

Package ‘potts’

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Title Markov Chain Monte Carlo for Potts Models

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Imports stats, graphics

Suggests pooh (>= 0.2)

Description Do Markov chain Monte Carlo (MCMC) simulation of Potts models (Potts, 1952, <doi:10.1017/S0305004100027419>), which are the multi-color generalization of Ising models (so, as a special case, also simulates Ising models). Use the Swendsen-Wang algorithm (Swendsen and Wang, 1987, <doi:10.1103/PhysRevLett.58.86>) so MCMC is fast. Do maximum composite likelihood estimation of parameters (Besag, 1975, <doi:10.2307/2987782>, Lindsay, 1988, <doi:10.1090/conm/080>).

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URL <http://www.stat.umn.edu/geyer/mcmc/>

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Cache T

*Cache calculated Canonical Statistics for Potts Models.***Description**

Variety of functions to support caching of calculated canonical statistics for Potts Models. There is some attempt at being 'smart' with when to regenerate the statistics.

Usage

```
generate_t_cache(x, ncolor, t_stat, sizeA, npixel, f,
                fapply=lapply, gridcache=NULL)

gengridcache(ncolor, sizeCA, ncol)

gensingleton(ncolor)

singleton(x, ncolor, a, idx, gridcache=NULL)

gentwopixel(ncolor)

twopixel(x, ncolor, a, idx, gridcache=NULL)

twopixel.nonoverlap(x, ncolor, a, idx, gridcache=NULL)

genfourpixel(ncolor)

fourpixel(x, ncolor, a, idx, gridcache=NULL)

fourpixel.nonoverlap(x, ncolor, a, idx, gridcache=NULL)

genthreebythree(ncolor)

ninepixel.nonoverlap(x, ncolor, a, idx, gridcache=NULL)

genfourbyfour(ncolor)

sixteenpixel.nonoverlap(x, ncolor, a, idx, gridcache=NULL)
```

Arguments

t_stat	numerical vector of length ncolor. Contains the canonical statistic for the whole image.
sizeA	numerical. The number of elements in \mathcal{A} .
sizeCA	numerical. The number of elements in $C^{\mathcal{A}}$.

<code>npixel</code>	numerical. The number of pixels in one element of \mathcal{A} .
<code>f</code>	function. Takes arguments <code>x</code> , <code>ncolor</code> , <code>a</code> , <code>idx</code> and <code>ncolor</code> . Returns value of <code>t_calc_innergrid</code> with window A_a replaced by the idx^{th} element of C^A .
<code>fapply</code>	function. It should behave exactly as <code>lapply</code> does. You can use this argument to enable parallel computing.
<code>gridcache</code>	list. Optional. If non-null, it is a list of the elements of C^A .
<code>x</code>	numeric, 2 dimensional matrix, elements in $1, \dots, \text{ncolor}$, representing a Potts model.
<code>ncolor</code>	numeric. Number of colors in this Potts Model.
<code>ncol</code>	numeric. Gives the number of columns in a rectangular window.
<code>a</code>	numeric. Indicates which member of \mathcal{A} is being referenced.
<code>idx</code>	numeric. Indicates which element of C^A is being referenced.

Details

For a description of notation and terminology, see [composite.ll](#).

This set of functions is used to generate cached calculations of the canonical statistic of a Potts model suitable for passing into `composite.ll` or `gr.composite.ll`.

All of the calculations using [composite.ll](#) and these caching functions need one of the color components to be dropped for the model to be identifiable. For simplicity, the first color is dropped by `generate_t_cache`. In computing the composite log likelihood for a Potts model with `ncolor` colors, we are interested in many calculations across C^A , the set of all permutations of colors across a window. These functions facilitate those calculations. `gridcache` is a list of C^A .

`generate_t_cache` is the main function, and the others are intended to be used in conjunction with it. `generate_t_cache` creates a list of arrays. Each array represents one window in the image, and each row of the array contains the value of $t(x)$ (with one component dropped) found by replacing the pixels in that window with one of the elements of C^A .

`gengridcache` can generate the `gridcache` for any rectangular window, give the number of colors, size of C^A , and number of columns in the window. `gensingleton`, `gentwopixel`, `genfourpixel`, `genthreebythree` and `genfourbyfour` are all just simple wrappers for `gengridcache`.

`singleton`, `twopixel`, `twopixel.nonoverlap`, `fourpixel`, `fourpixel.nonoverlap`, `ninepixel.nonoverlap` and `sixteenpixel.nonoverlap` are intended to be passed to `generate_t_cache` in the argument `f`. They are used to calculate $t(ca_{idx} \cup X \setminus A_a)$ for the idx^{th} element of C^{A_a} .

Functions that have `overlap` and `nonoverlap` versions generate a overlapping and nonoverlapping set of windows respectively.

