ADAM

Introduction

ADAM is a genomics analysis platform with specialized file formats built using <u>Apache Avro</u>, <u>Apache Spark</u> and <u>Apache Parquet</u>. Apache 2 licensed. Some quick links:

- Follow our Twitter account.
- Chat with ADAM developers in Gitter.
- Join our mailing list.
- Checkout the current build status.
- Download official releases.
- View our software artifacts on Maven Central (...including snapshots).
- Look at our CHANGES file.

Hello World: Counting K-mers

Here's an example ADAM CLI command that will count 10-mers in <u>a test</u> <u>.sam</u> <u>file that lives</u> <u>in this repository</u>:

```
$ adam-submit count_kmers /tmp/small.adam /tmp/kmers.adam 10
$ head /tmp/kmers.adam/part-*
(AATTGGCACT,1)
(TTCCGATTTT,1)
(GAGCAGCCTT,1)
(CCTGCTGTAT,1)
(TTTTAAGGTT,1)
(GGCCAGGACT,1)
(GCAGTCCCTC,1)
(AACTTTGAAT,1)
(GATGACGTGG,1)
(CTGTCCCTGT,1)
```

More than K-mer Counting

ADAM does much more than just k-mer counting. Running the ADAM CLI without arguments or with --help will display available commands, e.g.

<pre>\$ adam-submit</pre>				
е	888~	е	e e	
d8b	888 \	d8b	d8b d8b	
/Y88b	888	/Y88b	d888bdY88b	
/ Y88b	888	/ Y88b	/ Y88Y Y888b	
/Y88b	888 /	/Y88b	/ YY Y888b	
/ Y88b	888~	/ Y88b	/ Y888b	

Choose one of the following commands:

ADAM ACTIONS

depth : Calculate the depth from a given ADAM file, at each vari

ant in a VCF

count kmers: Counts the k-mers/q-mers from a read dataset.

count contig kmers: Counts the k-mers/q-mers from a read dataset.

transform : Convert SAM/BAM to ADAM format and optionally perform re

ad pre-processing transformations

adam2fastg : Convert BAM to FASTQ files

plugin : Executes an ADAMPlugin

flatten: Convert a ADAM format file to a version with a flattened

schema, suitable for querying with tools like Impala

CONVERSION OPERATIONS

vcf2adam : Convert a VCF file to the corresponding ADAM format

anno2adam : Convert a annotation file (in VCF format) to the corresp

onding ADAM format

adam2vcf : Convert an ADAM variant to the VCF ADAM format

fasta2adam : Converts a text FASTA sequence file into an ADAMNucleoti

deContig Parquet file which represents assembled sequences.

features2adam : Convert a file with sequence features into corresponding

ADAM format

```
PRINT

print: Print an ADAM formatted file

print_genes: Load a GTF file containing gene annotations and print the

corresponding gene models

flagstat: Print statistics on reads in an ADAM file (similar to sa

mtools flagstat)

print_tags: Prints the values and counts of all tags in a set of rec

ords

listdict: Print the contents of an ADAM sequence dictionary

allelecount: Calculate Allele frequencies

buildinfo: Display build information (use this for bug reports)

view: View certain reads from an alignment-record file.
```

You can learn more about a command, by calling it without arguments or with --help, e.g.

```
$ adam-submit transform
Argument "INPUT" is required
 INPUT
                                                                   : The ADAM, BA
M or SAM file to apply the transforms to
                                                                   : Location to
 OUTPUT
write the transformed data in ADAM/Parquet format
                                                                   : Set the numb
 -coalesce N
er of partitions written to the ADAM output directory
 -dump observations VAL
                                                                   : Local path t
o dump BQSR observations to. Outputs CSV format.
 -force load bam
                                                                   : Forces Trans
form to load from BAM/SAM.
                                                                   : Forces Trans
 -force load fastq
form to load from unpaired FASTQ.
                                                                   : Forces Trans
 -force load ifastq
form to load from interleaved FASTQ.
 -force load parquet
                                                                   : Forces Trans
```

```
form to load from Parquet.
 -h (-help, --help, -?)
                                                                  : Print help
 -known indels VAL
                                                                  : VCF file inc
luding locations of known INDELs. If none is provided, default
                                                                    consensus mo
del will be used.
                                                                  : Sites-only V
 -known snps VAL
CF giving location of known SNPs
 -log_odds_threshold N
                                                                  : The log-odds
threshold for accepting a realignment. Default value is 5.0.
 -mark duplicate reads
                                                                  : Mark duplica
te reads
                                                                  : The maximum
 -max consensus number N
number of consensus to try realigning a target region to. Default
                                                                    value is 30.
                                                                  : The maximum
 -max indel size N
length of an INDEL to realign to. Default value is 500.
                                                                  : The maximum
 -max target size N
length of a target region to attempt realigning. Default length is
                                                                   3000.
                                                                  : Parquet bloc
 -parquet block size N
k size (default = 128mb)
 -parquet compression codec [UNCOMPRESSED | SNAPPY | GZIP | LZO] : Parquet comp
ression codec
 -parquet disable dictionary
                                                                  : Disable dict
ionary encoding
 -parquet logging level VAL
                                                                  : Parquet logg
ing level (default = severe)
 -parquet page size N
                                                                  : Parquet page
size (default = 1mb)
                                                                  : Print metric
 -print metrics
s to the log on completion
 -realign indels
                                                                  : Locally real
ign indels present in reads.
 -recalibrate base qualities
                                                                  : Recalibrate
```

