# **Pipelines**

# 1 DeCon

#### 2 1.1 Introduction

DeCon is designed to retrieve genomic sequences of a target **phylum** from metagenomic assembly of paired next generation sequencing (NGS) reads. First, contigs below 400 base pair (bp) are removed and NGS reads are mapped to filtered assembly by minimap2 (Li 2018). Second, SprayNPray (Garber et al. 2022) is used to compute coverage, GC content and coding density of each contigs. Third, contigs are searched against non-redundant (nr) database by DIAMOND (Buchfink et al. 2015) in long read mode and assigned to phyla by MEGAN (Huson et al. 2007) in long read mode. Forth, a decision tree classifier is trained, taking coverage, GC content and coding density of contigs as training features and phylum assignments from MEGAN as target value. This classifier is used to compute phylum assignments of contigs that are not determined by MEGAN. Fifth, contigs assigned to the target phylum are retrieved. QUAST (Gurevich et al. 2013) and BUSCO (Simão et al. 2015) are used to evaluate retrieved genome.

### 1.2 Dependencies

#### 14 Softwares

- 15 R
- 16 Python
- 17 minimap2
- 18 SAMtools
- 19 SprayNPray
- 20 DIAMOND
- 21 MEGAN tools (daa-meganizer daa2info)
- 22 seqkit
- 23 QUAST
- 24 BUSCO

```
25
      Databases
26
   DIAMOND database (nr)
27
   MEGAN database
   BUSCO database
30
      Python modules
31
   numpy
32
   pandas
33
   scikit-learn
35
```

R packages

Usage

reticulate

stringr

1.3

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- 41 Modify configuration file (templated as DeCon\_conf.R), and run
- Rscript path/DeCon\_pipeline.R path/DeCon\_main.R path/DeCon\_main.py path/DeCon\_conf.R

### <sup>43</sup> 2 ProtGeneCall

# 44 2.1 Introduction

ProtGeneCall is designed to call protein-coding genes from genome, combining protein-genome alignments, transcriptome-genome alignments and *ab initio* gene predictions. First, repeat elements are identified by RepeatModeler (Smit et al. 2015b) and masked by RepeatMasker (Smit et al. 2015a). Masked genome is used for downstream analysis. Second, proteins of closely related species are mapped to the masked genome by miniprot (Li 2023). Third, paired RNA-sequencing (RNA-seq) reads are mapped to masked genome by Hisat2 (Kim et al. 2019). Forth, transcriptome-genome alignments are computed by StringTie (Pertea et al. 2015). Fifth, gene structures are predicted from transcriptome-genome alignments by TransDecoder (Haas et al. 2016), combining searching against UniRef (Suzek et al. 2007) by (Buchfink et al. 2015) and PfamA (Mistry et al. 2021) by HMMER (Eddy 1992). Sixth, AUGUSTUS (Stanke et al. 2003) is trained with gene structures from TransDecoder to compute gene predictions. Seventh,

BRAKER (Hoff et al. 2019) is trained with RNA-seq mapping to call genes. Eighth, GALBA (Hoff et al. 2019) is trained with proteins of closely related species. Ninth, protein-genome alignments from miniprot, transcript-genome alignments from Hisat2-StringTie, and *ab initio* gene predictions from TransDecoder, AUGUSTUS, BRAKER and GALBA are integrated into consensus gene structures by EvidenceModeler (Haas et al. 2008). Tenth, genes from EvidenceModeler are removed if they are supported by only one *ab initio* predictor and lack protein/RNA-seq evidence. Eleventh, two iterations of PASA (Haas et al. 2008) is used to update filtered gene structures from EvidenceModeler. Twelfth, genes with in-frame stop codons or incomplete coding regions (coding regions with length cannot be divided by 3) are removed and the predicted peptide set is evaluated by BUSCO (Simão et al. 2015).

