

# Package ‘CODEX’

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**Type** Package

**Title** A Normalization and Copy Number Variation Detection Method for Whole Exome Sequencing

**Version** 1.18.0

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**Description** A normalization and copy number variation calling procedure for whole exome DNA sequencing data. CODEX relies on the availability of multiple samples processed using the same sequencing pipeline for normalization, and does not require matched controls. The normalization model in CODEX includes terms that specifically remove biases due to GC content, exon length and targeting and amplification efficiency, and latent systemic artifacts. CODEX also includes a Poisson likelihood-based recursive segmentation procedure that explicitly models the count-based exome sequencing data.

**License** GPL-2

**Depends** R (>= 3.2.3), Rsamtools, GenomeInfoDb, BSgenome.Hsapiens.UCSC.hg19, IRanges, Biostrings, S4Vectors

**Suggests** WES.1KG.WUGSC

**biocViews** ImmunoOncology, ExomeSeq, Normalization, QualityControl, CopyNumberVariation

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## Description

CODEX is a normalization and copy number variation calling procedure for whole exome DNA sequencing data. CODEX relies on the availability of multiple samples processed using the same sequencing pipeline for normalization, and does not require matched controls. The normalization model in CODEX includes terms that specifically remove biases due to GC content, exon length and targeting and amplification efficiency, and latent systemic artifacts. CODEX also includes a Poisson likelihood-based recursive segmentation procedure that explicitly models the count-based exome sequencing data.

## Details

Package:	CODEX
Type:	Package
Version:	0.99.0
Date:	2015-01-13
License:	GPL-2

CODEX takes as input the bam files/directories for whole exome sequencing datasets and bed files for exonic positions, returns raw and normalized coverage for each exon, and calls copy number variations with genotyping results.

## Author(s)

Yuchao Jiang <yuchaoj@wharton.upenn.edu>, Nancy R. Zhang

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bambedObjDemo	<i>Demo data pre-stored for bambedObj.</i>
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---

**Description**

Pre-stored bambedObj data for demonstration purposes.

**Usage**

```
data(bambedObjDemo)
```

**Details**

Pre-computed using whole exome sequencing data of 46 HapMap samples.

**Value**

bambedObj demo data (list) pre-computed.

**Author(s)**

Yuchao Jiang <yuchaoj@wharton.upenn.edu>

**Examples**

```
bamdir <- bambedObjDemo$bamdir
samprname <- bambedObjDemo$samprname
ref <- bambedObjDemo$ref
projectname <- bambedObjDemo$projectname
chr <- bambedObjDemo$chr
```

---

choiceofK	<i>Determine the number of latent factors K.</i>
-----------	--

---

**Description**

Determines the number of latent variables K via AIC, BIC, and deviance reduction. A pdf file containing all three plots is generated.

**Usage**

```
choiceofK(AIC, BIC, RSS, K, filename)
```

**Arguments**

AIC	vector of AIC for each K returned from <a href="#">normalize</a>
BIC	vector of BIC for each K returned from <a href="#">normalize</a>
RSS	vector of RSS for each K returned from <a href="#">normalize</a>
K	vector of K returned from <a href="#">normalize</a>
filename	Filename of the output plot of AIC and RSS

**Details**

AIC: Akaike information criterion, used for model selection; BIC: Bayesian information criterion, used for model selection; RSS: residue sum of squares, used to plot scree plot and determine the 'elbow'.

**Value**

pdf file with three plots: AIC, BIC, and percentage of variance explained versus the number of latent factors.

**Author(s)**

Yuchao Jiang <yuchaoj@wharton.upenn.edu>

**See Also**

[normalize](#), [segment](#)

**Examples**

```
AIC <- normObjDemo$AIC
BIC <- normObjDemo$BIC
RSS <- normObjDemo$RSS
K <- normObjDemo$K
projectname <- bambedObjDemo$projectname
chr <- bambedObjDemo$chr
choiceofK(AIC, BIC, RSS, K, filename = paste(projectname, "_", chr,
      "_choiceofK", ".pdf", sep = ""))
```

---

coverageObjDemo

*Demo data pre-stored for coverageObj.*

---

**Description**

Pre-stored coverageObj data for demonstration purposes.

**Usage**

```
data(coverageObjDemo)
```

**Details**

Pre-computed using whole exome sequencing data of 46 HapMap samples.

