

# Bismark Bisulfite Mapper – User Guide - v0.7.9

# 1) Quick Reference

Bismark needs a working version of Perl and it is run from the command line. Furthermore, Bowtie (<a href="http://bowtie-bio.sourceforge.net/index.shtml">http://bowtie-bio.sourceforge.net/index.shtml</a>) or Bowtie 2 (<a href="http://bowtie-bio.sourceforge.net/bio.sourceforge.net/bio.sourceforge.ne

First you need to download a reference genome and place it in a genome folder. Genomes can be obtained e.g. from the Ensembl (<a href="http://www.ensembl.org/info/data/ftp/index.html/">http://www.ensembl.org/info/data/ftp/index.html/</a>) or NCBI websites (<a href="ftp://ftp.ncbi.nih.gov/genomes/">ftp://ftp.ncbi.nih.gov/genomes/</a>) (for the example below you would need to download the Homo sapiens genome. Bismark supports reference genome sequence files in FastA format, allowed file extensions are either either .fa or .fasta. Both single-entry and multiple-entry FastA files are supported.

The following examples will use the file 'test\_dataset.fastq' which is available for download from the Bismark homepage (it contains 10,000 reads in FastQ format, Phred33 qualities, 50 bp long reads, from a human directional BS-Seq library). An example report for use with Bowtie 1 and Bowtie can be found in Appendix IV.

## (I) Running bismark genome preparation

**USAGE:** bismark genome preparation [options] <path to genome folder>

A typical genome indexing could look like this:

/bismark/bismark\_genome\_preparation --path\_to\_bowtie /usr/local/bowtie/ -verbose /data/genomes/homo\_sapiens/GRCh37/

# (II) Running bismark

Typical alignment example (tolerating one non-bisulfite mismatch per read):

```
bismark -n 1 -1 50 /data/genomes/homo sapiens/GRCh37/ test dataset.fastq
```

# This will produce two output files:

- (a) test\_dataset.fastq\_bismark.sam (contains all alignments plus methylation call strings)

**NOTE:** In order to work properly the current working directory must contain the sequence files to be analysed.

# (III) Running the Bismark bismark methylation extractor

**USAGE:** bismark methylation extractor [options] <filenames>

A typical command to extract context-dependent (CpG/CHG/CHH) methylation could look like this:

```
bismark_methylation_extractor -s --comprehensive test_dataset.fastq_bismark.sam
```

# This will produce three output files:

- (a) CpG context test dataset.fastq bismark.txt
- (b) CHG context test dataset.fastq bismark.txt
- (c) CHH context test dataset.fastq bismark.txt

# 2) Bismark - General Information

#### What is Bismark?

Bismark is a set of tools for the time-efficient analysis of Bisulfite-Seq (BS-Seq) data. Bismark performs alignments of bisulfite-treated reads to a reference genome and cytosine methylation calls at the same time. Bismark is written in Perl and is run from the command line. Bisulfite-treated reads are mapped using the short read aligner Bowtie 1 (Langmead B, Trapnell C, Pop M, Salzberg SL. Ultrafast and memory-efficient alignment of short DNA sequences to the human genome. Genome Biol 10:R25), or alternatively Bowtie 2, and therefore it is a requirement that Bowtie 1 (or Bowtie 2) are also installed on your machine (see Dependencies).

All files associated with Bismark as well as a test BS-Seq data set can be downloaded from: http://www.bioinformatics.babraham.ac.uk/projects/bismark/

We would like to hear your comments, suggestions or bugs about Bismark! Please email them to: felix.krueger@babraham.ac.uk

#### **Installation notes**

Bismark is written in Perl and is executed from the command line. To install Bismark simply copy the bismark\_v0.X.Y.tar.gz file into a Bismark installation folder and extract all files by typing:

```
tar xzf bismark v0.X.Y.tar.gz
```

#### **Dependencies**

Bismark requires a working of Perl and Bowtie 1/Bowtie 2 to be installed on your machine (<a href="http://bowtie-bio.sourceforge.net/index.shtml">http://bowtie-bio.sourceforge.net/index.shtml</a>, <a href="http://bowtie-bio.sourceforge.net/bowtie2">http://bowtie-bio.sourceforge.net/bowtie2</a>). Bismark will assume that the Bowtie 1/Bowtie 2 executable is in your path unless the path to Bowtie is specified manually with:

```
--path to bowtie </../../bowtie>.
```

**NOTE:** In order to work properly the current working directory must contain the sequence files to be analysed.

# **Hardware requirements**

Bismark holds the reference genome in memory and in addition to that runs four parallel instances of Bowtie. The memory usage is dependent on the size of the reference genome. For a large eukaryotic genome (human or mouse) we experienced a typical memory usage of around 12GB. We thus recommend running Bismark on a machine with 5 CPU cores and at least 12 GB of RAM. The memory requirements of Bowtie 2 are somewhat larger (possibly to allow gapped alignments). When running Bismark using Bowtie 2 we therefore recommend a system with at least 5 cores and > 16GB of RAM.

Alignment speed depends largely on the read length and alignment parameters used. Allowing many mismatches and using a short seed length (which is the default option for Bowtie 1, see below) tends to be fairly slow, whereas looking for near perfect matches can align around 5-25 million sequences per hour (using Bowtie 1). Since we haven't tested Bowtie 2 very much yet we can't give recommendations about alignment parameters and speed of Bowtie 2 at the current time.

#### BS-Seq test data set

A test BS-Seq data set is available for download from the Bismark homepage. It contains 10,000 single-end shotgun BS reads from human ES cells in FastQ format (from SRR020138, Lister *et al.*, 2009; trimmed to 50 bp; base call qualities are Sanger encoded Phred values (Phred33)).

## Which kind of BS-Seq files and/or experiments are supported?

Bismark supports the alignment of bisulfite-treated reads (whole genome shotgun BS-Seq (WGSBS) or reduced-representation BS-Seq (RRBS)) for the following conditions:

- sequence format either FastQ or FastA
- single-end or paired-end reads
- input files can be uncompressed or gzip-compressed (ending in .gz)
- variable read length support
- directional or non-directional BS-Seq libraries

In addition, Bismark retains much of the flexibility of Bowtie 1/Bowtie 2 (adjustable seed length, number of mismatches, insert size ...). For a full list of options please run bismark --help or see the Appendix at the end of this User Guide.

