# Package 'LOPART'

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Title Labeled Optimal Partitioning
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<b>Description</b> Change-point detection algorithm with label constraints and a penalty for each change outside of labels. Read TD Hocking, A Srivastava (2023) <doi:10.1007 s00180-022-01238-z=""> for details.</doi:10.1007>
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Labeled Optimal PARTitioning

#### **Description**

Compute an optimal segmentation (change in Gaussian mean model, square loss), which is consistent with the given labels, and with a penalty for each changepoint outside of labeled regions.

#### Usage

```
LOPART(
    x,
    labels,
    penalty_unlabeled,
    n_updates = length(x),
    penalty_labeled = penalty_unlabeled
)
```

#### **Arguments**

x numeric vector of data to fit a Gaussian mean model.

labels data frame with at least three columns: start, end, changes. start/end should be

indices of x, from 1 to length(x). changes should be either 0 or 1. The prediced

changepoints are guaranteed to be consistent with these labels.

penalty\_unlabeled

non-negative penalty constant (larger for fewer changes, smaller for more changes). penalty=0 means a change in every unlabeled region, penalty=Inf means no

changes in unlabeled regions.

n\_updates how many dynamic programming updates to compute? Must be at least 1 and at

most length(x).

penalty\_labeled

non-negative penalty constant to use for changes in positive labels.

#### **Details**

Provides a high-level interface to LOPART\_interface R function and LOPART C code.

## Value

list with named elements, all of which are data tables. loss has one row with loss/cost values. cost is the output from LOPART\_interface. changes has one row for each predicted changepoint (e.g. change=1.5 means a change between data points 1 and 2). segments has one row for each segment.

#### Author(s)

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#### **Examples**

```
set.seed(2)
library(data.table)
signal <- c(
  rnorm(25, mean = 10),
  rnorm(25, mean = 7),
  rnorm(25, mean = 8),
  rnorm(25, mean = 5))
#outliers
signal[86] <- 10
labels.dt <- data.table(</pre>
  start = c(20, 45, 80),
  end = c(30, 55, 90),
  changes = c(1, 1, 0)
signal.dt <- data.table(</pre>
  signal,
  position=seq_along(signal))
label.colors <- c(</pre>
  "1"="#ff7d7d",
  "0"="#f6c48f")
sig.color <- "grey50"
if(require(ggplot2)){
  gg.data <- ggplot()+</pre>
    geom_rect(aes(
      xmin=start, xmax=end,
      fill=paste(changes),
      ymin=-Inf, ymax=Inf),
      alpha=0.5,
      data=labels.dt)+
    geom_point(aes(
      position, signal),
      color=sig.color,
      data=signal.dt)+
    scale_x_continuous(
      "position",
      breaks=seq(0, 100, by=10))+
    scale_fill_manual("label", values=label.colors)+
    theme_bw()+
    theme(panel.spacing=grid::unit(0, "lines"))
  print(gg.data)
}
label.list <- list(</pre>
  OPART=labels.dt[0],
  LOPART=labels.dt)
seg.dt.list <- list()</pre>
change.dt.list <- list()</pre>
cost.dt.list <- list()</pre>
for(model.name in names(label.list)){
  label.dt <- data.table(label.list[[model.name]])</pre>
  fit <- LOPART::LOPART(signal, label.dt, 10)</pre>
  Algorithm <- factor(model.name, names(label.list))</pre>
```