**Value**

coverageObj demo data (list) pre-computed.

**Author(s)**

Yuchao Jiang <yuchaoj@wharton.upenn.edu>

**Examples**

```
Y <- coverageObjDemo$Y
readlength <- coverageObjDemo$readlength
```

---

gcDemo	<i>Demo data pre-stored for GC content.</i>
--------	---

---

**Description**

Pre-stored GC content data for demonstration purposes.

**Usage**

```
data(gcDemo)
```

**Details**

Pre-computed using whole exome sequencing data of 46 HapMap samples.

**Value**

gc demo data (vector) pre-computed.

**Author(s)**

Yuchao Jiang <yuchaoj@wharton.upenn.edu>

**Examples**

```
head(round(gcDemo, 2))
```

---

getbambed	<i>Get bam file directories, sample names, and exonic positions</i>
-----------	---

---

**Description**

Gets bam file directories, sample names from .txt file, and exonic positions from .bed file.

**Usage**

```
getbambed(bamdir, bedFile, sampname, projectname, chr)
```

**Arguments**

bamdir	Column vector. Each line specifies directory of a bam file. Should be in same order as sample names in sampname.
bedFile	Path to bed file specifying exonic targets. Is of type character.
sampname	Column vector. Each line specifies name of a sample corresponding to the bam file. Should be in same order as bam directories in bamdir.
projectname	String specifying the name of the project. Data will be saved using this as prefix.
chr	Chromosome.

**Value**

bamdir	Bam directories
sampname	Sample names
ref	IRanges object specifying exonic positions
projectname	String specifying the name of the project.
chr	Chromosome

**Author(s)**

Yuchao Jiang <yuchaoj@wharton.upenn.edu>

**References**

Lawrence M, Huber W, Pages H, Aboyoun P, Carlson M, Gentleman R, Morgan M and Carey V (2013). "Software for Computing and Annotating Genomic Ranges." PLoS Computational Biology, 9.

**See Also**

[getcoverage](#)

**Examples**

```
library(WES.1KG.WUGSC)
dirPath <- system.file("extdata", package = "WES.1KG.WUGSC")
bamFile <- list.files(dirPath, pattern = '*.bam$')
bamdir <- file.path(dirPath, bamFile)
sampnameFile <- file.path(dirPath, "sampname")
sampname <- as.matrix(read.table(sampnameFile))
chr <- 22
bambedObj <- getbambed(bamdir = bamdir, bedFile = file.path(dirPath,
  "chr22_400_to_500.bed"), sampname = sampname,
  projectname = "CODEX_demo", chr)
bamdir <- bambedObj$bamdir
sampname <- bambedObj$sampname
ref <- bambedObj$ref
projectname <- bambedObj$projectname
chr <- bambedObj$chr
```

---

getcoverage

*Get depth of coverage from whole exome sequencing*

---

**Description**

Gets depth of coverage for each exon across all samples from whole exome sequencing files.

**Usage**

```
getcoverage(bambedObj, mapqthres)
```

**Arguments**

bambedObj      Object returned from [getbambed](#)  
 mapqthres      Mapping quality threshold hold of reads.

**Value**

Y                Read depth matrix  
 readlength      Vector of read length for each sample

**Author(s)**

Yuchao Jiang <yuchaoj@wharton.upenn.edu>

**See Also**

[getbambed](#)

**Examples**

```
library(WES.1KG.WUGSC)
dirPath <- system.file("extdata", package = "WES.1KG.WUGSC")
bamFile <- list.files(dirPath, pattern = '*.bam$')
bamdir <- file.path(dirPath, bamFile)
samnameFile <- file.path(dirPath, "samname")
samname <- as.matrix(read.table(samnameFile))
chr <- 22
bambedObj <- getbambed(bamdir = bamdir, bedFile = file.path(dirPath,
  "chr22_400_to_500.bed"), samname = samname,
  projectname = "CODEX_demo", chr)
bamdir <- bambedObj$bamdir
samname <- bambedObj$samname
ref <- bambedObj$ref
projectname <- bambedObj$projectname
chr <- bambedObj$chr
coverageObj <- getcoverage(bambedObj, mapqthres = 20)
Y <- coverageObj$Y
readlength <- coverageObj$readlength
```

---

getgc

*Get GC content for each exonic target*

---

**Description**

Computes GC content for each exon. Will be later used in QC procedure and normalization.