**NOTE:** It should be mentioned that Bismark supports only reads in base-space, such as from the Illumina platform. There are currently no plans to extend its functionality to color-space reads.

## **How does Bismark work?**

Sequence reads are first transformed into fully bisulfite-converted forward (C->T) and reverse read (G->A conversion of the forward strand) versions, before they are aligned to similarly converted

versions of the genome (also C->T and G->A converted). Sequence reads that produce a unique best alignment from the four alignment processes against the bisulfite genomes (which are running in parallel) are then compared to the normal genomic sequence and the methylation state of all cytosine positions in the read is inferred. For use with Bowtie 1, a read is considered to align uniquely if one alignment exists that has with fewer mismatches to the genome than any other alignment (or if there is no other alignment). For Bowtie 2, a read is considered to align uniquely if an alignment has a unique best alignment score (as reported by the Bowtie 2 AS: i field). If a read produces several alignments with the same number of mismatches or with the same alignment score (AS: i field), a read (or a read-pair) is discarded altogether.

## Bismark alignment and methylation call report

Upon completion, Bismark produces a run report containing information about the following:

- Summary of alignment parameters used
- Number of sequences analysed
- Number of sequences with a unique best alignment (mapping efficiency)
- Statistics summarising the bisulfite strand the unique best alignments came from
- Number of cytosines analysed
- Number of methylated and unmethylated cytosines
- Percentage methylation of cytosines in CpG, CHG or CHH context (where H can be either A, T or C). This percentage is calculated individually for each context following the equation:

% methylation (context) = 100 \* methylated Cs (context) / (methylated Cs (context) + unmethylated Cs (context)).

It should be stressed that the percent methylation value (context) is just a very rough calculation performed directly at the mapping step. Actual methylation levels after post-processing or filtering have been applied may vary.

# 3) Running Bismark

Running Bismark is split up into three individual steps:

- (I) First, the genome of interest needs to be bisulfite converted and indexed to allow Bowtie alignments. This step needs to be carried out only once for each genome. Note that Bowtie 1 and Bowtie 2 require distinct indexing steps since their indexes are not compatible.
- (II) Bismark read alignment step. Simply specify a file to be analysed, a reference genome and alignment parameters. Bismark will produce a combined alignment/methylation call output (default is SAM format) as well as a run statistics report.
- (III) Bismark methylation extractor. This step is optional and will extract the methylation information from the Bismark alignment output. Running this additional step allows splitting the methylation information up into the different contexts, getting strand-specific methylation information and offers some filtering options.

Each of these steps will be described in more detail (with examples) in the following sections.

# (I) Bismark Genome Preparation

This script needs to be run only once to prepare the genome of interest for bisulfite alignments. You need to specify a directory containing the genome you want to align your reads against (please be aware that the bismark\_genome\_preparation script currently expects FastA files in this folder (with either .fa or .fasta extension, single or multiple sequence entries per file). Bismark will create two individual folders within this directory, one for a C->T converted genome and the other one for the G->A converted genome. After creating C->T and G->A versions of the genome they will be indexed in parallel using the indexer bowtie-build (or bowtie2-build). Once both C->T and G->A genome indices have been created you do not need to use the genome preparation script again (unless you want to align against a different genome....).

Please note that Bowtie 1 and 2 indexes are not compatible. To create a genome index for use with Bowtie 2 the option --bowtie2 needs to be included as well.

Running bismark\_genome\_preparation

**USAGE:** bismark genome preparation [options] <path to genome folder>

A typical command could look like this:

bismark\_genome\_preparation --path\_to\_bowtie /usr/local/bowtie/ --verbose
/data/genomes/homo sapiens/GRCh37/

# (II) Bismark alignment step

This step represents the actual bisulfite alignment and methylation calling part. Bismark requires the user to specify only two things:

- The directory containing the genome of interest. This folder must contain the unmodified genome (as .fa or .fasta files) as well as the two bisulfite genome subdirectories which were generated in the Bismark Genome Preparations step (see above).
- The sequence file(s) to be analysed (in either FastQ or FastA format).

All other parameters are optional.

In the current version, it is required that the current working directory also contains the sequence files to be analysed. For each sequence file or each set of paired-end sequence files, Bismark produces one alignment and methylation call output file as well as a report file detailing alignment and methylation call statistics for your information and record keeping.

## Running bismark

Before running Bismark we recommend spending some time on quality control of the raw sequence files using FastQC (<a href="www.bioinformatics.babraham.ac.uk/projects/fastqc/">www.bioinformatics.babraham.ac.uk/projects/fastqc/</a>). FastQC might be able to spot irregularities associated with your BS-Seq file, such as high base calling error rates or contaminating sequences such as PCR primers or Illumina adapters. Many sources of error impact detrimentally the alignment efficiencies and/or alignment positions, and thus possibly also affect the methylation calls and conclusions drawn from the experiment.

If no additional options are specified Bismark will use a set of default values, some of which are:

## **Using Bowtie 1:**

- If no specific path to Bowtie is specified it is assumed that the bowtie executable is in the PATH
- Bowtie 1 is run --best mode (it is possible but not recommended to turn this off)
- Standard alignments allow up to 2 mismatches in the seed region (which is defined as the first 28 bp by default). These parameters can be modified using the options -n and -1, respectively.

# **Using Bowtie 2:**

- If no specific path to Bowtie 2 is specified it is assumed that the bowtie2 executable is in the PATH
- Standard alignments use a multi-seed length of 20bp with 0 mismatches. These parameters can be modified using the options -L and -N, respectively
- Standard alignments report the best of up to 10 valid alignments. This can be set using the  $-\mathbb{M}$  parameter
- Standard alignments use the default minimum alignment score function L,0,-0.6, i.e. f(x) = 0 + -0.6 \* x (where x is the read length). For a read of 75bp this would mean that a read can have a lowest

alignment score of -45 before an alignment would become invalid. This is roughly equal to 7 mismatches or ~4 indels of 3-4 bp in the read (or a combination thereof). The stringency can be set using the --score\_min <func> func> function.

Even though the user is not required to specify additional alignment options it is often advisable and highly recommended to do so. The default parameters are not very strict and as a consequence will also not run very swiftly. To see a full list of options please type bismark --help on the command line or see the Appendix at the end of this User Guide.

