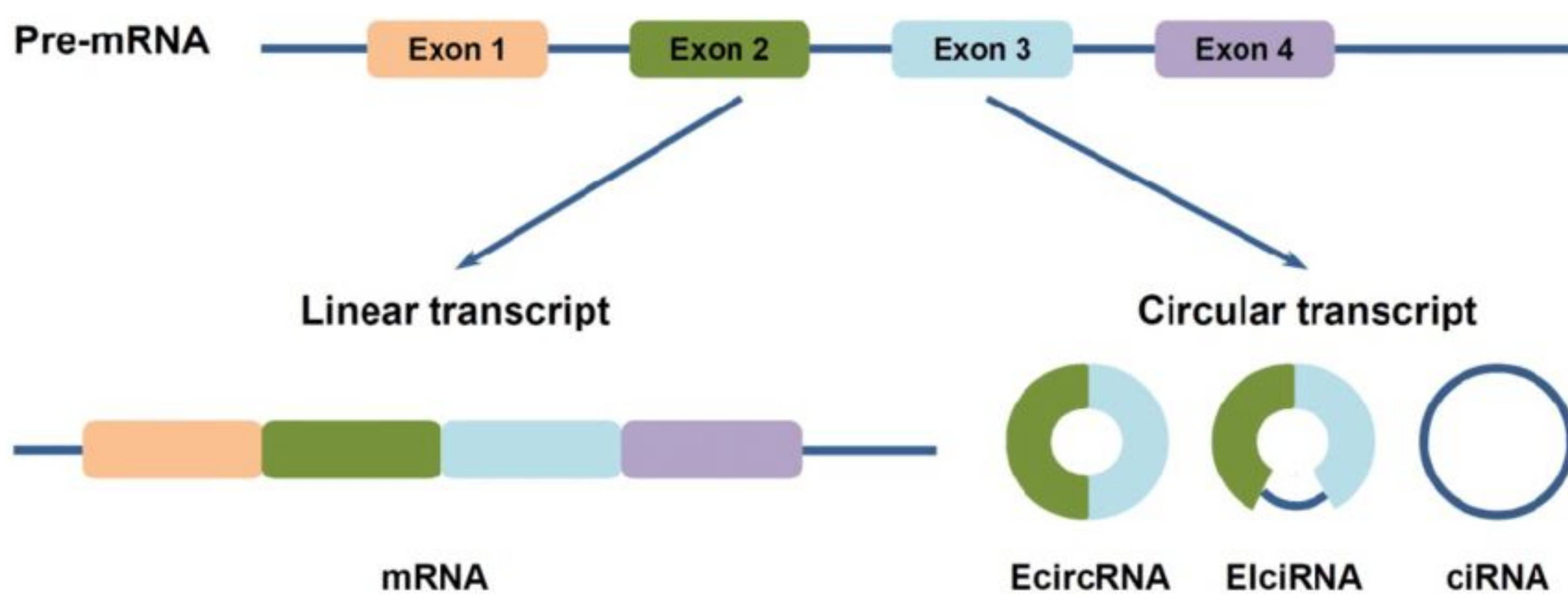
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### Introduction

Circular RNAs (circRNAs) are a class of non-coding RNAs formed by the back-splicing of precursor messenger RNA to create a covalently closed RNA loop structure (figure 1). circRNAs exhibit tissue- and stage-specific expression and are abundantly expressed in blood, serum and exosomes. Context dependent expression coupled with cytoplasmic stability make circRNAs ideal candidates as both diagnostic and prognostic biomarkers in a clinical setting, facilitating the use of non-invasive liquid biopsies to monitor disease status. Furthermore, circRNAs have been shown to harbour functionally active and evolutionarily conserved microRNA response elements (MREs), suggesting a regulatory role within the competing endogenous RNA (ceRNA) network [1].