**Usage**

```
getgc(chr, ref)
```

**Arguments**

chr              Chromosome returned from [getbambed](#)  
 ref              IRanges object returned from [getbambed](#)

**Value**

Vector of GC content for each exon.

**Author(s)**

Yuchao Jiang <yuchaoj@wharton.upenn.edu>

**References**

Team TBD. BSgenome.Hsapiens.UCSC.hg19: Full genome sequences for Homo sapiens (UCSC version hg19). R package version 1.3.99.

**See Also**

[getbambed](#), [qc](#), [normalize](#)

**Examples**

```
ref <- IRanges(st = 51207851, end = 51207982)
gc <- getgc(chr = 22, ref)
```

---

getmapp

*Get mappability for each exonic target*

---

**Description**

Computes mappability for each exon. To save running time, take values from pre-computed results. Will be later used in QC procedure.

**Usage**

```
getmapp(chr, ref)
```

**Arguments**

chr	Chromosome returned from <a href="#">getbambed</a>
ref	IRanges object returned from <a href="#">getbambed</a>

**Details**

To calculate the exonic mappability, we first construct consecutive reads of length 90 that are one base pair apart along the exon. The sequences are taken from the hg19 reference. We then find possible positions across the genome that the reads can map to allowing for two mismatches. We compute the mean of the probabilities that the overlapped reads map to the target places where they are generated and use this as the mappability of the exon.

**Value**

Vector of mappability for each exon.

**Author(s)**

Yuchao Jiang <yuchaoj@wharton.upenn.edu>



**See Also**

[getbanded](#), [qc](#)

**Examples**

```
ref <- IRanges(st = 51207851, end = 51207982)
mapp <- getmapp(chr = 22, ref)
```

---

mappability

*Pre-computed mappabilities*

---

**Description**

The results of pre-computed mappabilities to save running time.

**Usage**

```
data(mappability)
```

**Details**

Pre-computed mappabilities. Method used is detailed in [getmapp](#).

**Value**

List of length 24 with pre-computed mappability of each chromosome.

**Author(s)**

Yuchao Jiang <yuchaoj@wharton.upenn.edu>

**See Also**

[getmapp](#)

**Examples**

```
# mappability of chromosome 1
head(round(mappability[[1]], 2))
```

---

`mappDemo`*Demo data pre-stored for mappability.*

---

**Description**

Pre-stored mappability data for demonstration purposes.

**Usage**

```
data(mappDemo)
```

**Details**

Pre-computed using whole exome sequencing data of 46 HapMap samples.

**Value**

mapp demo data (vector) pre-computed.

**Author(s)**

Yuchao Jiang <yuchaoj@wharton.upenn.edu>

**Examples**

```
head(round(mappDemo, 2))
```

---

`mapp_ref`*Position reference for pre-computed mappability results.*

---

**Description**

List consisting of IRanges objects specifying exonic positions whose mappabilities are pre-computed across the genome.

**Usage**

```
data(mapp_ref)
```

**Details**

Genomic positions for pre-computed mappabilities. Method used is detailed in [getmapp](#).

**Value**

List of length 24 with genomic positions of pre-computed mappability of each chromosome.

**Author(s)**

Yuchao Jiang <yuchaoj@wharton.upenn.edu>

**See Also**[getmapp](#)**Examples**

```
# mappability exon reference of chromosome 1
mapp_ref[[1]]
```

---

`normalize`*Normalization of read depth from whole exome sequencing*

---

**Description**

Fits a Poisson log-linear model that normalizes the read depth data from whole exome sequencing. Includes terms that specifically remove biases due to GC content, exon capture and amplification efficiency, and latent systemic artifacts.

**Usage**

```
normalize(Y_qc, gc_qc, K)
```

**Arguments**

<code>Y_qc</code>	Read depth matrix after quality control procedure returned from <a href="#">qc</a>
<code>gc_qc</code>	Vector of GC content for each exon after quality control procedure returned from <a href="#">qc</a>
<code>K</code>	Number of latent Poisson factors. Can be an integer if optimal solution has been chosen or a vector of integers so that AIC, BIC, and RSS are computed for choice of optimal k.