## Directional BS-Seq libraries (former option --directional)

Bisulfite treatment of DNA and subsequent PCR amplification can give rise to four (bisulfite converted) strands for a given locus. Depending on the adapters used, BS-Seq libraries can be constructed in two different ways:

- (a) If a library is directional, only reads which are (bisulfite converted) versions of the original top strand (OT) or the original bottom strand (OB) will be sequenced. Even though the strands complementary to OT (CTOT) and OB (CTOB) are generated in the BS-PCR step they will not be sequenced as they carry the wrong kind of adapter at their 5'-end. By default, Bismark performs only 2 read alignments to the OT and OB strands, thereby ignoring alignments coming from the complementary strands as they should theoretically not be present in the BS-Seq library in question.
- (b) Alternatively, BS-Seq libraries can be constructed so that all four different strands generated in the BS-PCR can and will end up in the sequencing library with roughly the same likelihood. In this case all four strands (OT, CTOT, OB, CTOB) can produce valid alignments and the library is called non-directional. Specifying `--non directional' instructs Bismark to use all four alignment outputs.

To summarise this again: alignments to the original top strand or to the strand complementary to the original top strand (OT and CTOT) will both yield methylation information for cytosines on the top strand. Alignments to the original bottom strand or to the strand complementary to the original bottom strand (OB and CTOB) will both yield methylation information for cytosines on the bottom strand, i.e. they will appear to yield methylation information for G positions on the top strand of the reference genome.

For more information about how to extract methylation information of the four different alignment strands please see below in the section on the Bismark methylation extractor.

A typical single-end analysis of a 40 bp sequencing run could look like this:

bismark -q --phred64-quals -n 1 -l 40 /data/genomes/homo\_sapiens/GRCh37/
s\_1\_sequence.txt

#### What does the Bismark output look like?

As of version 0.6.x, the default output of Bismark is in SAM format when using either Bowtie 1 or Bowtie 2. The former custom Bismark output for Bowtie 1, which used to be the standard output up to versions 0.5.x, is still available by specifying the option --vanilla (see below). The Bismark output using Bowtie 2 is invariably in SAM format (required to encode gapped alignments).

# **Bismark SAM output (default)**

By default, Bismark generates SAM output for all alignment modes. Please note that reported quality values are encoded in Sanger format (Phred 33 scale), even if the input was in Phred64 or the old Solexa format.

- (1) QNAME (seq-ID)
- (2) FLAG (this flag tries to take the strand a bisulfite read originated from into account (this is different from ordinary DNA alignment flags!))
  - (3) RNAME (chromosome)
  - (4) POS (start position)
  - (5) MAPQ (always 255)
  - (6) CIGAR
  - (7) RNEXT
  - (8) PNEXT
  - (9) TLEN
- (10) SEQ
- (11) QUAL (Phred33 scale)
- (12) NM-tag (edit distance to the reference)
- (13) XX-tag (base-by-base mismatches to the reference, not including indels)
- (14) XM-tag (methylation call string)
- (15) XR-tag (read conversion state for the alignment)
- (16) XG-tag (genome conversion state for the alignment)

The mate read of paired-end alignments is written out as an additional separate line in the same format.

# Custom ('vanilla') Bismark output (Bowtie 1 only)

Bismark can generate a comprehensive alignment and methylation call output file for each input file or set of paired-end input files. The sequence basecall qualities of the input FastQ files are written out into the Bismark output file as well to allow filtering on quality thresholds. Please note that the quality values are encoded in Sanger format (Phred 33 scale), even if the input was in Phred64 or the old Solexa format.

# The single-end output contains the following information (1 line per sequence, tab separated):

(1) seq-ID
(2) alignment strand
(3) chromosome
(4) start
(5) end
(6) original bisulfite read sequence
(7) equivalent genomic sequence (+2 extra bp)
(8) methylation call string
(9) read conversion
(10) genome conversion

(11) read quality score (Phred33 scale)

# Single-end alignment example:

## The paired-end output looks like this (1 line per sequence pair, tab separated):

```
(1) seq-ID
(2) alignment strand
(3) chromosome
(4) start
(5) end
(6) original bisulfite read sequence 1
(7) equivalent genomic sequence 1 (+2 extra bp)
(8) methylation call string 1
(9) original bisulfite read sequence 2
(10) equivalent genomic sequence 2 (+2 extra bp)
(11) methylation call string 2
(12) read 1 conversion
(13) genome conversion
(14) read 1 quality score (Phred33 scale)
(15) read 2 quality score (Phred33 scale)
```

# Paired-end alignment example:

```
(1) HWUSI-EAS611 100205:2:1:13:1732#0
(2) +
(3) 14
(4) 62880539
(5) 62880652
(6) CGGGATTTCGCGGAGTACGGGTGATCGTGTGGAATATAGA
(7) CGGGACTCCGCGGAGCACGGGTGACCGTGTGGAATACAGAGT
(8) Z....h.xZ.Z....h.Z....xZ....x.x...
     CAACTATCTAAAACTAAAAATAACGCCGCCCAAAAACTCT
(10) TCCGGCTGTCTGGAGCTGAAGATGGCGCCCCAGAAGCTCT
    .zx..x...xh.h..x..h..hh.Z..Z....x..h....
(11)
(12) CT
(13) CT
(14) IIIIIIIIIIIIIIIIIIIIIIIIIIIIIIII
(15) IIIIIIIIIIIIIIIIIIIIIIIIIIIIIIIIII
```

#### **Data visualisation**

To see the location of the mapped reads the Bismark output file can be imported into a genome viewer, such as SeqMonk, using the chromosome, start and end positions (this can be useful to identify regions in the genome which display an artefactually high number of aligned reads). The alignment output can also be used to apply post-processing steps such as de-duplication (allowing only 1 read for each position in the genome to remove PCR artefacts) or filtering on the number of bisulfite conversion related non-bisulfite mismatches \* (please note that such post-processing scripts are not part of the Bismark package).

\* Bisulfite conversion related non-bisulfite mismatches are mismatch positions which have a C in the BS-read but a T in the genome; such mismatches may occur due to the way bisulfite read alignments are performed. Reads containing this kind of mismatches are not automatically removed from the alignment output in order not to introduce a bias for methylated reads (please send me an email if you have further questions about this). It should be noted that, even though no methylation calls are performed for these positions, reads containing bisulfite conversion related non-bisulfite mismatches might lead to false alignments if particularly lax alignment parameters were specified.

