

# Package ‘CTdata’

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**Title** Data companion to CTExploreR

**Version** 1.2.0

**Description** Data from publicly available databases (GTEx, CCLE, TCGA and ENCODE) that go with CTExploreR in order to re-define a comprehensive and thoroughly curated list of CT genes and their main characteristics.

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|  |
|--|
| CCLE_correlation_matrix                            |
| <i>Gene correlations in CCLE cancer cell lines</i> |

---

Description

Correlation coefficients between Cancer-Testis genes and all genes found on the CCLE database.

Format

A matrix object with 298 rows and 24327 columns.

- Rows correspond to CT genes
- Columns correspond to all genes from CCLE database

Details

Correlation coefficients (Pearson) between CT genes and all other genes are given in the matrix. These correlation coefficients were calculated using log transformed expression values from CCLE\_data (all cell lines).

Source

See scripts/make\_CCLE\_correlation\_matrix.R for details.

---

CCLE\_data*Genes expression data in CCLE*

---

## Description

Gene expression data in cancer cell lines from CCLE

## Format

A SummarizedExperiment object with 24327 rows and 1229 columns

- Rows correspond to genes (ensembl\_gene\_id)
- Columns correspond to CCLE cell lines
- Expression data from the assay are TPM values
- Cell lines metadata are stored in colData

## Details

The rowData contains

- A column percent\_of\_positive\_CCLE\_cell\_lines that gives the percentage of CCLE cell lines (all cell lines combined) expressing the gene at a highly level (TPM  $\geq 10$ ).
- A column percent\_of\_negative\_CCLE\_cell\_lines that gives the percent of CCLE cell lines (all cell lines combined) in which genes are completely repressed (TPM  $< 0.1$ )
- A column max\_TPM\_in\_CCLE that gives the maximal expression (in TPM) found in all cell lines.
- A column CCLE\_category gives the category ("activated", "not\_activated", "leaky") assigned to each gene. "activated" category corresponds to genes highly expressed (TPM  $\geq 10$ ) in at least one cell line and repressed (TPM  $\leq 0.1$ ) in at least 20% of cell lines. "not\_activated" category corresponds to genes repressed (TPM  $\leq 0.1$ ) in at least 20% of cell lines and never expressed (TPM  $\geq 10$ ) in any cell line. "leaky" category corresponds to genes repressed (TPM  $\leq 0.1$ ) in less than 20% of cell lines.

## Source

TPM values downloaded using depmap bioconductor package (see scripts/make\_CCLE\_data.R for details).

---

CTdata

All CTdata datasets

---

### Description

This is the companion Package for CTexploreR containing omics data to select and characterise CT genes.

Data come from public databases and include expression and methylation values of genes in normal and tumor samples as well as in tumor cell lines, and expression in cells treated with a demethylating agent is also available.

The `CTdata()` function returns a `data.frame` with all the annotated datasets provided in the package. For details on these individual datasets, refer to their respective manual pages.

See the vignette and the respective manuals pages for more details about the package and the data themselves.

### Usage

```
CTdata()
```

### Value

A `data.frame` describing the data available in CTdata.

### Author(s)

Laurent Gatto

### Examples

```
CTdata()
```

---

CT\_genes

CT genes description table

---

### Description

Cancer-Testis (CT) genes description

### Format

A tibble object with 298 rows and 36 columns.

- Rows correspond to CT genes
- Columns give CT genes characteristics

## Details

When the promoter is mentioned, it has been determined as 1000 nt upstream TSS and 200 nt downstream TSS.

CT\_genes characteristics column:

