# Package 'tvdiff'

December 31, 2020

Type Package
Title Numerical differentiation of noisy, nonsmooth data
<b>Version</b> 0.0.9000
<b>Description</b> Numerical differentiation of noisy, nonsmooth data based on Total Variation Regularized Numerical Differentiation algorithm by Rick Chartrand.
License CC0
Encoding UTF-8
LazyData true
Suggests knitr, rmarkdown, testthat, covr
VignetteBuilder knitr
RoxygenNote 7.1.1
Imports Matrix, Rcpp
<b>Depends</b> R (>= $2.10$ )
LinkingTo Rcpp, RcppArmadillo
SystemRequirements C++11
R topics documented:
largedemodata
Index

2 pcgsolve

largedemodata	Large demo dataset
---------------	--------------------

# Description

"Data obtained from a whole-room calorimeter, courtesy of Edward L. Melanson of the University of Colorado Denver. The metabolic rate of a subject within the calorimeter can be determined via respirometry, the measurement of oxygen consumption, and carbon dioxide production within the room." "The data consists of samples taken every second for most of a day, for a total of 82,799 samples."

# Usage

largedemodata

#### **Format**

A data frame with 82,799 rows and 2 variables:

```
x seconds
```

obs observed measurement

#### **Source**

```
https://sites.google.com/site/dnartrahckcir/home/tvdiff-code
```

## References

Rick Chartrand, "Numerical differentiation of noisy, nonsmooth data," ISRN Applied Mathematics, Vol. 2011, Article ID 164564, 2011

pcgsolve

Preconditioned conjugate gradient method

## **Description**

Preconditioned conjugate gradient method for solving system of linear equations Ax = b, where A is symmetric and positive definite.

#### Usage

```
pcgsolve(b, M, alph, L, dx, tol = 1e-06, maxIter = 1000L)
```

# Arguments

b	vector, with same dimension as number of rows of A.
M	matrix, preconditioner matrix defined interal to TVRegDiffR.
alph	numeric, regularization parameter used in TVRegDiffR.
L	matrix, linearized diffusion matrix internal to TVRegDiffR.
dx	numeric, grid spacing used in TVRegDiffR.
tol	numeric, threshold for convergence, default is 1e-6.
maxIter	numeric, maximum iteration, default is 1000.

smalldemodata 3

#### **Details**

Code is a slightly modified version of pcgsolve

#### Value

A vector representing solution x.

smalldemodata

Small demo dataset

## **Description**

A test dataset based on the function f(x) = |x - 0.5| with Gaussian noise with a standard deviation of 0.05.

#### Usage

smalldemodata

#### **Format**

A data frame with 100 rows and 3 variables:

```
x seq(0,1,length.out = 100)
true abs(x -0.5)
obs abs(x -0.5) + rnorm(length(x), mean = 0, sd = 0.05)
```

#### **Source**

https://sites.google.com/site/dnartrahckcir/home/tvdiff-code

#### References

Rick Chartrand, "Numerical differentiation of noisy, nonsmooth data," ISRN Applied Mathematics, Vol. 2011, Article ID 164564, 2011

toyproblem

Toy problem

## **Description**

A test dataset based on the piecewise function  $f(x) = (x+2)^2$  when x < 0 and  $f(x) = (x-2)^2$  when x > 0 with Gaussian noise with a standard deviation of 0.5.

## Usage

toyproblem

4 TVRegDiffR

#### **Format**

```
A data frame with 100 rows and 4 variables:
```

```
x seq(-4,4,length.out = 100)
y_true true value
y_obs observation with noise
dydx_true true derivative
```

TVRegDiffR

Total Variation Regularized Numerical Differentiation (TVDiff)

# Description

Estimate the derivative of noisy data using total variation regularized differentiation.

## Usage

```
TVRegDiffR(
  data,
  iter,
  alph,
  u0 = NULL,
  scale = "small",
  ep = 1e-06,
  dx = 1/length(data),
  plotflag = 0,
  tol = 1e-06,
  maxit = 1000
)
```

#### **Arguments**

data	Vector of data to be differentiated.
iter	Number of iterations to run the m

Number of iterations to run the main loop. A stopping condition based on the norm of the gradient vector g below would be an easy modification. No default

value.

alph Regularization parameter. This is the main parameter to fiddle with. Start by varying by orders of magnitude until reasonable results are obtained. A value

to the nearest power of 10 is usally adequate. No default value. Higher values increase regularization strength and improve conditioning

increase regularization strenght and improve conditioning.

u0 Initialization of the iteration. Default value is the naive derivative (without scal-

ing), of appropriate length (this being different for the two methods). Although the solution is theoretically independent of the intialization, a poor choice can

exacerbate conditioning issues when the linear system is solved.

scale 'large' or 'small' (case insensitive). Default is 'small'. 'small' has somewhat

better boundary behavior, but becomes unwieldly for data larger than 1000 entries or so. 'large' has simpler numerics but is more efficient for large-scale problems. 'large' is more readily modified for higher-order derivatives, since

the implicit differentiation matrix is square.

TVRegDiffR 5

ер	Parameter for avoiding division by zero. Default value is 1e-6. Results should not be very sensitive to the value. Larger values improve conditioning and therefore speed, while smaller values give more accurate results with sharper jumps.
dx	Grid spacing, used in the definition of the derivative operators. Default is the reciprocal of the data size.
plotflag	Flag whether to display plot at each iteration. Default is 0 (no). Useful, but adds significant running time.
tol	R Version Only: Tolerance passed to preconditiond conjugate gradient solver
maxit	R Version Only: Maximum iterations passed to preconditiond conjugate gradient solver

#### **Details**

C++ code for preconditioned conjugate gradient method adapted from cPCG::pcgsolve

#### Value

Estimate of the regularized derivative of data. Due to different grid assumptions, length(u) = length(data) + 1 if scale = 'small', otherwise length(u) = length(data).

#### Author(s)

```
R translation: Nathaniel Price (<natbprice@gmail.com>)
Original Matlab Code: Rick Chartrand (<rickc@lanl.gov>)
```

#### References

Rick Chartrand, "Numerical differentiation of noisy, nonsmooth data," ISRN Applied Mathematics, Vol. 2011, Article ID 164564, 2011.

## **Examples**

```
# Load small demo data
data("smalldemodata")
# Unpack data
x <- smalldemodata$x
obs <- smalldemodata$obs
true <- smalldemodata$true</pre>
dydx_true <- rep(-1, length(x))</pre>
dydx_true[x > 0.5] <- 1
dx <- x[2] - x[1]
# Extimate derivative
dydx <- TVRegDiffR(</pre>
  data = obs,
  iter = 100,
  alph = 0.2,
  scale = "small",
  ep = 1e-6,
  dx = dx
dydx \leftarrow dydx[-1]
```

# **Index**

```
* datasets
largedemodata, 2
smalldemodata, 3
toyproblem, 3
largedemodata, 2
pcgsolve, 2, 3
smalldemodata, 3
toyproblem, 3
TVRegDiffR, 2, 4
```