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```
tau.dt <- fit$cost[, .(</pre>
    cost_candidates,
    tau=0:(.N-1),
    change=seq_along(cost_candidates)-0.5
 cost.dt.list[[model.name]] <- data.table(Algorithm, tau.dt)</pre>
 seg.dt.list[[model.name]] <- data.table(Algorithm, fit$segments)</pre>
 change.dt.list[[model.name]] <- data.table(Algorithm, fit$changes)</pre>
}
seg.dt <- do.call(rbind, seg.dt.list)</pre>
change.dt <- do.call(rbind, change.dt.list)</pre>
cost.dt <- do.call(rbind, cost.dt.list)</pre>
algo.sizes <- c(
 OPART=1,
 LOPART=0.5)
algo.colors <- c(
 OPART="deepskyblue",
 LOPART="black")
algo.shapes <- c(
 OPART=1,
 LOPART=2)
if(require(ggplot2)){
 gg.data+
    scale_size_manual(values=algo.sizes)+
    scale_color_manual(values=algo.colors)+
    geom_vline(aes(
      xintercept=change,
      size=Algorithm,
      color=Algorithm),
      data=change.dt)+
    geom_segment(aes(
      start-0.5, mean,
      size=Algorithm,
      color=Algorithm,
      xend=end+0.5, yend=mean),
      data=seg.dt)
}
if(require(ggplot2)){
 ggplot()+
   geom_rect(aes(
      xmin=start, xmax=end,
      fill=paste(changes),
      ymin=-Inf, ymax=Inf),
      alpha=0.5,
      data=labels.dt)+
    scale_fill_manual("label", values=label.colors)+
    theme_bw()+
    theme(panel.spacing=grid::unit(0, "lines"))+
    scale_x_continuous(
      "position",
      breaks=seq(0, 100, by=10))+
```

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```
geom_point(aes(
      change, cost_candidates,
      color=Algorithm, shape=Algorithm),
      data=cost.dt)+
    scale_color_manual(values=algo.colors)+
    scale_shape_manual(values=algo.shapes)
}
abbrev.vec <- c(
  data="data and models",
  cost="cost of last change")
yfac <- function(1){</pre>
  factor(abbrev.vec[[1]], abbrev.vec)
COST <- function(dt){</pre>
  data.table(y.var=yfac("cost"), dt)
DATA <- function(dt){</pre>
  data.table(y.var=yfac("data"), dt)
if(require(ggplot2)){
  ggplot()+
   geom_rect(aes(
      xmin=start, xmax=end,
      fill=paste(changes),
      ymin=-Inf, ymax=Inf),
      alpha=0.5,
      data=labels.dt)+
    scale_fill_manual("label", values=label.colors)+
    theme_bw()+
    theme(panel.spacing=grid::unit(0, "lines"))+
    facet_grid(y.var ~ ., scales="free")+
    geom_vline(aes(
      xintercept=change,
      size=Algorithm,
      color=Algorithm),
      data=change.dt)+
    geom_segment(aes(
      start-0.5, mean,
      size=Algorithm,
      color=Algorithm,
      xend=end+0.5, yend=mean),
      data=DATA(seg.dt))+
    geom_point(aes(
      position, signal),
      color=sig.color,
      shape=1,
      data=DATA(signal.dt))+
    scale_size_manual(values=algo.sizes)+
    scale_color_manual(values=algo.colors)+
    scale_shape_manual(values=algo.shapes)+
    ylab("")+
    scale_x_continuous(
```

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```
"position",
   breaks=seq(0, 100, by=10))+
geom_point(aes(
   change, cost_candidates,
   color=Algorithm, shape=Algorithm),
   data=COST(cost.dt))
}
```

LOPART\_interface

Labeled Optimal Partitioning interface

#### **Description**

Low-level interface to LOPART C code

#### Usage

```
LOPART_interface(
  input_data,
  input_label_start,
  input_label_end,
  input_label_changes,
  n_updates,
  penalty_unlabeled,
  penalty_labeled = 0
)
```

#### Arguments

```
input_data
                  numeric vector of N data to segment
input_label_start
                  integer vector of label start positions in 0, ..., N-2
input_label_end
                  integer vector of label end positions in 1, ..., N-1
input_label_changes
                  integer vector of 0/1, number of labeled changes
                  number of dynamic programming updates to perform, usually should be number
n_updates
                  of input_data N, but can be less if you want to analyze/plot the cost/candidates
                  at previous data.
penalty_unlabeled
                  non-negative numeric scalar (bigger for fewer changes in unlabeled regions,
                  smaller for more changes)
penalty_labeled
                  non-negative numeric scalar (penalty for each change in a positive label).
```

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#### **Details**

Avoid using this function and instead use the LOPART function.

#### Value

data frame with four columns: cost\_candidates is the cost of each last segment start considered (from 1 to N) for the computation of the optimal cost up to the last data point (Inf means infeasible); cost\_optimal is the optimal cost vector computed using dynamic programming; mean is the last segment mean of the optimal model ending at that data point; last\_change is the optimal changepoints (negative numbers are not used).

## Author(s)

Toby Dylan Hocking

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