# **Methylation call**

The methylation call string contains a dot '.' for every position in the BS-read not involving a cytosine, or contains one of the following letters for the three different cytosine methylation contexts (UPPER CASE = METHYLATED, lower case = unmethylated):

```
z unmethylated C in CpG context
Z methylated C in CpG context
x unmethylated C in CHG context
X methylated C in CHG context
h unmethylated C in CHH context
H methylated C in CHH context
```

# (III) Bismark methylation extractor

Bismark comes with a supplementary bismark\_methylation\_extractor script which operates on Bismark result files and extracts the methylation call for every single C analysed. The position of every single C will be written out to a new output file, depending on its context (CpG, CHG or CHH), whereby methylated Cs will be labelled as forward reads (+), non-methylated Cs as reverse reads (-). The resulting files can be imported into a genome viewer such as SeqMonk (using the generic text import filter) and the analysis of methylation data can commence. Alternatively, the output of the methylation extractor can be transformed into a bedGraph file using the options --bedGraph (see also --counts). This step can also be accomplished by the stand-alone script genome\_methylation\_bismark2bedGraph (initially contributed by Dr Oliver Tam; also available for download at <a href="https://www.bioinformatics.babraham.ac.uk/projects/bismark/">https://www.bioinformatics.babraham.ac.uk/projects/bismark/</a>). Optionally, the bedGraph counts output can be used to generate a genome-wide cytosine report which reports the number on every single CpG (optionally every single cytosine) in the genome, irrespective of whether it was covered by any reads or not. As this type of report is informative for cytosines on both strands the output may be fairly large (~46mn CpG positions or >1.2bn total cytosine positions in the human genome...).

As of Bismark version 0.6 or higher the default input format for the bismark\_methylation\_extractor is SAM. The former custom Bismark format can still be used by specifying --vanilla.

# The methylation extractor output looks like this (tab separated):

```
(1) seq-ID(2) methylation state(3) chromosome(4) start position (= end position)(5) methylation call
```

Methylated cytosines will receive a '+' orientation, unmethylated cytosines will receive a '-' orientation.

# Examples for cytosines in CpG context:

```
HWUSI-EAS611_0006:3:1:1058:15806#0/1 - 6 91793279 z
HWUSI-EAS611_0006:3:1:1058:17564#0/1 + 8 122855484 Z

Examples for cytosines in CHG context:
```

```
HWUSI-EAS611_0006:3:1:1054:1405#0/1 - 7 89920171 x
HWUSI-EAS611 0006:3:1:1054:1405#0/1 + 7 89920172 X
```

#### Examples for cytosines in CHH context:

```
HWUSI-EAS611_0006:3:1:1054:1405#0/1 - 7 89920184 h
```

The bismark\_methylation\_extractor comes with a few options, such as ignoring the first <int> number of positions in the methylation call string, e.g. to remove a restriction enzyme site (if

RRBS is performed with non-directional BS-Seq libraries it might be required to remove reconstituted MspI sites at the beginning of each read as they will introduce a bias into the first methylation call (please send me an email if you require further information on this)). Another useful option for paired-end reads is called '--no\_overlap': specifying this option will extract the methylation calls of overlapping parts in the middle of paired-end reads only once (using the calls from the first read which is presumably the one with a lowest error rate).

For a full list of options type bismark\_methylation\_extractor --help at the command line or refer to the Appendix section at the end of this User Guide.

## **Methylation extractor output**

By default, the bismark\_methylation\_extractor discriminates between cytosines in CpG, CHG or CHH context. If desired, CHG and CHH contexts can be merged into a single non-CpG context by specifying the option '--merge\_non\_CpG' (as a word of warning, this might produce files with up to several hundred million lines...).

# Strand-specific methylation output files (default):

As its default option, the bismark\_methylation\_extractor will produce a strand-specific output which will use the following abbreviations in the output file name to indicate the strand the alignment came from:

OT – original top strand
CTOT – complementary to original top strand

OB – original bottom strand
CTOB – complementary to original bottom strand

Methylation calls from OT and CTOT will be informative for cytosine methylation positions on the original top strand, calls from OB and CTOB will be informative for cytosine methylation positions on the original bottom strand. Please note that specifying the '--directional' option in the Bismark alignment step will not report any alignments to the CTOT or CTOB strands.

As cytosines can exist in any of three different sequence contexts (CpG, CHG or CHH) the bismark\_methylation\_extractor default output will consist of 12 individual output files per input file (CpG\_OT\_..., CpG\_CTOT\_..., CpG\_OB\_... etc.).

#### Context-dependent methylation output files (--comprehensive option):

If strand-specific methylation is not of interest, all available methylation information can be pooled into a single context-dependent file (information from any of the four strands will be pooled). This will default to three output files (CpG-context, CHG-context and CHH-context), or result in 2 output

files (CpG-context and Non-CpG-context) if `--merge\_non\_CpG' was selected (note that this can result in enormous file sizes for the non-CpG output).

Both strand-specific and context-dependent options can be combined with the '-- merge non CpG' option.

## Optional bedGraph output

The Bismark methylation extractor can optionally also output a file in bedGraph format. It will be sorted by chromosomal coordinates and looks like this:

<chromosome> <start position> <end position> <methylation percentage>

As the methylation percentage is *per se* not informative of the actual read coverage of detected methylated or unmethylated reads at a position, one can also use the option '--counts' to add two additional columns:

<chromosome> <start position> <end position> <methylation percentage> <count methylated> <count unmethylated>

These two additional columns enable basically any downstream processing from the file, but please note that they render the file to be technically no longer in bedGraph format as defined on the UCSC homepage (<a href="http://genome.ucsc.edu/goldenPath/help/bedgraph.html">http://genome.ucsc.edu/goldenPath/help/bedgraph.html</a>). By default, this mode will only consider cytosines in CpG context, but it can be extended to cytosines in any sequence context by using the option '--CX' (cf. Appendix (III)).

# Optional genome-wide cytosine report output

Starting from the bedGraph --count output, the Bismark methylation extractor can optionally also output a genome-wide cytosine methylation report. It is also sorted by chromosomal coordinates but also contains the sequence context and is in the following format:

<chromosome> <position> <strand> <count methylated> <count unmethylated> <C-context> <trinucleotide context>

The main difference to the <code>bedGraph</code> output is that **every** cytosine on both the top and bottom strands will be considered irrespective of whether they were actually covered by any reads in the experiment or not. For this to work one has to also specify the genome that was used for the Bismark alignments using the option '<code>--genome\_folder</code> <code><path></code>'. As for the <code>bedGraph</code> mode, this will only consider cytosines in CpG context by default but can be extended to cytosines in any sequence context by using the option '<code>--CX</code>' (cf. Appendix (III)). Be aware though that this might mean an output with individual lines for more than 1.1 billion cytosines for any large mammalian genome...