**Figure 1:** Backsplicing of pre-mRNA, producing circRNAs, ciRNAs & EI-ciRNAs [2].

### Current Landscape

Currently, there is no consensus on a circRNA quantification tool within the scientific community. The most popular tools utilise different read mappers and parsing strategies (de-novo, reference-guided) to detect non-canonical back-splice junction sites within sequencing reads. Only one tool is capable of performing differential expression tests between phenotypes of interest and no tool incorporates miRNA target prediction (figure 2).

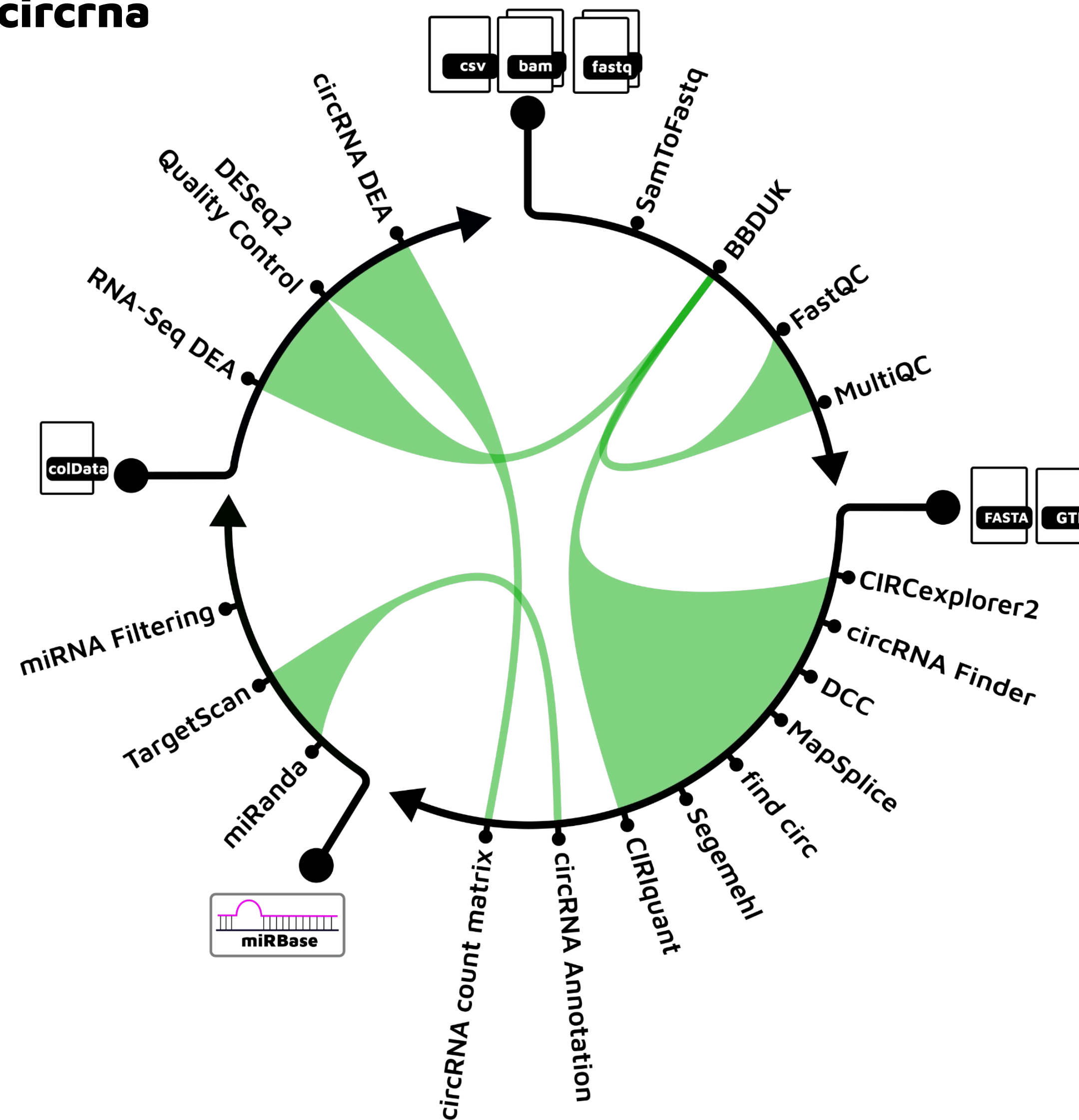
To address these shortcomings, we present **nf-core/circrna**, a multi-functional, automated high-throughput pipeline implemented in Nextflow [3] that allows users to fully characterise the role of circRNAs in paired-end RNA-Seq datasets (figure 3).