# 64 2.2 Dependencies

- 65 Softwares
- 66 R
- 67 Python
- 68 RepeatModeler
- 69 RepeatMasker
- 70 miniprot
- 71 Hisat2
- 72 SAMtools
- 73 StringTie
- 74 TransDecoder
- 75 HMMER
- 76 DIAMOND
- 77 AGAT
- 78 AUGUSTUS
- 79 BLAST+
- 80 GALBA
- 81 BRAKER
- 82 EvidenceModeler
- 83 BUSCO
- 84 gffread
- 85 segkit
- 86 MAKER

```
87
       Databases
88
   DIAMOND database (UniRef)
89
   Pfam-A
91
       External scrpts
92
   cufflinks_gtf_to_alignment_gff3.pl from EvidenceModeler
93
   augustus_GFF3_to_EVM_GFF3.pl from EvidenceModeler
   gth2gtf.pl from AUGUSTUS
95
   computeFlankingRegion.pl from AUGUSTUS
96
   gff2gbSmallDNA.pl from AUGUSTUS
97
   gtf2aa.pl from AUGUSTUS
   simplifyFastaHeaders.pl from AUGUSTUS
99
   aa2nonred.pl from AUGUSTUS
100
   filterGenesIn.pl from AUGUSTUS
101
   autoAug.pl from AUGUSTUS
102
   evm_evidence.py in this GitHub
103
104
       R packages
105
   stringr
106
   parallel
107
108
   2.3
         Usage
109
   Modify configuration file (templated as ProtGeneCall_conf.R), and run
110
   Rscript path/ProtGeneCall_pipeline.R path/ProtGeneCall_main.R path/ProtGeneCall_conf.R
111
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# <sup>112</sup> 3 Pipeline for calling repeat elements from genome (RepCall)

## 113 3.1 Introduction

Pipeline RepCall is designed to call repeat elements genes from genome. First, miniature inverted-repeat transposable elements (MITE) are called by MITE-Hunter (Han et al. 2010). Second, long terminal repeats (LTRs) are identified by incorporating LTR\_FINDER\_parallel (Ou et al. 2019), LTRharvest (Elling-

haus et al. 2008) and LTR\_retriever (Ou et al. 2018). Third, identified MITEs and LTRs are masked by RepeatMasker (Smit et al. 2015a). Forth, RepeatModeler (Smit et al. 2015b) is used to further identify repeats in the masked genome. Fifth, the locations of MITEs, LTRs and repeats from RepeatModeler are identified by RepeatMasker and all repeats are incorporated into a consensus library.

### 121 3.2 Dependencies

#### 122 Softwares

123 R

131

124 seqkit

125 MITE-Hunter

126 LTR\_FINDER\_parallel

127 LTRharvest

128 LTR\_retriever

129 RepeatMasker

130 RepeatModeler

# 132 **3.3** Usage

- 133 Modify configuration file (templated as RepCall\_conf.R), and run
- Rscript path/RepCall\_pipeline.R path/RepCall\_main.R path/RepCall\_conf.R

# 135 4 ncRNAcall

#### 136 4.1 Introduction

ncRNAcall is designed to call non-coding RNA (ncRNA) from genome. First, transfer RNA (tRNA) is identified by tRNAscan-SE (Lowe et al. 1997). Second, microRNA is called by miRNAture (Velandia-Huerto et al. 2021). Third, target genes of microRNA are identified by searching microRNA against annotated three prime untranslated regions (3'UTR) by miRanda (Enright et al. 2003). Forth, Infernal (Nawrocki et al. 2013) searches against Rfam (Kalvari et al. 2021) database to call other non-coding RNA, e.g. ribosomal RNA (rRNA) and small nuclear RNA (snRNA). Fifth, all results are incorporated together.

## 144 4.2 Dependencies

# **Softwares** 145 $\mathbf{R}$ tRNAscan-SE 147 biocode 148 miRNAture miRanda 150 bedtools 151 segkit 152 Infernal 153 154 **Databases** 155 miRNAture database Rfam database 157 158 R packages parallel stringr 160 161

# 162 **4.3** Usage

Modify configuration file (templated as ncRNAcall\_conf.R), and run
Rscript path/ncRNAcall\_pipeline.R path/ncRNAcall\_main.R path/ncRNAcall\_conf.R

# 5 buscoProt2Phylo

#### 166 5.1 Introduction

buscoProt2Phylo infers phylogenetic tree using single-copy genes defined by BUSCO (Simão et al. 2015).
First, from BUSCO runs complete single-copy protein sequences are collected and classified according to
protein families that they belong to. Second, for protein families that are identified in above 4 BUSCO
runs, protein sequences are aligned by MAFFT (Katoh et al. 2002). Third, multiple sequence alignments
from MAFFT are trimmed by trimAl (Capella-Gutiérrez et al. 2009). Forth, gene trees are inferred from
trimmed multiple sequence alignments by IQ-TREE (Minh et al. 2020) with 1,000 bootstrap replicates.
Fifth, species tree is inferred from gene trees by ASTRAL (Zhang et al. 2018). Sixth, a supermatrix

method was used to infer species tree from the multiple sequence alignments from MAFFT. Multiple sequence alignments contains 85%, 87.5%, 90% 92.5%, 95%, 97.5% and 100% of the total species were concatenated into supermatrixes, respectively. Missing species were represented by gaps. From each supermatrix a species tree was inferred by IQ-TREE (Minh et al. 2020) with 1,000 bootstrap replicates.

# 178 5.2 Dependencies

# **Softwares** R 180 MAFFT 181 trimAl 182 segkit **IQ-TREE** 184 ASTRAL 185 R packages 187 parallel 188

#### 190 **5.3** Usage

191 Modify configuration file (templated as buscoProt2Phylo\_conf.R), and run

Rscript path/buscoProt2Phylo\_pipeline.R path/nbuscoProt2Phylo\_main.R path/buscoProt2Phylo\_conf.R

### 193 6 metaTrans

#### 194 6.1 Introduction

metaTrans is designed for taxonomic profiling of metatranscriptomic sequencing of paired NGS reads. 195 First, metatranscriptomic reads are mapped to corresponding host genome by Hisat2 (Kim et al. 2019) 196 and unmapped reads are extracted by SAMtools (Li et al. 2009). Second, ribosomal RNA reads are 197 removed by SortMeRNA (Kopylova et al. 2012). Third, all reads are pooled together and assembled by 198 rnaSPAdes (Bushmanova et al. 2019). Forth, MMseqs2 (Steinegger et al. 2017) (-cov-mode 1 -c 0.75 -min-199 seq-id 0.75) is used to remove redundancy in assembly from rnaSPAdes. Fifth, coding regions of assembled 200 transcripts are identified by TransDecoder (Haas et al. 2016), combining searching against UniRef (Suzek 201 et al. 2007) by DIAMOND (Buchfink et al. 2015) and PfamA (Mistry et al. 2021) by HMMER (Eddy 202

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1992). Sixth, protein sequences transcribed by assembled transcripts are searched against non-redundant database by DIAMOND (Buchfink et al. 2015) and assigned to taxa by MEGAN (Huson et al. 2007).

Seventh, reads are mapped to assembled transcripts by minimap2 (Li 2018) and SAMtools is used to compute coverage and depth of transcripts. Eighth, coverage, depth, coordinates of coding regions and taxonomy assignments of transcripts are taken together as comprehensive tables. Ninth, protein functions are inferred by InterproScan (Jones et al. 2014). Tenth, protein functions are inferred by eggNOG-mapper (Cantalapiedra et al. 2021).
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# 210 6.2 Dependencies

234