## (III) Running bismark methylation extractor

**USAGE:** bismark\_methylation\_extractor [options] <filenames>

A typical command for a single-end file could look like this:

```
bismark_methylation_extractor -s s_1_sequence.txt_bismark.sam
```

A typical command for a paired-end file could look like this:

```
bismark_methylation_extractor -p --no_overlap --report s_1_sequence_bismark_pe.sam
```

A typical command including the optional bedGraph --counts output could look like this:

```
bismark_methylation_extractor -s --bedGraph --counts --buffer_size 10G
s_1_sequence.txt_bismark.sam
```

A typical command including the optional genome-wide cytosine methylation report could look like this:

If you get stuck at any point or have any questions or comments please contact me via email: felix.krueger@babraham.ac.uk

# (4) APPENDIX - Full list of options

# **Appendix (I): Bismark Genome Preparation**

A full list of options can also be viewed by typing: bismark genome preparation --help

**USAGE:** bismark genome preparation [options] <arguments>

#### **OPTIONS:**

--help/--man Displays this help file.

--verbose Print verbose output for more details or debugging.

--yes/--yes\_to\_all Answer yes to safety related questions (such as "Are you sure you

want to overwrite any existing files in the Bisulfite\_Genomes folder?").

 $-- \texttt{path\_to\_bowtie} \ </ \dots / \dots /> \ \textbf{The full path to your Bowtie 1/ Bowtie 2 installation}. \ \textbf{If the path is not}$ 

provided as an option you will be prompted for it later.

--bowtie2 This will create bisulfite indexes for Bowtie 2. (Default: Bowtie 1).

single-entry FastA files instead of making one multi-FastA file (MFA) per chromosome. This might be useful if individual bisulfite converted chromosomes are needed (e.g. for debugging), however it can cause a problem with indexing if the number of chromosomes is vast (this is likely

to be in the range of several thousand files; operating systems can only handle lists up to a certain length. Some newly assembled

genomes may contain 20000-50000 contig of scaffold files which do exceed

this list length limit).

#### **ARGUMENTS:**

<path\_to\_genome\_folder> The path to the folder containing the genome to be bisulfite converted

(this may be an absolute or relative path). Bismark Genome Preparation expects one or more FastA files in the folder (valid file extensions: .fa or .fasta). If the path is not provided as an argument you will be prompted

for it later.

# Appendix (II): Bismark

A brief description of Bismark and a full list of options can also be viewed by typing: bismark --help

#### **ARGUMENTS:**

<genome\_folder> The full path to the folder containing the unmodified reference genome

as well as the subfolders created by the bismark genome preparation

script(/Bisulfite\_Genome/CT\_conversion/ and

Bisulfite\_Genome/GA\_conversion/). Bismark expects one or more FastA files in this folder (file extension: .fa or .fasta). The path to the genome folder

can be relative or absolute.

-1 <mates1> Comma-separated list of files containing the #1 mates (filename usually

includes "\_1"), e.g.  $flyA_1.fq$ ,  $flyB_1.fq$ ). Sequences specified with this option must correspond file-for-file and read-for-read with those specified in <mates2>. Reads may be a mix of different lengths. Bismark will produce

one mapping result and one report file per paired-end input file pair.

-2 <mates2> Comma-separated list of files containing the #2 mates (filename usually

includes "\_2"), e.g.  $flyA_1.fq$ ,  $flyB_1.fq$ ). Sequences specified with this option must correspond file-for-file and read-for-read with those specified in

<mates1>. Reads may be a mix of different lengths.

<singles> A comma or space separated list of files containing the reads to be aligned (e.g.

lane1.fq, lane2.fq, lane3.fq). Reads may be a mix of different lengths.

Bismark will produce one mapping result and one report file per input file.

### **OPTIONS:**

#### Input:

-q/--fastq The query input files (specified as <matel>, <matel> or <singles> are FastQ

files (usually having extension .fg or .fastg). This is the default. See also

--solexa-quals and --integer-quals.

-f/--fasta The query input files (specified as <matel>, <matel> or <singles> are FastA

files (usually having extension .fa, .mfa, .fna or similar). All quality values are assumed to be 40 on the Phred scale. FASTA files are expected to contain both the read name and the sequence on a single line (and not spread over several lines)

-s/--skip <int> Skip (i.e. do not align) the first <int> reads or read pairs from the input.

-u/--qupto <int> Only aligns the first <int> reads or read pairs from the input. Default: no limit.

--phred33-quals FastQ qualities are ASCII chars equal to the Phred quality plus 33. Default: on.

--phred64-quals FastQ qualities are ASCII chars equal to the Phred quality plus 64. Default: off.

--solexa-quals Convert FastQ qualities from solexa-scaled (which can be negative) to

phred-scaled (which can't). The formula for conversion is:

phred-qual =  $10 * \log(1 + 10 ** (solexa-qual/10.0)) / \log(10)$ . Used with -q. This is usually the right option for use with (unconverted) reads emitted by

the GA Pipeline versions prior to 1.3. Default: off.

--solexal.3-quals Same as --phred64-quals. This is usually the right option for use with (unconverted) reads emitted by GA Pipeline version 1.3 or later. Default: off.

--path\_to\_bowtie The full path </../> to the Bowtie (1 or 2) installation on your system. If not specified it will be assumed that Bowtie is in the path.

#### Alignment:

-n/--seedmms <int>The maximum number of mismatches permitted in the "seed", i.e. the first base pairs of the read (where L is set with -l/--seedlen). This may be 0, 1, 2 or 3 and the default is 2. This option is only available for Bowtie 1 (for Bowtie 2 see - N).

 $-1/--seedlen \qquad \qquad \text{The "seed length"; i.e., the number of bases of the high quality end of the} \\ read to which the -n ceiling applies. The default is 28. Bowtie (and thus Bismark) is faster for larger values of -1. This option is only available for Bowtie 1$ 

(for Bowtie 2 see -L).

-e/--magerr <int> Maximum permitted total of quality values at all mismatched read positions throughout the entire alignment, not just in the "seed". The default is 70.