the base quality scores (ILLUMINA only)

-repartition N : Set the numb

er of partitions to map data to

-sort_fastq_output : Sets whether

to sort the FASTQ output, if saving as FASTQ. False by default.

Ignored if n

ot saving as FASTQ.

-sort_reads : Sort the rea

ds by referenceId and read position

The ADAM transform command allows you to mark duplicates, run base quality score recalibration (BQSR) and other pre-processing steps on your data.

Getting Started

Installation

Binary Distributions

Bundled release binaries can be found on our releases page.

Building from Source

You will need to have Maven installed in order to build ADAM.

You might want to take a peek at the script and give it a run. It will fetch a mouse chromosome, encode it to ADAM reads and pileups, run flagstat, etc. We use this script to test that ADAM is working correctly.

Installing Spark

You'll need to have a Spark release on your system and the \$SPARK_HOME environment variable pointing at it; prebuilt binaries can be downloaded from the Spark website.

Currently, our continuous builds use Spark 1.1.0 built against Hadoop 2.3 (CDH5), but any more recent Spark distribution should also work.

Helpful Aliases

You might want to add the following to your .bashrc to make running ADAM easier:

```
alias adam-submit="${ADAM_HOME}/bin/adam-submit"
alias adam-shell="${ADAM_HOME}/bin/adam-shell"
```

\$ADAM_HOME should be the path to a <u>binary release</u> or a clone of this repository on your local filesystem.

These aliases call scripts that wrap the spark-submit and spark-shell commands to set up ADAM.Once they are in place, you can run adam by simply typing adam-submit at the command line, as demonstrated above.

Running ADAM

Now you can try running some simple ADAM commands:

transform

Make your first .adam file like this:

adam-submit transform \$ADAM_HOME/adam-core/src/test/resources/small.sam /tmp/sm
all.adam

If you didn't obtain your copy of adam from github, you can grab small.sam here.

flagstat

Once you have data converted to ADAM, you can gather statistics from the ADAM file using flagstat. This command will output stats identically to the samtools flagstat command.

If you followed along above, now try gathering some statistics:

```
$ adam-submit flagstat /tmp/small.adam
20 + 0 in total (QC-passed reads + QC-failed reads)
0 + 0 primary duplicates
0 + 0 primary duplicates - both read and mate mapped
0 + 0 primary duplicates - only read mapped
0 + 0 primary duplicates - cross chromosome
0 + 0 secondary duplicates
0 + 0 secondary duplicates - both read and mate mapped
0 + 0 secondary duplicates - only read mapped
0 + 0 secondary duplicates - cross chromosome
20 + 0 mapped (100.00%:0.00%)
0 + 0 paired in sequencing
0 + 0 \text{ read1}
0 + 0 \text{ read2}
0 + 0 properly paired (0.00%:0.00%)
0 + 0 with itself and mate mapped
0 + 0 singletons (0.00%:0.00%)
0 + 0 with mate mapped to a different chr
0 + 0 with mate mapped to a different chr (mapQ>=5)
```

In practice, you'll find that the ADAM flagstat command takes orders of magnitude less time than samtools to compute these statistics. For example, on a MacBook Pro flagstat NA12878_chr20.bam took 17 seconds to run while samtools flagstat NA12878_chr20.bam took 55 seconds. On larger files, the difference in speed is even more dramatic. ADAM is faster because it's multi-threaded and distributed and uses a columnar storage format (with a projected schema that only materializes the read flags instead of the whole read).

adam-shell

The adam-shell command opens an interpreter that you can run ad-hoc ADAM commands in.