`singleton` is for a single pixel window (Besag or MPLE).

`twopixel` does a two horizontal pixel window.

`fourpixel` does a two by two pixel window.

`ninepixel` does a three by three pixel window.

`sixteenpixel` does a four by four pixel window.

Value

Functions that start with gen return a list of the elements of C^A .

The other functions (e.g. twopixel, fourpixel, ...) return the result of replacing the a-th window of x with the idx-th element of C^A and calculating calc_t_innergrid for that window.

See Also

[composite.ll](#), [calc_t](#).

Examples

```
ncolor <- 4
beta  <- log(1+sqrt(ncolor))
theta <- c(rep(0,ncolor), beta)

nrow <- 32
ncol <- 32

x <- matrix(sample(ncolor, nrow*ncol, replace=TRUE), nrow=nrow, ncol=ncol)
foo <- packPotts(x, ncolor)
out <- potts(foo, theta, nbatch=10)
x <- unpackPotts(out$final)

t_stat <- calc_t(x, ncolor)
t_cache_mple <- generate_t_cache(x, ncolor, t_stat, nrow*ncol, 1,
                                singleton)

## Not run:
# use multicore to speed things up.
library(multicore)
t_cache_mple <- generate_t_cache(x, ncolor, t_stat, nrow*ncol, 1,
                                singleton, fapply=mclapply)

## End(Not run)
```

calc_t

Calculate Canonical Statistic for Potts Model

Description

Calculate the canonical statistic 't' for a realization of a Potts Model

Usage

```
calc_t_full(x,ncolor)
calc_t_innergrid(x, ncolor, grid, i, j)
calc_t(x, ncolor, grid=NULL, i=NULL, j=NULL)
```

Arguments

x	2 dimensional matrix, elements in $1, \dots, \text{ncolor}$, representing a Potts model
ncolor	numeric. Number of colors in this Potts Model.
grid	numeric. 2 dimensional matrix, elements in $1, \dots, \text{ncolor}$. If non-NULL it is placed into x at the location $x[i, j]$.
i	numeric. Row to place the grid.
j	numeric. Column to place the grid.

Details

For a description of notation and terminology, see [composite.ll](#).

Calculates the canonical statistics for a realized Potts Model. `calc_t` calls `calc_t_full` if `grid` is NULL and `calc_t_innergrid` otherwise.

`calc_t_full` calculates the canonical statistics for the full image.

`calc_t_innergrid` calculates the canonical statistics for the a window of the image, but with that window replaced by `grid`, with the upper left corner of `grid` located at $x[i, j]$.

Value

For a description of notation and terminology, see [composite.ll](#).

All functions return a vector of length $\text{ncolor}+1$. Elements $1, \dots, \text{ncolor}$ contain the number of pixels of each color. Element $\text{ncolor}+1$ contains the number of matching neighbor pairs for the image.

`calc_t_full` returns the values for the whole image.

`calc_t_innergrid` returns the value for just the selected window, but this includes the number of matching pairs from the replaced window to it's neighbors. E.g. if X is the full image, and A_a is the value of some window in the image and we want to know the value of $t(y \cup X \setminus A_a)$ this would be $\text{calc_t_full}(X, \text{ncolor}) + \text{calc_t_innergrid}(X, \text{ncolor}, y, i, j) - \text{calc_t_innergrid}(X, \text{ncolor}, A(a), i, j)$

See Also

[generate_t_cache](#), [composite.ll](#).

Examples

```
ncolor <- 4
beta <- log(1+sqrt(ncolor))
theta <- c(rep(0,ncolor), beta)

nrow <- 32
ncol <- 32

x <- matrix(sample(ncolor, nrow*ncol, replace=TRUE), nrow=nrow, ncol=ncol)
foo <- packPotts(x, ncolor)
out <- potts(foo, theta, nbatch=10)
x <- unpackPotts(out$final)
```

```
t_stat <- calc_t(x, ncolor)
t_stat_inner <- calc_t(x, ncolor, matrix(1, nrow=2, ncol=2), 1, 1)
```

 composite.ll

Composite Log Likelihood for Potts Models

Description

Calculate Composite Log Likelihood (CLL) and the gradient of the CLL for Potts models.

Usage

```
composite.ll(theta, t_stat, t_cache=NULL, fapply=lapply)
gr.composite.ll(theta, t_stat, t_cache=NULL, fapply=lapply)
```

Arguments

theta	numeric canonical parameter vector. The CLL will be evaluated at this point. It is assumed that the component corresponding to the first color has been dropped.
t_stat	numeric, canonical statistic vector. The value of the canonical statistic for the full image.
t_cache	list of arrays. $t_cache[[i]][j,]$ = the value of t with window A_i replaced by the j^{th} element of C^A .
fapply	function. Expected to function as <code>lapply</code> does. Useful for enabling parallel processing. E.g. use the <code>mclapply</code> function from the multicore package.