Like Maq, Bowtie rounds quality values to the nearest 10 and saturates at 30.

--chunkmbs <int>
The number of megabytes of memory a given thread is given to store path descriptors in --best mode. Best-first search must keep track of many paths at once to ensure it is always extending the path with the lowest cumulative cost. Bowtie tries to minimize the memory impact of the descriptors, but they can still grow very large in some cases. If you receive an error message saying that chunk memory has been exhausted in --best mode, try adjusting this parameter up to dedicate more memory to the descriptors. Default: 512.

-I/--minins <int> The minimum insert size for valid paired-end alignments. E.g. if -I 60 is specified and a paired-end alignment consists of two 20-bp alignments in the appropriate orientation with a 20-bp gap between them, that alignment is considered valid (as long as -X is also satisfied). A 19-bp gap would not be valid in that case. Default: 0.

-X/--maxins <int> The maximum insert size for valid paired-end alignments. E.g. if -X 100 is

specified and a paired-end alignment consists of two 20-bp alignments in the proper orientation with a 60-bp gap between them, that alignment is considered valid (as long as -I is also satisfied). A 61-bp gap would not be valid in that case. Default: 500.

#### **Bowtie 1 Reporting:**

-k < 2>

Due to the way Bismark works Bowtie 1 will report up to 2 valid alignments. This option is used by default and cannot be changed.

--best

Make Bowtie guarantee that reported singleton alignments are "best" in terms of stratum (i.e. number of mismatches, or mismatches in the seed in the case if -n mode) and in terms of the quality; e.g. a 1-mismatch alignment where the mismatch position has Phred quality 40 is preferred over a 2-mismatch alignment where the mismatched positions both have Phred quality 10. When --best is not specified, Bowtie may report alignments that are sub-optimal in terms of stratum and/or quality (though an effort is made to report the best alignment). --best mode also removes all strand bias. Note that --best does not affect which alignments are considered "valid" by Bowtie, only which valid alignments are reported by Bowtie. Bowtie is about 1-2.5 times slower when --best is specified. Default: on.

--no best

Disables the --best option which is on by default. This can speed up the alignment process, e.g. for testing purposes, but for credible results it is not recommended to disable --best.

# **Output:**

--non directional The sequencing library was constructed in a non strand-specific manner, alignments to all four bisulfite strands will be reported. Default: OFF.

> (The current Illumina protocol for BS-Seq is directional, in which case the strands complementary to the original strands are merely theoretical and should not exist in reality. Specifying directional alignments (which is the default) will only run 2 alignment threads to the original top (OT) or bottom (OB) strands in parallel and report these alignments. This is the recommended option for sprand-specific libraries).

--sam-no-hd

Suppress SAM header lines (starting with @). This might be useful when very large input files are split up into several smaller files to run concurrently and the output files are to be merged afterwards.

--quiet

Print nothing besides alignments.

--vanilla

Performs bisulfite mapping with Bowtie 1 and prints the 'old' custom Bismark output (up to versions 0.5.X) instead of SAM format output.

--un

Write all reads that could not be aligned to the file unmapped reads.txt in the output directory. Written reads will appear as they did in the input, without any translation of quality values that may have taken place within Bowtie or Bismark. Paired-end reads will be written to two parallel files with \_1 and \_2 inserted in their filenames, i.e. unmapped\_reads\_1.txt and unmapped\_reads\_2.txt. Reads with more than one valid alignment with the same number of lowest mismatches (ambiguous mapping) are also written to unmapped reads.txt unless --ambiguous is also specified.

--ambiguous

Write all reads which produce more than one valid alignment with the same number of lowest mismatches or other reads that fail to align uniquely to \_ambiguous\_reads.txt. Written reads will appear as they did in the input, without any of the translation of quality values that may have taken place within Bowtie or Bismark. Paired-end reads will be written to two parallel files with \_1 and \_2 inserted in their filenames, i.e. \_ambiguous\_reads\_1.txt and \_ambiguous\_reads\_2.txt.fq. These reads are not written to the file specified with --un.

-o/--output\_dir <dir> Write all output files into this directory. By default the output files will be written into the same folder as the input file. If the specified folder does not exist, Bismark will attempt to create it first. The path to the output folder can be either relative or absolute.

--temp\_dir <dir>

Write temporary files to this directory instead of into the same directory as the input files. If the specified folder does not exist, Bismark will attempt to create it first. The path to the temporary folder can be either relative or absolute.

--non bs mm

Optionally outputs an extra column specifying the number of non-bisulfite mismatches a read during the alignment step. This option is only available for SAM format. In Bowtie 2 context, this value is just the number of actual non-bisulfite mismatches and ignores potential insertions or deletions. The format for single-end reads and read 1 of paired-end reads is 'XA:Z:number of mismatches' and 'XB:Z:number of mismatches' for read 2 of paired-end reads.

## Other:

-h/--help Displays this help file.

-v/--version Displays version information.

#### **BOWTIE 2 SPECIFIC OPTIONS**

--bowtie2

Uses Bowtie 2 instead of Bowtie 1. Bismark limits Bowtie 2 to only perform end-to-end alignments, i.e. searches for alignments involving all read characters (also called untrimmed or unclipped alignments). Bismark assumes that raw sequence data is adapter and/or quality trimmed where appropriate. Default: off.

## **Bowtie 2 alignment options:**

-N < int >

Sets the number of mismatches to be allowed in a seed alignment during multiseed alignment. Can be set to 0 or 1. Setting this higher makes alignment slower (often much slower) but increases sensitivity. Default: 0. This option is only available for Bowtie 2 (forBowtie 1 see -n).

-L <int>

Sets the length of the seed substrings to align during multiseed alignment. Smaller values make alignment slower but more senstive. Default: the --sensitive preset of Bowtie 2 is used by default, which sets -L to 20. This option is only available for Bowtie 2 (for Bowtie 1 see -1).

--ignore-quals

When calculating a mismatch penalty, always consider the quality value at the mismatched position to be the highest possible, regardless of the actual value. I.e. input is treated as though all quality values are high. This is also the default behaviour when the input doesn't specify quality values (e.g. in -f mode). For bisulfite alignments in Bismark, this option is invariable and on by default.

#### Bowtie 2 paired-end options:

--no-mixed

This option disables Bowtie 2's behaviour to try to find alignments for the individual mates if it cannot find a concordant or discordant alignment for a pair. This option is invariable and on by default.

