# Roslin Variants v2.2

Roslin is a **cancer informatics pipeline** maintained by the Platform Informatics group at the Center for Molecular Oncology (CMO). Its workflow for targeted-variants is capable of variant calling, annotation, and analysis of data from 341, 410, or 468 gene MSK-IMPACT assays [1], IMPACT+, HemePACT, and various exome capture kits. Additional workflows for xenograft, cell-free DNA, whole genome, and RNA-seq are planned for 2018.

Roslin builds on prior work by the Bioinformatics Core, Clinical Bioinformatics, and Computational Oncology groups, and continues to rely on their accumulated experience and expertise, with emphasis on these features:

Modular - Easily addon or replace sequence aligners, variant callers, false-positive filters, functional/clinical annotation, and analysis modules for manuscript-ready plots/tables.

Reproducible - Retain all older versions and documentation in sufficient detail to reproduce published results, with zero dependencies on proprietary software or obfuscated methods.

Portable - Install Roslin and process new datasets with minimal fuss on laptops, workstations, local compute clusters, or cloud compute servers.

Most of these goals are accomplished using UCSC's Toil [2], a cross-platform workflow management system that uses the Common Workflow Language (CWL), a workflow definition standard promoted by the Global Alliance for Genomics and Health (GA4GH).

# Manifest of Roslin output files v2.2.2

The output of the Roslin pipeline consists of the following folders at the main project level. \$ROOT is the path to the top of the output hierarchy and in that folder the output is organized as follows:

- \$ROOT/results: Primary results directory, most users should look here first.
- \$ROOT/docs: Documentation and pipeline parameters, settings versions.
- \$ROOT/bams: BAM files with indices
- \$ROOT/output: Detailed output of the pipeline

# \$ROOT/docs

This folder contains documentation about the output and pipeline and also the parameters used in this specific run of the pipeline. The input arguments/parameters are in the folder: inputs. A PDF copy of this file is in this folder manifest.pdf. This version of the documentation will match the pipeline version run.

The docs folder has a subfolder qc with a PDF of some of the core QC-metrics (full metric output is in the output ) folder. The file is \${projNo}\_QC\_Report.pdf.

The input folder has the following files:

- inputs.yam1 All inputs self-contained in a format that Roslin likes, including paths to reference genomes, assay target/bait sets, known somatic hotspots, etc.
- settings Version information of Roslin pipeline and Roslin core
- \${projNo}\_request.txt Relevant information from the original iLabs request
- \${projNo}\_sample\_mapping.txt Maps samples to the folders containing their FASTQs
- \${projNo} sample pairing.txt Pairs tumors to normals for somatic variant calling
- \${projNo}\_sample\_grouping.txt Groups samples that belong to the same patient
- \${projNo} sample data clinical.txt Patient/sample data from the investigator

## \$ROOT/results

The files in this folder all start with a prefix which is the project number (e.g.; Proj\_01234), here we will denote that with \$projNo. There are three primary results types given: mutations, copy number (using the FACETS algorithm), and fusions. Each results type is in its own folder: variants, copyNumber, rearrangements

## \$ROOT/results/variants

There are two primary MAF files in the \$ROOT/results/variants folder: The *portal* (DMP) MAF and the *analysis* MAF. The *portal* MAF contains a subset of the events that are in the *analysis* MAF. The steps to creating the *analysis* MAF are as follows:

```
    Merge all sample level MAFs (which are in `$ROOT/output/maf`)
    Remove events that are tag as false-positives and any from cmo_fillout.
    Remove splice region variants in non-coding genes, or those that are >3bp into introns.

            For indels, use the closest distance to the nearby splice junction.

    Remove all non-coding events except interesting ones like TERT promoter mutations.
```

The portal MAF then applies the following additional filters.

```
Remove silent aka synonymous mutations
Remove genes without Entrez IDs, usually non-coding genes
Remove intronic splice region mutations i.e. >2bp into introns
For IMPACT/HemePACT runs, apply MSK-IMPACT cutoffs:

Total depth >= 20
Allele Depth `>=10` for non-hotspots, `>=8` for hotspots
VAF `>=5%` for non-hotspots, VAF `>=2%` for hotspots
Length f Indel or ONP < 30bps</li>
```

Output from the FACETS copy number method.