**Value**

<code>Yhat</code>	Normalized read depth matrix
<code>AIC</code>	AIC for model selection
<code>BIC</code>	BIC for model selection
<code>RSS</code>	RSS for model selection
<code>K</code>	Number of latent Poisson factors

**Author(s)**

Yuchao Jiang <yuchaoj@wharton.upenn.edu>

**See Also**[qc](#), [choiceofK](#)

**Examples**

```

Y_qc <- qcObjDemo$Y_qc
gc_qc <- qcObjDemo$gc_qc
normObj <- normalize(Y_qc, gc_qc, K = 1:5)
Yhat <- normObj$Yhat
AIC <- normObj$AIC
BIC <- normObj$BIC
RSS <- normObj$RSS
K <- normObj$K

```

normalize2

*Normalization of read depth from whole exome sequencing under the case-control setting*

**Description**

Fits a Poisson log-linear model that normalizes the read depth data from whole exome sequencing. Includes terms that specifically remove biases due to GC content, exon capture and amplification efficiency, and latent systemic artifacts. If the WES is designed under case-control setting, CODEX estimates the exon-wise Poisson latent factor using only the read depths in the control cohort, and then computes the sample-wise latent factor terms for the case samples by regression.

**Usage**

```
normalize2(Y_qc, gc_qc, K, normal_index)
```

**Arguments**

Y_qc	Read depth matrix after quality control procedure returned from <a href="#">qc</a>
gc_qc	Vector of GC content for each exon after quality control procedure returned from <a href="#">qc</a>
K	Number of latent Poisson factors. Can be an integer if optimal solution has been chosen or a vector of integers so that AIC, BIC, and RSS are computed for choice of optimal k.
normal_index	Indices of control samples.

**Value**

Yhat	Normalized read depth matrix
AIC	AIC for model selection
BIC	BIC for model selection
RSS	RSS for model selection
K	Number of latent Poisson factors

**Author(s)**

Yuchao Jiang <yuchaoj@wharton.upenn.edu>

**See Also**

[qc](#), [choiceofK](#)

**Examples**

```
Y_qc <- qcObjDemo$Y_qc
gc_qc <- qcObjDemo$gc_qc
normObj <- normalize2(Y_qc, gc_qc, K = 1:5, normal_index = seq(1, 45, 2))
Yhat <- normObj$Yhat
AIC <- normObj$AIC
BIC <- normObj$BIC
RSS <- normObj$RSS
K <- normObj$K
```

---

normObjDemo

*Demo data pre-stored for normObj.*

---

**Description**

Pre-stored normObj data for demonstration purposes.

**Usage**

```
data(normObjDemo)
```

**Details**

Pre-computed using whole exome sequencing data of 46 HapMap samples.

**Value**

normObj demo data (list) pre-computed.

**Author(s)**

Yuchao Jiang <yuchaoj@wharton.upenn.edu>

**Examples**

```
Yhat <- normObjDemo$Yhat
AIC <- normObjDemo$AIC
BIC <- normObjDemo$BIC
RSS <- normObjDemo$RSS
K <- normObjDemo$K
```

---

qc *Quality control procedure for depth of coverage*

---

### Description

Applies a quality control procedure to the depth of coverage matrix both sample-wise and exon-wise before normalization.

### Usage

```
qc(Y, sampname, chr, ref, mapp, gc, cov_thresh, length_thresh, mapp_thresh,
    gc_thresh)
```

### Arguments

Y	Original read depth matrix returned from <a href="#">getcoverage</a>
sampname	Vector of sample names returned from <a href="#">getbanded</a>
chr	Chromosome.
ref	IRanges object specifying exonic positions returned from <a href="#">getbanded</a>
mapp	Vector of mappability for each exon returned from <a href="#">getmapp</a>
gc	Vector of GC content for each exon returned from <a href="#">getgc</a>
cov_thresh	Vector specifying the upper and lower bound of exonic median coverage threshold for QC. 20-4000 recommended.
length_thresh	Vector specifying the upper and lower bound of exonic length threshold for QC. 20-2000 recommended.
mapp_thresh	Scalar variable specifying exonic mappability threshold for QC. 0.9 recommended.
gc_thresh	Vector specifying the upper and lower bound of exonic GC content threshold for QC. 20-80 recommended.