--no-discordant

Normally, Bowtie 2 looks for discordant alignments if it cannot find any concordant alignments. A discordant alignment is an alignment where both mates align uniquely, but that does not satisfy the paired-end constraints (--fr/--rf/--ff, -I, -X). This option disables that behaviour and is on by default.

#### **Bowtie 2 Effort options:**

-D <int>

Up to <int> consecutive seed extension attempts can "fail" before Bowtie 2 moves on, using the alignments found so far. A seed extension "fails" if it does not yield a new best or a new second-best alignment. Default: 15.

-R < int>

<int> is the maximum number of times Bowtie 2 will "re-seed" reads with repetitive seeds. When "re-seeding," Bowtie 2 simply chooses a new set of reads (same length, same number of mismatches allowed) at different offsets and searches for more alignments. A read is considered to have repetitive seeds if the total number of seed hits divided by the number of seeds that aligned at least once is greater than 300. Default: 2.

#### **Bowtie 2 parallelization options:**

-p NTHREADS

Launch NTHREADS parallel search threads (default: 1). Threads will run on separate processors/cores and synchronize when parsing reads and outputting alignments. Searching for alignments is highly parallel, and speedup is close to linear. **NOTE:** It is currently unclear whether this speed increase also translates into a speed increase of Bismark since it is running several instances of Bowtie 2 concurrently! Increasing -p increases Bowtie 2's memory footprint. E.g. when aligning to a human genome index, increasing -p from 1 to 8 increases the memory footprint by a few hundred

megabytes (for each instance of Bowtie 2!). This option is only available if Bowtie is linked with the pthreads library (i.e. if BOWTIE\_PTHREADS=0 is not specified at build time). In addition, this option will automatically use the option '--reorder', which guarantees that output SAM records are printed in an order corresponding to the order of the reads in the original input file, even when -p is set greater than 1 (Bismark requires the Bowtie 2 output to be this way). Specifying --reorder and setting -p greater than 1 causes Bowtie 2 to run somewhat slower and use somewhat more memory then if --reorder were not specified. Has no effect if -p is set to 1, since output order will naturally correspond to input order in that case.

## **Bowtie 2 Scoring options:**

--score min <func>

Sets a function governing the minimum alignment score needed for an alignment to be considered "valid" (i.e. good enough to report). This is a function of read length. For instance, specifying L,0,-0.2 sets the minimum-score function f to f(x) = 0 + -0.2 \* x, where x is the read length. See also: setting function options at http://bowtie-bio.sourceforge.net/bowtie2. The default is L,0,-0.2.

## **Bowtie 2 Reporting options:**

--most\_valid\_alignments <int> This used to be the Bowtie 2 parameter -M. As of Bowtie 2 version 2.0.0-beta7 the option -M is deprecated. It will be removed in subsequent versions. What used to be called -M mode is still the default mode, but adjusting the -M setting is deprecated. Use the -D and -R options to adjust the effort expended to find valid alignments.

For reference, this used to be the old (now deprecated) description of -M: Bowtie 2 searches for at most <int>+1 distinct, valid alignments for each read. The search terminates when it can't find more distinct valid alignments, or when it finds <int>+1 distinct alignments, whichever happens first. Only the best alignment is reported. Information from the other alignments is used to estimate mapping quality and to set SAM optional fields, such as AS:i and XS:i. Increasing -M makes Bowtie 2 slower, but increases the likelihood that it will pick the correct alignment for a read that aligns many places. for reads that have more than <int>+1 distinct, valid alignments, Bowtie 2 does not guarantee that the alignment reported is the best possible in terms of alignment score. -M is always used and its default value is set to 10.

# **Appendix (III): Bismark Methylation Extractor**

A brief description of the Bismark methylation extractor and a full list of options can also be viewed by typing: bismark methylation extractor --help

**USAGE:** bismark\_methylation\_extractor [options] <filenames>

#### **ARGUMENTS:**

<filenames> A space-separated list of result files in Bismark format from which methylation

information is extracted for every cytosine in the read. The files may be <code>gzip</code>

compressed (ending in .gz).

#### **OPTIONS:**

-s/--single-end Input file(s) are Bismark result file(s) generated from single-end read data.

Specifying either --single-end or --paired-end is mandatory.

-p/--paired-end Input file(s) are Bismark result file(s) generated from paired-end read data.

Specifying either --paired-end or --single-end is mandatory.

--vanilla The Bismark result input file(s) are in the old custom Bismark format (up to version

0.5.x) and not in SAM format which is the default as of Bismark version 0.6.x or

higher. Default: OFF.

--no overlap For paired-end reads it is theoretically possible that read\_1 and read\_2 overlap.

This option avoids scoring overlapping methylation calls twice. Whilst this removes a bias towards more methylation calls towards the center of sequenced fragments it

can de facto remove a good proportion of the data.

--ignore <int> Ignore the first <int> bp when processing the methylation call string. As all reads

are sorted in a forward direction this can remove e.g. a restriction enzyme site at the start of each read (this can become relevant for non-directional libraries in RRBS

type experiments).

--comprehensive Specifying this option will merge all four possible strand-specific methylation info

into context-dependent output files. The default contexts are:

(i) CpG context

(ii) CHG context

(iii) CHH context

(Depending on the C content of the Bismark result file, the output file size might

reach 10-30GB!).

--merge\_non\_CpG This will produce two output files (in --comprehensive mode) or eight strandspecific output files (default) for Cs in

(i) CpG context

(ii) any non-CpG context

(Depending on the C content of the Bismark result file, the output

file size might reach 10-30GB!).

convenient batch processing.

-o/--output DIR Allows specification of a different output directory (absolute or relative path). If not

specified explicitely, the output will be written to the current directory.

--report Prints out a short methylation summary and the parameters used to run this script.

--version Displays the version information.

-h/--help Displays this help file and exits.

#### bedGraph specific options:

--bedGraph After finishing the methylation extraction, the methylation output is written into a

sorted bedGraph file that reports the position of a given cytosine and its methylation state (in %, seem details below). The methylation extractor output is temporarily split up into temporary files, one per chromosome (written into the current directory or folder specified with -o/--output); these temp files are then used for sorting and deleted afterwards. By default, only cytosines in CpG context will be sorted. The option --CX context may be used to report all

cyosines irrespective of sequence context (this will take MUCH longer!).