Details

For the given value of `theta` `composite.ll` and `gr.composite.ll` calculate the CLL and the gradient of the CLL respectively for a realized Potts model represented by `t_stat` and `t_cache`.

\mathcal{A} is the set of all *windows* to be used in calculating the Composite Log Likelihood (CLL) for a Potts model. A *window* is a collection of adjacent pixels on the lattice of the Potts model. A is used to represent a generic window in \mathcal{A} , the code in this package expects that all the windows in \mathcal{A} have the same size and shape. $|A|$ is used to denote the size, or number of pixels in a window. Each pixel in a Potts takes on a value in C , the set of possible colors. For simplicity, this implementation takes $C = \{1, \dots, ncolor\}$. Elements of C will be referenced using c_j with $j \in \{1, \dots, ncolor\}$. C^A is used to denote all the permutations of C across the window A , and $|C|^{|A|}$ is used to denote the size of C^A . In an abuse of notation, we use A_a to refer to the a^{th} element of \mathcal{A} . No ordinal or numerical properties of \mathcal{A} , C or C^A are used, only that each element in the sets are referenced by one and only one indexing value.

Value

`composite.ll` returns CLL evaluated at `theta`.

`gr.composite.ll` returns a numeric vector of length `length(theta)` containing the gradient of the CLL at `theta`.

See Also

[generate_t_cache](#), [calc_t](#).

Examples

```

ncolor <- 4
beta  <- log(1+sqrt(ncolor))
theta <- c(rep(0,ncolor), beta)

nrow <- 32
ncol <- 32

x <- matrix(sample(ncolor, nrow*ncol, replace=TRUE), nrow=nrow, ncol=ncol)
foo <- packPotts(x, ncolor)
out <- potts(foo, theta, nbatch=10)
x <- unpackPotts(out$final)

t_stat <- calc_t(x, ncolor)
t_cache_mple <- generate_t_cache(x, ncolor, t_stat, nrow*ncol, 1,
                               singleton)
t_cache_two <- generate_t_cache(x, ncolor, t_stat, nrow*ncol/2, 2,
                               twopixel.nonoverlap)

composite.ll(theta[-1], t_stat, t_cache_mple)
gr.composite.ll(theta[-1], t_stat, t_cache_mple)

## Not run:
optim.mple <- optim(theta.initial, composite.ll, gr=gr.composite.ll,
                  t_stat, t_cache_mple, method="BFGS",
                  control=list(fnscale=-1))
optim.mple$par

optim.two <- optim(theta.initial, composite.ll, gr=gr.composite.ll,
                  t_stat, t_cache_two, method="BFGS",
                  control=list(fnscale=-1))
optim.two$par

## End(Not run)

## Not run:
# or use mclapply to speed things up.
library(multicore)
optim.two <- optim(theta.initial, composite.ll, gr=gr.composite.ll,
                  t_stat, t_cache_two, mclapply, method="BFGS",
                  control=list(fnscale=-1))
optim.two$par

## End(Not run)

```

image.raw	<i>Plot Potts Model Data</i>
-----------	------------------------------

Description

plot Potts model data.

Usage

```
## S3 method for class 'raw'
image(x, col = c("white", "red", "blue", "green",
                "black", "cyan", "yellow", "magenta"), ...)
```

Arguments

x	an R vector of class "raw" that encodes a realization of a Potts model, typically the output of packPotts or of potts .
col	a vector of colors. Must be as many as number of colors of Potts model.
...	other arguments passed to <code>image.default</code> .

Bugs

Too slow for large images. Needs to be rewritten for efficient plotting.

See Also

[potts](#)

packPotts	<i>Transform Potts Model Data</i>
-----------	-----------------------------------

Description

transform Potts model data from integer matrix to raw vector and vice versa.

Usage

```
packPotts(x, ncolor)
inspectPotts(raw)
unpackPotts(raw)
```

Arguments

x	integer matrix containing Potts model data. Colors are coded from one to ncolor.
ncolor	integer scalar, number of colors.
raw	vector of type "raw".

Value

for `packPotts` a vector of type "raw". for `inspectPotts` a list containing components `ncolor`, `nrow`, and `ncol`. for `unpackPotts` an integer matrix.

Examples

```
x <- matrix(sample(4, 2 * 3, replace = TRUE), nrow = 2)
x
foo <- packPotts(x, ncolor = 4)
foo
inspectPotts(foo)
unpackPotts(foo)
```

potts

*Potts Models***Description**

Simulate Potts model using Swendsen-Wang algorithm.