Tool	Language	Mapper	De novo?	miRNA?	DEA?
CIRCexplorer2	Python	STAR/TopHat-fusion/BWA	yes	no	no
CIRIquant	Python	BWA/HISAT2	yes	no	yes
circRNA_finder	Perl	STAR	no	no	no
DCC	Python	STAR	no	no	no
find_circ	Python	Bowtie2	yes	no	no
MapSplice2	Python	Bowtie	no	no	no
Segemehl	C	Segemehl	yes	no	no

**Figure 2:** A brief summary of the installation requirements for several of the most popular circRNA quantification tools and their mode of operation.

### Pipeline Workflow

nf-core/circrna



**Figure 3:** Schematic of nf-core/circrna workflow. The workflow is composed of 4 modules: **Pre-processing**, **circRNA Discovery**, **miRNA Prediction** & **Differential Expression Analysis**.

### Availability

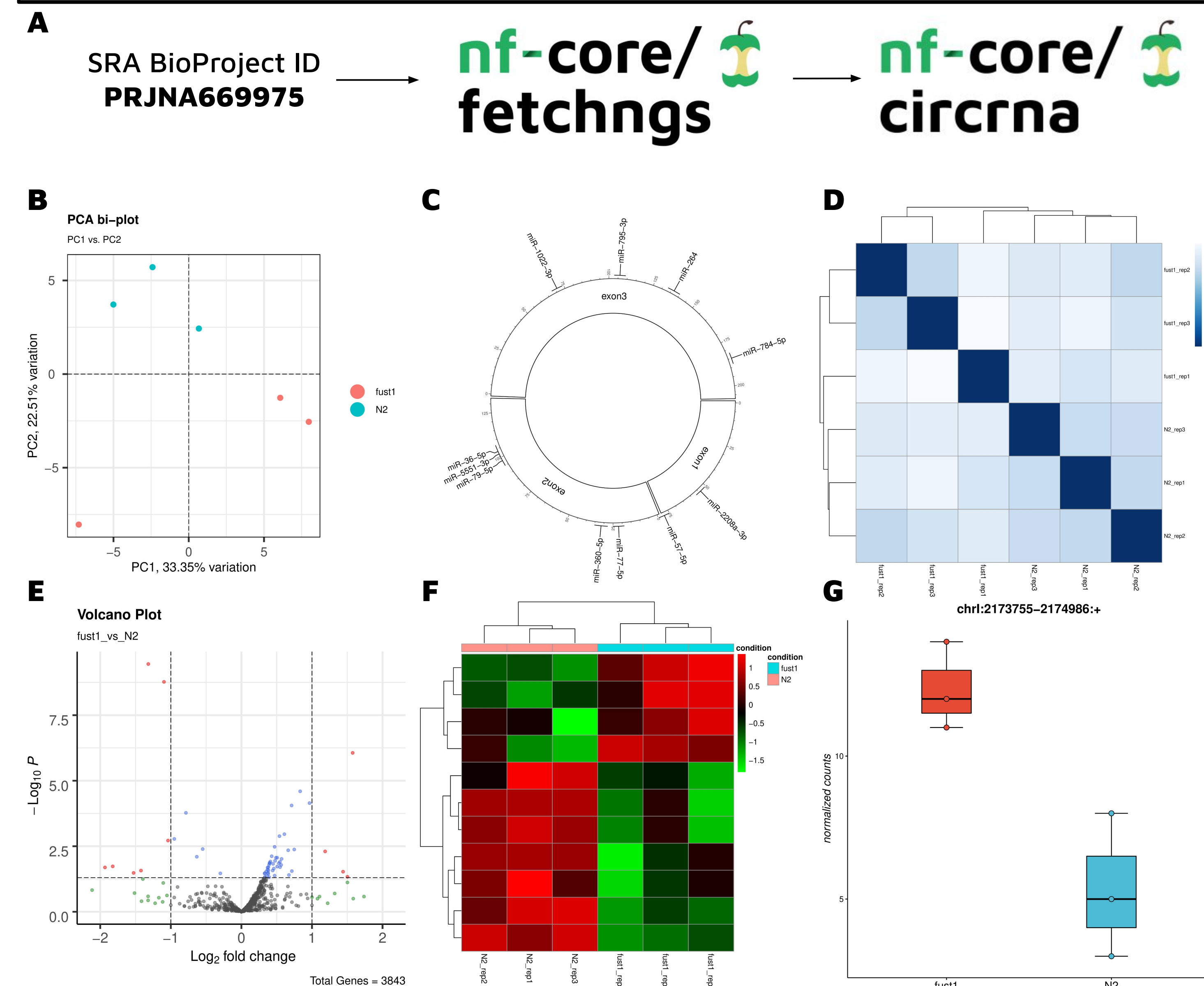
Source code, documentation and installation instructions are freely available at <https://github.com/nf-core/circrna> and <https://nf-co.re/circrna>. nf-core/circrna has been developed within the nf-core framework [4], ensuring robust portability across POSIX compute environments, minimal installation requirements via containerisation using Docker/Singularity, compatibility with all HPC job schedulers and cloud based instances, comprehensive documentation and maintenance support. To run the workflow on a minimal test-dataset:

```
> nextflow pull nf-core/circrna
> nextflow run -r dev nf-core/circrna -profile test,<singularity/docker>
```