- \${projNo}.hisens.gene.cna.txt: Unified (all samples) gene level calls file.
- \${projNo}.hisens.seg.cna.txt: Unified segmentation file in IGV format.

Facets was run in a two pass mode: Pass (1) was to option purity estimates with coarse grain parameters to get large features accurately and pass (2) with hi-sensitivity parameters to increase spatial resolution. In the results folder we have only the output from the hisens pass (the purity pass) is available in the full output folder.

- \${projNo}.purity.Parameters.out The run parameters used for the specific pass
- \${projNo}.purity.SamplesValues.out Sample level output from the Facets algorithm.
- \${projNo}.purity.CNCF.pdf Plots of the bi-segmentation profiles and integer copy number calls
- \${projNo}.purity.cncf.txt Segment level copy number and cell fraction and integer copy number.

### **Fusions**

• \${projNo}.fusions.txt - Filtered fusion calls. Calls were filtered to include fusions that are on a *white-list* derived from OncoKB fusion1 (http://oncokb.org/api/v1/variants/lookup?variant=fusion) and *also* have a precise breakpoint.

# \$ROOT/bams

The fully processed (markduplicated, realigned, recalibrated) BAM files for the project with indices. *N.B.* the two copies of the index files ( .bai and .bam.bai ) are *indentical*, both are provide because certian bioinformatics tools will only recognize one or the other.

## \$ROOT/output

The output folder contains a comprehensive set of output files from the pipeline; a verbose results folder.

### \$ROOT/output/maf

- \${sampleID}.svs.pass.vep.maf Structural variants (SVs) in MAF format (IMPACT only)
- \${sampleID}.muts.maf Small substitutions and indels in MAF format. False positives have a non-PASS tag in the FILTER column, and "fillout" rows (allele counts per event in other samples) are tagged "None" in the Mutation\_Status column.

## \$ROOT/output/vcf

- \${sampleID}.vardict.vcf Substitutions and indels reported by VarDict in VCF format
- \${sampleID}.mutect.{vcf,txt} A MuTect VCF plus its more detailed tab-delimited format
- \${sampleID}.pindel.vcf Comprehensive VCF of indels reported by Pindel
- \${sampleID}.svs.vcf Comprehensive VCF of SVs detected by Delly (IMPACT only)
- \${sampleID}.svs.pass.vcf Shortlisted VCF of Delly SVs after some basic filtering

#### \$ROOT/output/facets

- \${sampleID} hisens.CNCF.png A plot for genome-wide integer copy-number (CN) per Facets
- \${sampleID}\_hisens.cncf.txt Stats per segment with sufficient data for CN estimation
- \${sampleID} hisens.seg Segmented copy-number data listing log-ratios
- \${sampleID}\_purity.\* All the files above, for the run of facets that estimated purity

### \$ROOT/output/portal

This directory contains the files used for upload to the portal and contain the exact same events displayed in the portal.

- data\_mutations\_extended.txt The subset of mutations that the portal will display. It starts with the events from the main results maf (\${projNo}.muts.maf) and then applies the following filters:
  - Remove silent aka synonymous muts
  - · Remove genes without Entrez IDs, usually non-coding genes
  - Remove intronic splice region muts i.e. >2bp into introns
  - For IMPACT/HemePACT runs, apply DMP cutoffs:
    - Allele Depth >=8
    - VAF >=5% for non-hotspots, VAF >=2% for hotspots
- data\_clinical.txt Clinical data per patient/sample to display in the portal
- data\_CNA.txt Sample x Gene matrix listing discretized copy number alterations
- data fusions.txt Shortlist of somatic structural variants (IMPACT only)
- \${PI\_UUID}\_data\_cna\_hg19.seg Segmented copy-number data listing log-ratios. \${PI\_UUID} is the Roslin/Portal UUID for the project. *N.B.* this is differnt from \$projNo
- case lists Folder containing lists of sample IDs with meta-data for the portal
- meta\_\*.txt Metadata about the study and the files above that the portal needs