- Column family gives the gene family name.
- Columns chr, strand and transcription\_start\_site give the genegenomic location.
- Column X\_linked indicates if the gene is on the chromosome X (TRUE) or not (FALSE).
- Column TPM\_testis gives the gene expression level in testis (using GTEx database).
- Column max\_TPM\_somatic gives the maximum expression level found in a somatic tissue (using GTEx database).
- Column GTEx\_category gives the category ("testis\_specific", "testis\_preferential" or "lowly\_expressed") assigned to each gene using GTEx database (see ?GTEx\_data for details).
- Column lowly\_expressed\_in\_GTEx indicates if the gene is lowly expressed in GTEx database and thus needed to be analysed with multimapping allowed.
- Column multimapping\_analysis informs if the gene (flagged as "lowly\_expressed" in GTEx\_data) was found to be testis-specific when multi-mapped reads were counted for gene expression in normal tissues ("not\_analysed" or "testis\_specific") (see ?normal\_tissues\_multimapping\_data for details).
- Column testis\_specificity gives the testis-specificity of genes assigned to each gene using GTEx\_category and multimapping\_analysis ("testis\_specific" or "testis\_preferential").
- Column testis\_cell\_type specifies the testis cell-type showing the highest mean expression of each gene (based on testis scRNAseq data).
- Column Higher\_in\_somatic\_cell\_type specifies if a somatic cell type was found to express the gene at a higher level than any germ cell type (based on scRNAseq data of different tissues).
- Column percent\_of\_positive\_CCLE\_cell\_lines gives the percentage of CCLE cancer cell lines in which genes are expressed (genes were considered as expressed if TPM  $\geq 10$ ).
- Column percent\_of\_negative\_CCLE\_cell\_lines gives the percentage of CCLE cancer cell lines in which genes are repressed (TPM  $\leq 0.1$ ).
- Column max\_TPM\_in\_CCLE gives the highest expression level of genes in CCLE cell lines.
- Column CCLE\_category gives the category assigned to each gene using CCLE data. "Activated" category corresponds to genes expressed in at least one cell line (TPM  $\geq 10$ ) and repressed in at least 20% of cell lines.
- Column percent\_pos\_tum gives the percentage of TCGA cancer samples in which genes are expressed (genes were considered as expressed if TPM  $\geq 10$ ).
- Column percent\_neg\_tum gives the percentage of TCGA cancer samples in which genes are repressed (TPM  $\leq 0.1$ ).
- Column max\_TPM\_in\_TCGA gives the highest expression level of genes in TCGA cancer sample.
- Column TCGA\_category gives the category assigned to each gene using TCGA data. "activated" category corresponds to genes expressed in at least one tumor (TPM  $\geq 10$ ) and repressed in at least 20% of samples. "multimapping\_issue" corresponds to genes that need multi-mapping to be allowed in order to be analysed properly.

- Column DAC\_induced summarises the results (TRUE or FALSE) of a differential expression evaluating gene induction upon DAC treatment in a series of cell lines.
- Column somatic\_met\_level that gives the mean methylation level of each promoter in somatic tissues.
- Column sperm\_met\_level that gives the methylation level of each promoter in sperm.
- Column somatic\_methylation indicates if the promoter's mean methylation level in somatic tissues is higher than 50%.
- Column germline\_methylation indicates if the promoter is methylated in germline, based on the ratio with somatic tissues (FALSE if somatic\_met\_level is at least twice higher than germline\_met\_level).
- Column regulated\_by\_methylation indicates if the gene is regulated by methylation (TRUE) based on DAC induction (has to be TRUE) and on promoter methylation levels in normal tissues (when available, has to be methylated in somatic and unmethylated in germline).
- Column named CpG\_density, gives the density of CpG within each promoter (number of CpG / promoter length \* 100).
- Column CpG\_promoter classifies the promoters according to their CpG densities: "low" (CpG\_density < 2), "intermediate" (CpG\_density >= 2 & CpG\_density < 4), and "high" (CpG\_density >= 4).
- Columns external\_transcript\_name, ensembl\_transcript\_id, and transcript\_biotype give the references and informations about the most biologically relevant transcript associated to each gene.
- Columns oncogene and tumor\_suppressor informs if oncogenic and tumor-suppressor functions have been associated to genes (source: [Cancermine](#)).

### Source

See scripts/make\_CT\_genes.R for details on how this list of curated CT genes was created.

---

CT\_mean\_methylation\_in\_tissues

*CT genes' promoters mean methylation*

---

### Description

Mean methylation values of all CpGs located within Cancer-Testis (CT) promoters in a set of normal tissues

### Format

A SummarizedExperiment object with 298 rows and 14 columns

- Rows correspond to CT genes
- Mean methylation levels in normal tissues are stored in columns
- CpG densities and results of methylation analysis are stored in rowData

## Details

The rowData contains:

- A column named CpG\_density, gives the density of CpG within each promoter (number of CpG / promoter length \* 100).
- A column CpG\_promoter that classifies the promoters according to their CpG densities: "low" (CpG\_density < 2), "intermediate" (CpG\_density >= 2 & CpG\_density < 4), and "high" (CpG\_density >= 4).
- A column somatic\_met\_level that gives the mean methylation level of each promoter in somatic tissues.
- A column sperm\_met\_level that gives the methylation level of each promoter in sperm.
- A column somatic\_methylation indicates if the promoter's mean methylation level in somatic tissues is higher than 50%.
- A column germline\_methylation indicates if the promoter is methylated in germline, based on the ratio with somatic tissues (FALSE if somatic\_met\_level is at least twice higher than germline\_met\_level).