Usage

```
potts(obj, param, nbatch, blen = 1, nspac = 1,
      boundary = c("torus", "free", "condition"), debug = FALSE,
      outfun = NULL, ...)
```

Arguments

<code>obj</code>	an R vector of class "raw" that encodes a realization of a Potts model, typically the output of <code>packPotts</code> . Alternatively, an object of class "potts" from a previous invocation of this function can be supplied, in which case any missing arguments are taken from this object.
<code>param</code>	numeric, canonical parameter vector. Last component must nonnegative (see Details below).
<code>nbatch</code>	the number of batches.
<code>blen</code>	the length of batches.
<code>nspac</code>	the spacing of iterations that contribute to batches.
<code>boundary</code>	type of boundary conditions. The value of this argument can be abbreviated.
<code>debug</code>	return additional debugging information.
<code>outfun</code>	controls the output. If a function, then the batch means of <code>outfun(tt, ...)</code> are returned. The argument <code>tt</code> is the canonical statistic of the Potts model having the same length as the argument <code>param</code> of this function. If <code>NULL</code> , the batch means of the canonical statistic are returned.
<code>...</code>	additional arguments for <code>outfun</code> .

Details

Runs a Swendsen-Wang algorithm producing a Markov chain with equilibrium distribution having the specified Potts model. The state of a Potts model is a collection of random variables taking values in a finite set. Here the finite set is $1, \dots, \text{ncolor}$ and the elements are called “colors”. The random variables are associated with the nodes of a rectangular lattice, represented by `unpackPotts` as a matrix. In keeping with calling the values “colors”, the random variables themselves are often called “pixels”. The probability model is an exponential family with canonical statistic vector of length $\text{ncolor} + 1$. The first ncolor components are the counts of the number of pixels of each color. The last component is the number of pairs of neighboring pixels colored the same. The corresponding canonical parameter, last component of the canonical parameter vector (argument `param`) must be nonnegative for the Swendsen-Wang algorithm to work (Potts models are defined for negative dependence parameter, but can’t be simulated using this algorithm).

In the default boundary specification (“torus”), also called toroidal or periodic boundary conditions, the vertical edges of the pixel matrix are considered glued together, as are the horizontal edges. Thus corresponding pixels in the first and last rows are considered neighbors, as are corresponding pixels in the first and last columns. In the other boundary specifications there is no such gluing: pixels in the the relative interiors of the first and last rows and first and last columns have only three neighbors, and the four corner pixels have only two neighbors.

In the “torus” and “free” boundary specifications, all pixels are counted in determining the color count canonical statistics, which thus range from zero to $\text{nrow} * \text{ncol}$, where nrow and ncol are the number of rows and columns of the pixel matrix. In the “condition” boundary specification, all pixels in the first and last rows and first and last columns are fixed (conditioned on), and only the random pixels are counted in determining the color count canonical statistics, which thus range from zero to $(\text{nrow} - 2) * (\text{ncol} - 2)$.

In the “torus” boundary specification, all pixels have four neighbors, so the neighbor pair canonical statistic ranges from zero to $2 * \text{nrow} * \text{ncol}$. In the “free” boundary specification, pixels in the interior have four neighbors, those in the relative interior of edges have three, and those in the corners have two, so the neighbor pair canonical statistic ranges from zero to $\text{nrow} * (\text{ncol} - 1) + (\text{nrow} - 1) * \text{ncol}$. In the “condition” boundary specification, only neighbor pairs in which at least one pixel is random are counted, so the neighbor pair canonical statistic ranges from zero to $(\text{nrow} - 2) * (\text{ncol} - 1) + (\text{nrow} - 1) * (\text{ncol} - 2)$.

Value

an object of class “potts”, which is a list containing at least the following components:

<code>initial</code>	initial state of Markov chain in the format output by <code>packPotts</code> .
<code>final</code>	final state of Markov chain in the same format.
<code>initial.seed</code>	value of <code>.Random.seed</code> before the run.
<code>final.seed</code>	value of <code>.Random.seed</code> after the run.
<code>time</code>	running time of Markov chain from <code>system.time</code> .
<code>param</code>	canonical parameter vector.
<code>nbatch</code>	the number of batches.
<code>blen</code>	the length of batches.
<code>nspac</code>	the spacing of iterations that contribute to batches.

`boundary` the argument boundary.

`batch` an `nbatch` by `nout` matrix, where `nout` is the length of the result returned by `outfun` or `length(param)` if `outfun == NULL`; each row is the batch means for the result of `outfun` or the canonical statistic vector for one batch of Markov chain iterations.

Examples

```
ncolor <- as.integer(4)
beta <- log(1 + sqrt(ncolor))
theta <- c(rep(0, ncolor), beta)

nrow <- 100
ncol <- 100
x <- matrix(1, nrow = nrow, ncol = ncol)
foo <- packPotts(x, ncolor)

out <- potts(foo, theta, nbatch = 10)
out$batch
## Not run: image(out$final)
```

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