For example, the following code snippet will generate a result similar to <u>the k-mer-counting</u> <u>example above</u>, but with the k-mers sorted in descending order of their number of

```
occurrences. To use this, save the code snippet as kmer.scala and run adam-shell -i kmer.scala.
```

kmer.scala

```
import org.bdgenomics.adam.rdd.ADAMContext
import org.bdgenomics.adam.projections.{AlignmentRecordField, Projection}
val ac = new ADAMContext(sc)
// Load alignments from disk
val reads = ac.loadAlignments(
  "/data/NA21144.chrom11.ILLUMINA.adam",
  projection = Some(
    Projection(
      AlignmentRecordField.sequence,
      AlignmentRecordField.readMapped,
      AlignmentRecordField.mapq
  )
// Generate, count and sort 21-mers
val kmers =
  reads
    .flatMap( .getSequence.sliding(21).map(k \Rightarrow (k, 1L)))
    .reduceByKey( + )
    .map( .swap)
    .sortByKey(ascending = false)
// Print the top 10 most common 21-mers
kmers.take(10).foreach(println)
```

```
adam-shell -i kmer.scala
```

Running on a cluster

The adam-submit and adam-shell commands can also be used to submit ADAM jobs to a Spark cluster, or to run ADAM interactively. Cluster mode can be enabled by passing the same flags you'd pass to Spark, e.g. --master yarn --deploy-mode client.

Running Plugins

ADAM allows users to create plugins via the <u>ADAMPlugin</u> trait. These plugins are then imported using the Java classpath at runtime. To add to the classpath when using appassembler, use the <u>\$CLASSPATH_PREFIX</u> environment variable. For an example of how to use the plugin interface, please see the <u>adam-plugins repo</u>.

Under the Hood

ADAM relies on several open-source technologies to make genomic analyses fast and massively parallelizable...

Apache Spark

Apache Spark allows developers to write algorithms in succinct code that can run fast locally,

on an in-house cluster or on Amazon, Google or Microsoft clouds.

Apache Parquet

<u>Apache Parquet</u> is a columnar storage format available to any project in the Hadoop ecosystem, regardless of the choice of data processing framework, data model or programming language.

- Parquet compresses legacy genomic formats using standard columnar techniques (e.g. RLE, dictionary encoding). ADAM files are typically ~20% smaller than compressed BAM files.
- Parquet integrates with:
 - Query engines: Hive, Impala, HAWQ, IBM Big SQL, Drill, Tajo, Pig, Presto
 - Frameworks: Spark, MapReduce, Cascading, Crunch, Scalding, Kite
 - Data models: Avro, Thrift, ProtocolBuffers, POJOs
- Parquet is simply a file format which makes it easy to sync and share data using tools like distcp, rsync, etc
- Parquet provides a command-line tool, parquet.hadoop.PrintFooter, which reports useful compression statistics

In the counting k-mers example above, you can see there is a defined *predicate* and *projection*. The *predicate* allows rapid filtering of rows while a *projection* allows you to efficiently materialize only specific columns for analysis. For this k-mer counting example, we filter out any records that are not mapped or have a MAPQ less than 20 using a predicate and only materialize the Sequence, ReadMapped flag and MAPQ columns and skip over all other fields like Reference or Start position, e.g.

Sequence	ReadMapped	MAPQ	Reference	Start	•••
GGTCCAT	false	-	chrom1	-	
TACTGAA	true	30	chrom1	34232	•••
TTGAATG	true	17	chrom1	309403	•••

Apache Avro

- Apache Avro is a data serialization system.
- All Big Data Genomics schemas are published at https://github.com/bigdatagenomics/bdg-formats.
- Having explicit schemas and self-describing data makes integrating, sharing and evolving formats easier.

Our Avro schemas are directly converted into source code using Avro tools. Avro supports a number of computer languages. ADAM uses Java; you could just as easily use this Avro IDL description as the basis for a Python project. Avro currently supports c, c++, csharp, java, javascript, php, python and ruby.

Downstream Applications

There are a number of projects built on ADAM, e.g.

- <u>RNAdam</u> provides an RNA pipeline on top of ADAM with isoform quantification and fusion transcription detection
- Avocado is a variant caller built on top of ADAM for germline and somatic calling
- PacMin is an assembler for PacBio reads
- A Mutect port is nearly feature complete
- Read error correction
- a graphing and genome visualization library
- <u>BDG-Services</u> is a library for accessing a running Spark cluster through web-services or a Thrift- interface
- Short read assembly
- Variant filtration (train model via MLlib)

License

ADAM is released under an Apache 2.0 license.