## Source

WGBS methylation data was downloaded from Encode and from GEO databases. Mean methylation levels are evaluated using methylation values of CpGs located in promoter region (defined as 1000 nt upstream TSS and 200 nt downstream TSS) (see scripts/make\_CT\_mean\_methylation\_in\_tissues.R for details).

---

CT\_methylation\_in\_tissues

*Methylation of CpGs within CT promoters*

---

## Description

Methylation values of CpGs located within Cancer-Testis (CT) promoters in a set of normal tissues.

## Format

A RangedSummarizedExperiment object with 51725 rows and 14 columns

- Rows correspond to CpGs (located within CT genes promoters)
- Columns correspond to normal tissues
- Methylation values from WGBS data
- rowRanges correspond to CpG positions

## Source

WGBS methylation data was downloaded from Encode and from GEO databases (see scripts/make\_CT\_methylation\_in\_tissues.R for details).

---

DAC\_treated\_cells      *DE genes with/without demethylating agent*

---

### Description

Gene expression values in a set of cell lines treated or not with 5-Aza-2'-Deoxycytidine (DAC), a demethylating agent.

### Format

A SummarizedExperiment object with 24359 rows and 32 columns

- Rows correspond to genes (ensembl\_gene\_id).
- Columns correspond to samples.
- Expression data correspond to counts that have been normalised (by DESeq2 method) and log-transformed (log1p).
- The colData contains the SRA references of the fastq files that were downloaded, and informations about the cell lines and the DAC treatment.
- The rowData contains the results of a differential expression evaluating the DAC treatment effect. For each cell line, the log2FC between treated and control cells is given, as well as the p-adjusted value. The column induced flags genes significantly induced (log2FoldChange  $\geq 2$  and padj  $\leq 0.05$ ) in at least one cell line.

### Details

Differential expression analysis was done using DESeq2\_1.36.0, using as design = ~ treatment (see scripts/make\_DAC\_treated\_cells.R for details).

### Source

RNAseq

fastq files were downloaded from Encode database. SRA reference of samples are stored in the colData.

---

DAC\_treated\_cells\_multimapping  
*DE genes treated or not with a demethylating agent*

---

### Description

Gene expression values in a set of cell lines treated or not with 5-Aza-2'-Deoxycytidine (DAC), a demethylating agent. Many CT genes belong to gene families from which members have identical or nearly identical sequences. Some CT can only be detected in RNAseq data in which multimapping reads are not discarded.



**Format**

A SummarizedExperiment object with 24359 rows and 32 columns

- Rows correspond to genes (ensembl\_gene\_id).
- Columns correspond to samples.
- Expression data correspond to counts that have been normalised (by DESeq2 method) and log-transformed (log1p).
- The colData contains the SRA references of the fastq files that were downloaded, and informations about the cell lines and the DAC treatment.
- The rowData contains the results of a differential expression evaluating the DAC treatment effect. For each each cell line, the log2FC between treated and control cells is given, as well as the p-adjusted value. The column induced flags genes significantly induced (log2FoldChange  $\geq 2$  and padj  $\leq 0.05$ ) in at least one cell line.

**Details**

Differential expression analysis was done using DESeq2\_1.36.0, using as design = ~ treatment (see scripts/make\_DAC\_treated\_cells\_multimapping.R for details).

**Source**

RNAseq fastq files were downloaded from Encode database. SRA reference of samples are stored in the colData.

---

GTEx\_data

*Genes expression in GTEx*

---

**Description**

Gene expression data in normal tissues from GTEx database.