--cutoff [threshold] The minimum number of times a methylation state has to be seen for that

nucleotide before its methylation percentage is reported. Default: 1 (i.e. all covered

cytosines).

--remove\_spaces Replaces whitespaces in the sequence ID field with underscores to allow sorting.

--counts Adds two additional columns to the output file to enable further calculations:

col 5: number of methylated calls col 6: number of unmethylated calls

This option is required if --cytosine\_report is specified (and will be set

automatically if necessary).

--CX/--CX context The sorted bedGraph output file contains information on every single cytosine

that was covered in the experiment irrespective of its sequence context. This applies to both forward and reverse strands. Please be aware that this option may generate large temporary and output files and may take a long time to sort (up to many

hours). Default: OFF. (i.e. Default = CpG context only).

--buffer\_size <string> This allows you to specify the main memory sort buffer when sorting the methylation information. Either specify a percentage of physical memory by

appending % (e.g. --buffer\_size 50%) or a multiple of 1024 bytes, e.g. 'K' multiplies by 1024, 'M' by 1048576 and so on for 'T' etc. (e.g. --buffer\_size 20G). For more

information on sort, type 'info sort' on a command line. Defaults to 2G.

#### Genome-wide cytosine methylation report specific options:

the conversion bedGraph the --cytosine report After to has completed, option --cytosine report produces a genome-wide methylation report for all cytosines in the genome. By default, the output uses 1-based chromosome coordinates (zero-based cords are optional) and reports CpG context only (all cytosine context is optional). The output considers all Cs on both forward and reverse strands and reports their position, strand, trinucleotide content and methylation state (counts are 0 if not covered).

--CX/--CX context The output file contains information on every single cytosine in the genome irrespective of its context. This applies to both forward and reverse strands. Please be aware that this will generate output files with > 1.1 billion lines for a mammalian genome such as human or mouse. Default: OFF (i.e. Default = CpG context only).

--zero based

Uses zero-based coordinates like used in e.g. bed files instead of 1-based coordinates. Default: OFF.

- --genome folder <path> Enter the genome folder you wish to use to extract sequences from (full path only). Accepted formats are FastA files ending with '.fa' or '.fasta'. Specifying a genome folder path is mandatory.
- --split\_by\_chromosome Writes the output into individual files for each chromosome instead of a single output file. Files will be named to include the input filename and the chromosome number.

#### The bismark methylation extractor output is in the form (tab delimited):

<seq-ID> <methylation state\*> <chromosome> <start position (= end position)> <methylation call>

- \* Methylated cytosines receive a '+' orientation,
- \* Unmethylated cytosines receive a '-' orientation.

#### The bedGraph output (optional) looks like this (tab-delimited):

<chromosome> <start position> <end position> <methylation percentage>

The bedGraph output with '--counts' specified looks like this (tab-delimited):

<chromosome> <start position> <end position> <methylation percentage> <count methylated> <count unmethylated>

#### The genome-wide cytosine methylation output file (optional) is tab-delimited in the following format:

<chromosome> <position> <strand> <count methylated> <count unmethylated> <C-context> <trinucleotide context>

# Appendix (IV): Bismark reports for the test data set

#### Using Bowtie 1:

Running Bismark with the default options (e.g. bismark /data/public/Genomes/Human/GRCh37/test data.fastq) should result in this mapping report:

Bismark report for: test\_data.fastq (version: v0.7.8)

Option '--directional' specified: alignments to complementary strands will be ignored (i.e. not performed!)

Bowtie was run against the bisulfite genome of /data/public/Genomes/Human/GRCh37/ with the specified options: -q -n 1  $^{\circ}$ 

-k 2 --best --chunkmbs 512

#### Final Alignment report

\_\_\_\_\_

Sequences analysed in total: 10000

Number of alignments with a unique best hit from the different alignments: 6361

Mapping efficiency: 63.6%

Sequences with no alignments under any condition: 2626

Sequences did not map uniquely: 1013

Sequences which were discarded because genomic sequence could not be extracted: 0

Number of sequences with unique best (first) alignment came from the bowtie output:

CT/CT: 3187 ((converted) top strand)
CT/GA: 3174 ((converted) bottom strand)

GA/CT: 0 (complementary to (converted) top strand)
GA/GA: 0 (complementary to (converted) bottom strand)

Number of alignments to (merely theoretical) complementary strands being rejected in total: 0

# Final Cytosine Methylation Report

Total number of C's analysed: 52942

Total methylated C's in CpG context: 1740
Total methylated C's in CHG context: 36
Total methylated C's in CHH context: 171

Total C to T conversions in CpG context: 1027
Total C to T conversions in CHG context: 12889
Total C to T conversions in CHH context: 37079

C methylated in CpG context: 62.9% C methylated in CHG context: 0.3% C methylated in CHH context: 0.5%

#### Using Bowtie 2:

Running Bismark with the default options (e.g. bismark --bowtie2 --score-min L,0,-0.6 /data/public/Genomes/Human/GRCh37/ test\_data.fastq) should result in this mapping report:

Bismark report for: test data.fastq (version: v0.7.8)

Option '--directional' specified: alignments to complementary strands will be ignored (i.e. not performed!)

Bowtie was run against the bisulfite genome of /data/public/Genomes/Human/GRCh37/ with the specified options: -q --

score-min L,0,-0.6 -- ignore-quals

#### Final Alignment report

Sequences analysed in total: 10000

Number of alignments with a unique best hit from the different alignments: 5658

Mapping efficiency: 56.6%

Sequences with no alignments under any condition: 2893

Sequences did not map uniquely: 1449

Sequences which were discarded because genomic sequence could not be extracted: 0

Number of sequences with unique best (first) alignment came from the bowtie output:

CT/CT: 2820 ((converted) top strand)
CT/GA: 2838 ((converted) bottom strand)

GA/CT: 0 (complementary to (converted) top strand)
GA/GA: 0 (complementary to (converted) bottom strand)

Number of alignments to (merely theoretical) complementary strands being rejected in total: 0

#### Final Cytosine Methylation Report

Total number of C's analysed: 45985

Total methylated C's in CpG context: 1550

Total methylated C's in CHG context: 34

Total methylated C's in CHH context: 126

Total C to T conversions in CpG context: 844

Total C to T conversions in CHG context: 11368

Total C to T conversions in CHH context: 32063

C methylated in CpG context: 64.7% C methylated in CHG context: 0.3% C methylated in CHH context: 0.4%