### Contact

The authors of **nf-core/circrna** encourage engagement from the research community in the form of pull requests or issues via github. If you wish to contribute a novel or pre-existing circRNA tool to **nf-core/circrna**, please contact me at the usernames below to discuss integrating your tool within the workflow.

### Selected Outputs



**Figure 4:** **A:** Demonstration of nf-core/circrna using BioProject accession number PRJNA669975 [5] in conjunction with nf-core/fetchngs [6]. **B:** PCA bi-plot of circRNA expression between *fust1* & *N2* strains. **C:** Circos plot of consensus miRNAs predicted by both miRanda and Targetscan within circRNA mature spliced sequence. **D:** Sample-to-sample clustering heatmap displaying sample heterogeneity. **E:** Volcano plot displaying differentially expressed circRNAs Log2FC values vs. p value (-log10). **F:** Heatmap of differentially expressed circRNAs. **G:** Normalised counts of differentially expressed circRNA chr1:2173755-2174986: + between *fust1*, *N2* samples (N=3).

### References

- [1] Hansen, T. B., et al. (2013). Natural RNA circles function as efficient microRNA sponges. *Nature*, 495(7441), 384–388. <https://doi.org/10.1038/nature11993>
- [2] Qiu LP et al. (2018) The Emerging Role of Circular RNAs in Hepatocellular Carcinoma. *J Cancer*; 9(9):1548-1559. <https://www.icancer.org/v09p1548.html>
- [3] Di Tommaso, P., et al. (2017) Nextflow enables reproducible computational workflows. *Nat Biotechnol* 35, 316–319, <https://doi.org/10.1038/nbt.3820>
- [4] Ewels P, et al. (2020). The nf-core framework for community-curated bioinformatics pipelines. *Nature Biotechnology* 38:276–278, <https://doi.org/10.1038/s41587-020-0439-xh>
- [5] D. Cao (2021) An autoregulation loop in fust-1 for circular RNA regulation in *Caenorhabditis elegans*. *bioRxiv* 2021.03.22.436400; doi: <https://doi.org/10.1101/2021.03.22.436400>
- [6] nf-core/fetchngs (2021) <https://doi.org/10.5281/zenodo.5070529>