**Format**

A SummarizedExperiment object with 24359 rows and 32 columns

- Rows correspond to genes (ensembl\_gene\_id as rownames)
- Columns correspond to tissues
- Expression data from the assay are TPM values

## Details

The rowData contains

- A column named GTEX\_category, specifying the tissue specificity category ("testis\_specific", "testis-preferential", "lowly\_expressed" or "other") assigned to each gene using expression values in testis and in somatic tissues, has been added to the rowData. "testis\_specific" genes are expressed exclusively in testis (expression in testis  $\geq 1$  TPM, highest expression in somatic tissues  $< 0.5$  TPM, and expressed at least 10x more in testis than in any somatic tissue). "testis-preferential" genes are genes expressed in testis but also in a few somatic tissues (expression in testis  $\geq 1$  TPM, quantile 75% of expression in somatic tissues  $< 0.5$  TPM, and expressed at least 10x more in testis than in any somatic tissue). "lowly\_expressed" genes are genes undetectable in GTEx database probably due to multi-mapping issues (expression in all GTEx tissues  $< 1$  TPM).
- A column named max\_TPM\_somatic giving the maximum expression level found in a somatic tissue.

## Source

Downloaded from [https://storage.googleapis.com/gtex\\_analysis\\_v8/rna\\_seq\\_data/GTEx\\_Analysis\\_2017-06-05\\_v8\\_RNASeQCv1.1.9\\_gene\\_median\\_tpm.gct.gz](https://storage.googleapis.com/gtex_analysis_v8/rna_seq_data/GTEx_Analysis_2017-06-05_v8_RNASeQCv1.1.9_gene_median_tpm.gct.gz). Some categories of tissues were pooled (mean expression values are given in pooled tissues) (see scripts/make\_GTEx\_data.R for details).

---

|          |   |
|----------|---|
| makeTags | <i>A short function that returns the default CTdata tags and, if provided, additional data-specific tags.</i> |
|----------|---|

---

## Description

A short function that returns the default CTdata tags and, if provided, additional data-specific tags.

## Usage

```
makeTags(x)
```

## Arguments

x                      An optional character() containing specific tags.

## Value

A character containing the default tags and optional data-specific tags. If x is missing or is of length 0, the default tags are returned. Otherwise, a vector of length equal to length(x) is returned.

### Examples

```
CTdata::makeTags() ## only default tags

CTdata::makeTags(character()) ## only default tags

CTdata::makeTags("myTag") ## one additional tag

CTdata::makeTags(c("myTag", "myOtherTag")) ## two additional tag
```

---

normal\_tissues\_multimapping\_data

*Gene expression values in normal tissues*

---

### Description

Gene expression values (TPM) in a set of normal tissues obtained by counting or not multi-mapped reads. Many CT genes belong to gene families from which members have identical or nearly identical sequences. Some CT can only be detected in RNAseq data in which multimapping reads are not discarded.

### Format

A SummarizedExperiment object with 24359 rows and 18 columns

- Rows correspond to genes (ensembl\_gene\_id)
- Columns correspond to normal tissues.
- First assay, TPM\_no\_multimapping, gives TPM expression values obtained when discarding multimapped reads.
- Second assay, TPM\_with\_multimapping, gives TPM expression values obtained by counting multimapped reads.

### Details

A column named multimapping\_analysis has been added to the rowData. It summarizes the testis specificity analysis of genes flagged as "lowly\_expressed" in GTEX\_data. Genes are considered "testis\_specific" when, with multimapping allowed, they are detectable in testis (TPM  $\geq 1$ ), their TPM value has increased compared to without multimapping (ratio  $> 5$ ), and their TPM value is at least 10 times higher in testis than in any other somatic tissue.

### Source

RNAseq fastq files were downloaded from Encode database (see scripts/make\_normal\_tissues\_multimapping.R for details).

scRNAseq\_HPA

*Gene expression in human cell types***Description**

Gene expression profiles in different human cell types based on scRNAseq data obtained from the Human Protein Atlas (<https://www.proteinatlas.org>)

**Format**

A SingleCellExperiment object with 20082 rows and 66 columns

- Rows correspond to genes (ensembl gene id as rownames)
- Columns correspond to cell types
- Expression values correspond to transcripts per million protein coding genes (pTPM)

**Details**

Description of the colData:

- Column Cell\_type gives cell type.
- Column group gives the cell type group (defined in the Human Protein Atlas).