## \$ROOT/output/qc

- \${projNo}\_CutAdaptStats.txt Stats on paired end reads that needed trimming
- \${projNo}\_DiscordantHomAlleleFractions.txt Concordance of homozygous SNPs
- \${projNo}\_FingerprintSummary.txt Concordance of heterozygous SNPs
- \${projNo}\_UnexpectedMatches.txt Samples from different patients with concordance
- \${projNo} UnexpectedMismatches.txt Samples from same patient with discordance
- \${projNo}\_MajorContamination.txt Contamination check using heterozygous SNP VAFs
- \${projNo}\_MinorContamination.txt Contamination check using homozygous SNP VAFs
- \${projNo}\_GcBiasMetrics.txt Check if coverage varies much by GC content
- \${projNo}\_HsMetrics.txt Targeted library hybridization metrics per Picard
- \${projNo}\_InsertSizeMetrics\_Histograms.txt Insert size distribution per sample
- \${projNo}\_markDuplicatesMetrics.txt Fragment duplication rates per Picard
- \${projNo} pre recal MeanQualityByCycle.txt quality scores before GATK BQSR
- \${projNo}\_post\_recal\_MeanQualityByCycle.txt quality scores after GATK BQSR
- \${projNo} ProjectSummary.txt Table of QC stats that have passed or failed

• \${projNo}\_SampleSummary.txt - Table of successes/failures per sample

### \$ROOT/output/log

- cwltoil.log Records warnings and messages from the Toil workflow manager
- output-meta.json Metadata on all files generated and used by Toil
- run-results.json Indication of completed or failed steps of Roslin pipeline
- stderr.log Records warnings and failures
- stdout.log Records the stdout of Roslin pipeline progress

# Version info

```
export ROSLIN_PIPELINE_DESCRIPTION="Roslin Variant Pipeline v2.2.0"

# Roslin pipeline name/version
export ROSLIN_PIPELINE_NAME="variant"
export ROSLIN_PIPELINE_VERSION="2.2.0"

# which version of Roslin Core is required?
export ROSLIN_CORE_MIN_VERSION="2.0.2"
export ROSLIN_CORE_MAX_VERSION="2.0.2"

# cmo
export ROSLIN_CMO_VERSION="1.9.8"
```

# Modules in the Roslin Targeted-Variants Workflow

Roslin is currently driven by 6 modules.

# Module 1 - Alignment

Demultiplexed fastq files are trimmed using Trim Galore v0.2.5mod [3] which removes adapters and short reads. These are then aligned to a human reference genome (ie GRCh37) using BWA-MEM v0.7.5a [4]. Picard Tools v2.9 [5] AddOrReplaceReadGroups is performed to annotate read groups and MarkDuplicates to mark PCR duplicates.

# Module 2 - Recalibration & Realignment

Genomic regions are identified using FindCoveredIntervals from GATK Tool Kit v3.3-0 [6] and subjected to indel realignment using Assembly Based ReAligner (ABRA) v2.12 [7].

GATK BaseRecalibrator is used to detect systematic errors in base quality scores.

# Module 3 - Variant Calling

Roslin uses multiple variant callers in combination to detect somatic mutations.

Variant calling was performed in paired tumor/normal mode using MuTect v1.1.4 [8] for single nucleotide variants (SNV). Pindel v0.2.5a7 [9] is used for small insertions and deletions (indels). Vardict v1.5.1 [10] is an ultra sensitive variant caller to report both SNVs and indels.

### MuTect parameters:

- -totaldepth 5 #tumor total depth threshold
- -alleledepth 3 #tumor allele depth threshold
- -tnRatio 5 # tumor-normal varint frequency ratio threshold
- -variantfraction 0.01 # tumor variant frequency threshold

## Vardict parameters:

- -f 0.01
- -Q 20
- -q 20
- -X 5
- -x 2000

#### Pindel parameters:

- -min\_var\_len 0 #min length of indels
- -max\_var\_len 200 #max length of indels
- -max\_hom\_len 5 #max length of micro-homology at indel breakpoint

In addition, copy-number variants including chromosomal instability (CIS) and whole-genome doubling (WGD) were called using FACETS [11]. Microsatellite instability is also detected using Msisensor msi [12].

The vcfs generated by MuTect, Vardict, and Pindel are combined (need to detail).