```
Softwares
211
   R
212
   Hisat2
213
   SAMtools
214
   SortMeRNA
   SPAdes
216
   MMseqs2
217
   TransDecoder
   DIAMOND
219
   HMMER
220
   MEGAN tools (daa-meganizer daa2info)
221
   minimap2
222
   gffread
223
   segkit
224
   MAKER
   InterproScan
226
   eggNOG-mapper
227
       External scripts simplifyFastaHeaders.pl from AUGUSTUS
229
230
       Databases
231
   DIAMOND database (UniRef)
232
   Pfam-A
233
```

#### 235 R packages

236 stringr

237

## 238 **6.3** Usage

- 239 Modify configuration file (templated as metaTrans\_conf.R), and run
- 240 Rscript path/metaTrans\_pipeline.R path/metaTrans\_main.R path/metaTrans\_conf.R

# 7 PseudoCall

#### 7.1 Introduction

- PseudoCall is designed to call pseudogenes with PseudoPipe that has been modified to (1) use stricter
- criteria for filtering blast hits, (2) run commands in parallel and (3) enable restarting. (To be contin-
- 245 **ued...**)

### 246 7.2 Dependencies

#### 247 **7.3** Usage

- 248 Modify configuration file (templated as PseudoCall\_conf.R), and run
- Rscript path/PseudoCall\_pipeline.R path/PseudoCall\_main.R path/PseudoCall\_conf.R

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