Description of the rowData:

- Column max\_TPM\_in\_a\_somatic\_cell\_type gives the maximum expression value found in a somatic cell type
- Column max\_in\_germcells\_group gives the maximum expression value found in a germ cell type
- Column Higher\_in\_somatic\_cell\_type specifies if a somatic cell type

**Source**

Gene expression values in cell types, based on multiple scRNAseq datasets obtained from the Human Protein Atlas (<https://www.proteinatlas.org/about/download>) The data were converted in a SummarizedExperiment (see `scripts/14_make_scRNAseq_HPA.R` for details).

---

|                     |  |
|---------------------|--|
| TCGA_CT_methylation | <i>Methylation of CT promoters in TCGA samples</i> |
|---------------------|--|

---

**Description**

Methylation values of probes located within Cancer-Testis (CT) promoters in samples from TCGA (tumor and peritumoral samples)

**Format**

A RangedSummarizedExperiment object with 666 rows and 3423 columns

- Rows correspond to Infinium 450k probes
- Columns correspond to samples
- Methylation data from the assay are Beta values
- Clinical information are stored in colData
- Probe information (hg38 coordinates) are stored in rowRanges

**Source**

SKCM, LUAD, LUSC, COAD, ESCA, BRCA and HNSC methylation data were downloaded with TCGAbiolinks and subsetting to select probes located in CT genes promoter regions (see scripts/make\_TCGA\_CT\_methylation.R for details).

---

|          |  |
|----------|--|
| TCGA_TPM | <i>Gene expression in TCGA samples</i> |
|----------|--|

---

**Description**

Gene expression data in TCGA samples (tumor and peritumoral samples).

**Format**

A SummarizedExperiment object with 24350 rows and 4141 columns

- Rows correspond to genes (ensembl\_gene\_id)
- Columns correspond to samples
- Expression data from the assay are TPM values
- Clinical information are stored in colData
- Genes information are stored in rowData

## Details

- The colData contains clinical data from TCGA as well as global hypomethylation levels obtained from paper *DNA methylation loss promotes immune evasion of tumours with high mutation and copy number load* from Jang et al., Nature Commun 2019 that were added (see inst/scripts/make\_TCGA\_TPM.R for details).
- The rowData contains genes information and, for each gene, the percentage of tumors that are positive (TPM  $\geq 10$ ), and the percentage of tumors that are negative (TPM  $< 0.1$ ). In column TCGA\_category, genes are labelled as "activated" when the percentage of positive tumors is  $> 0$  and when at least 20% of tumors are negative. Genes are labelled as "not\_activated" when the percentage of positive tumors is 0. Genes are labelled as "leaky" when less than 20% of tumors are negative.

## Source

SKCM, LUAD, LUSC, COAD, ESCA, BRCA and HNSC expression data were downloaded with TCGAbiolinks (see scripts/make\_TCGA\_TPM.R for details).

---

|            |                             |
|------------|-----------------------------|
| testis_sce | <i>Testis scRNAseq data</i> |
|------------|-----------------------------|

---

## Description

Testis single cell RNAseq data from The adult human testis transcriptional cell atlas (Guo et al. 2018)

## Format

A SingleCellExperiment object with 19777 rows and 6490 columns

- Rows correspond to genes (gene names as rownames)
- Columns correspond to testis cells

## Details

Description of the colData:

- Column nGene gives the number of distinct genes detected per cell.
- Column nUMI gives the total UMI number per cell.
- Column clusters gives cluster number defined in the Guo's paper.
- Column type gives the testis cell type associated to the cluster number.
- Column Donor gives the Donor origin of the cells.

Description of the rowData:

- Column percent\_pos\_testis\_germcells gives the percent of testis germ cells in which the genes are detected (count  $> 0$ ) (based on testis scRNAseq data).

- Column `percent_pos_testis_somatic` gives the percent of testis somatic cells in which the genes are detected (count > 0) (based on testis scRNAseq data).
- Column `testis_cell_type` specifies the testis cell-type showing the highest mean expression of each gene (based on testis scRNAseq data).

The `rowData` contains the `testis_cell_type` column, specifying the testis cell-type showing the highest mean expression of each gene.

### Source

The count matrix `GSE112013_Combined_UMI_table.txt.gz` was downloaded from GEO (accession: GSE11201). Metadata correspond to TableS1 from the paper's supplemental data. The data were converted in a `SingleCellExperiment` (see `scripts/13_make_testis_sce.R` for details).

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