### Details

It is suggested that analysis by CODEX be carried out in a batch-wise fashion if multiple batches exist. CODEX further filters out exons that: have extremely low coverage—median read depth across all samples less than 20 or greater than 4000; are extremely short—less than 20 bp; are extremely hard to map—mappability less than 0.9; have extreme GC content—less than 20 or greater than 80. The above filtering thresholds are recommended and can be user-defined to be adapted to different sequencing protocols.

### Value

Y_qc	Updated Y after QC
sampname_qc	Updated sampname after QC
gc_qc	Updated gc after QC
mapp_qc	Updated mapp after QC
ref_qc	Updated ref after QC
qcmat	Matrix specifying results of exon-wise QC procedures

**Author(s)**

Yuchao Jiang <yuchaoj@wharton.upenn.edu>

**See Also**

[getbanded](#), [getgc](#), [getmapp](#)

**Examples**

```
Y <- coverageObjDemo$Y
sampname <- bambedObjDemo$sampname
chr <- bambedObjDemo$chr
ref <- bambedObjDemo$ref
gc <- gcDemo
mapp <- mappDemo
cov_thresh <- c(20, 4000)
length_thresh <- c(20, 2000)
mapp_thresh <- 0.9
gc_thresh <- c(20, 80)
qcObj <- qc(Y, sampname, chr, ref, mapp, gc, cov_thresh, length_thresh,
           mapp_thresh, gc_thresh)
Y_qc <- qcObj$Y_qc
sampname_qc <- qcObj$sampname_qc
gc_qc <- qcObj$gc_qc
mapp_qc <- qcObj$mapp_qc
ref_qc <- qcObj$ref_qc
qcmat <- qcObj$qcmat
```

---

qcObjDemo

*Demo data pre-stored for qcObj.*

---

**Description**

Pre-stored qcObj data for demonstration purposes.

**Usage**

```
data(qcObjDemo)
```

**Details**

Pre-computed using whole exome sequencing data of 46 HapMap samples.

**Value**

qcObj demo data (list) pre-computed.

**Author(s)**

Yuchao Jiang <yuchaoj@wharton.upenn.edu>

**Examples**

```

Y_qc <- qcObjDemo$Y_qc
samprname_qc <- qcObjDemo$samprname_qc
gc_qc <- qcObjDemo$gc_qc
mapp_qc <- qcObjDemo$mapp_qc
ref_qc <- qcObjDemo$ref_qc

```

segment

*Recursive segmentation algorithm for CNV detection and genotyping***Description**

Recursive segmentation algorithm for CNV detection and genotyping, using normalized read depth from whole exome sequencing.

**Usage**

```
segment(Y_qc, Yhat, optK, K, samprname_qc, ref_qc, chr, lmax, mode)
```

**Arguments**

Y_qc	Raw read depth matrix after quality control procedure returned from <a href="#">qc</a>
Yhat	Normalized read depth matrix returned from <a href="#">normalize</a>
optK	Optimal value K returned from <a href="#">choiceofK</a>
K	Number of latent Poisson factors. Can be an integer if optimal solution has been chosen or a vector of integers so that AIC, BIC, and RSS are computed for choice of optimal k.
samprname_qc	Vector of sample names after quality control procedure returned from <a href="#">qc</a>
ref_qc	IRanges object of genomic positions of each exon after quality control procedure returned from <a href="#">qc</a>
chr	Chromosome number returned from <a href="#">getbambed</a>
lmax	Maximum CNV length in number of exons returned.
mode	Can be either "integer" or "fraction", which respectively correspond to format of the returned copy numbers.

**Value**

Final callset of CNVs with genotyping results.

**Author(s)**

Yuchao Jiang <yuchaoj@wharton.upenn.edu>

**See Also**

[normalize](#), [choiceofK](#)



**Examples**

```
Y_qc <- qcObjDemo$Y_qc
Yhat <- normObjDemo$Yhat
BIC <- normObjDemo$BIC
K <- normObjDemo$K
samprname_qc <- qcObjDemo$samprname_qc
ref_qc <- qcObjDemo$ref_qc
chr <- bambedObjDemo$chr
finalcall <- segment(Y_qc, Yhat, optK = K[which.max(BIC)], K = K, samprname_qc,
  ref_qc, chr, lmax = 200, mode = "integer")
finalcall
```

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