# Module 4 - Variant Filtering & Annotation

Resulting variants were annotated using vcf2maf v1.6.14 [13] which uses Ensembl's Variant Effect Predictor v86. Additional filtering is done to make sure complex variants (substitution with >1 bps replaced/deleted/inserted by another >1 bps ) are called correctly. Roslin also flags false-positive somatic calls using ngs\_filters v1.2.1 [14].

# Module 5 - QC Metrics

A project report is generated detailing the different quality calls used and measured in the analysis. Roslin uses the following Picard metrics:

CollectAlignmentSummaryMetrics

CollectHsMetrics

CollectInsertSizeMetrics

CollectMultipleMetrics

CollectGcBiasMetrics

DepthOfCoverage

These will provide in great detail samples with low coverage, duplication rates, sample mismatches, read quality, etc.

# Module 6 - Structural Variants

Somatic structural aberrations were identified using DELLY v0.7.7 [15].

### **DELLY** parameters:

- -s 9 #insert size cutoff
- -u 5 # min. mapping quality for genotyping
- -a 0.04 # min. fractional ALT support
- -minsize 500 #min. SV size
- -maxsize 500000000 # max. SV size
- -ratiogeno 0.0 #min. fraction of genotyped samples
- -pass true #Filter sites for PAS
- -coverage 10 #min. coverage in tumor
- -controlcontamination 0 #max. fractional ALT support in control
- -gq 15 #min. median GQ for carriers and non-carriers
- -rddel 0.800000012 #max. read-depth ratio of carrier vs. non-carrier for a deletion
- -rddup 1.20000005 # min. read-depth ratio of carrier vs. non-carrier for a duplication

# References

- 1. Cheng, D. T., Mitchell, T. N., Zehir, A., Shah, R. H., Benayed, R., Syed, A., ... & Brannon, A. R. (2015). Memorial Sloan Kettering-Integrated Mutation Profiling of Actionable Cancer Targets (MSK-IMPACT): a hybridization capture-based next-generation sequencing clinical assay for solid tumor molecular oncology. The Journal of molecular diagnostics, 17(3), 251–264.
- 2. Vivian, J., Rao, A. A., Nothaft, F. A., Ketchum, C., Armstrong, J., Novak, A., ... Paten, B. (2017). Toil enables reproducible, open source, big biomedical data analyses. Nature Biotechnology, 35(4), 314–316. http://doi.org/10.1038/nbt.3772
- 3. Krueger, F. (2015). Trim galore. A wrapper tool around Cutadapt and FastQC to consistently apply quality and adapter trimming to FastQ files.
- 4. Li H. and Durbin R. (2009) Fast and accurate short read alignment with Burrows-Wheeler Transform. Bioinformatics, 25:1754-60. [PMID: 19451168]
- 5. https://github.com/broadinstitute/picard
- 6. i. a. DePristo et al., A framework for variation discovery and genotyping using next-generation DNA sequencing data. Nat Genet 43, 491-498 (2011).
- 7. i. a. Mose, M. D. Wilkerson, D. N. Hayes, C. M. Perou, J. S. Parker, ABRA: improved coding indel detection via assembly-based realignment. Bioinformatics 30, 2813-2815 (2014).
- 8. i. Cibulskis et al., Sensitive detection of somatic point mutations in impure and heterogeneous cancer samples. Nat Biotechnol 31, 213-219 (2013).
- 9. i. Ye, M. H. Schulz, Q. Long, R. Apweiler, Z. Ning, Pindel: a pattern growth approach to detect break points of large deletions and medium sized insertions from paired-end short reads. Bioinformatics 25, 2865-2871 (2009).
- 10. https://github.com/AstraZeneca-NGS/VarDict
- 11. https://github.com/mskcc/facets-suite
- 12. Niu, B., Ye, K., Zhang, Q., Lu, C., Xie, M., McLellan, M. D., ... & Ding, L. (2013). MSIsensor: microsatellite

instability detection using paired tumor-normal sequence data. Bioinformatics, 30(7), 1015-1016.

- 13. https://github.com/mskcc/vcf2maf
- 14. https://github.com/mskcc/ngs-filters
- 15. Tobias Rausch, Thomas Zichner, Andreas Schlattl, Adrian M. Stuetz, Vladimir Benes, Jan O. Korbel. Delly: structural variant discovery by integrated paired-end and split-read analysis. Bioinformatics 2012 28: i333-i339.