

# Package ‘ANF’

April 11, 2018

**Type** Package

**Title** Affinity Network Fusion for Complex Patient Clustering

**Version** 1.0.0

**Author** Tianle Ma, Aidong Zhang

**Maintainer** Tianle Ma <tianlema@buffalo.edu>

**Description** This package is used for complex patient clustering by integrating multi-omic data through affinity network fusion.

**License** GPL-3

**VignetteBuilder** knitr

**Imports** igraph, Biobase, survival, MASS, stats, RColorBrewer

**Suggests** ExperimentHub, SNFtool, knitr, rmarkdown, testthat

**biocViews** Clustering, GraphAndNetwork, Network

**RoxygenNote** 6.0.1

**NeedsCompilation** no

## R topics documented:

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|                 |                                                                                                      |
|-----------------|------------------------------------------------------------------------------------------------------|
| affinity_matrix | <i>Generate a symmetric affinity matrix based on a distance matrix using 'local' Gaussian kernel</i> |
|-----------------|------------------------------------------------------------------------------------------------------|

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## Description

Generate a symmetric affinity matrix based on a distance matrix using 'local' Gaussian kernel

**Usage**

```
affinity_matrix(D, k, alpha = 1/6, beta = 1/6)
```

**Arguments**

|       |                                                                                                        |
|-------|--------------------------------------------------------------------------------------------------------|
| D     | distance matrix (need to be a square and non-negative matrix)                                          |
| k     | the number of k-nearest neighbors                                                                      |
| alpha | coefficient for local diameters. Default value: 1/6. This default value should work for most cases.    |
| beta  | coefficient for pair-wise distance. Default value: 1/6. This default value should work for most cases. |

**Value**

an affinity matrix

**Examples**

```
D = matrix(runif(400), nrow=20)
A = affinity_matrix(D, 5)
```

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|     |                                                                                         |
|-----|-----------------------------------------------------------------------------------------|
| ANF | <i>Fuse affinity networks (i.e., matrices) through one-step or two-step random walk</i> |
|-----|-----------------------------------------------------------------------------------------|

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**Description**

Fuse affinity networks (i.e., matrices) through one-step or two-step random walk

**Usage**

```
ANF(Wall, K = 20, weight = NULL, type = c("two-step", "one-step"),
    alpha = c(1, 1, 0, 0, 0, 0, 0, 0), verbose = FALSE)
```

**Arguments**

|         |                                                                                                                                                                                                                                                                                                                                                                                                                                                    |
|---------|----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Wall    | a list of affinity matrices of the same shape.                                                                                                                                                                                                                                                                                                                                                                                                     |
| K       | the number of k nearest neighbors for function kNN_graph                                                                                                                                                                                                                                                                                                                                                                                           |
| weight  | a list of non-negative real numbers (which will be normalized internally so that it sums to 1) that one-to-one correspond to the affinity matrices included in 'Wall'. If not set, internally uniform weights are assigned to all affinity matrices in 'Wall'.                                                                                                                                                                                     |
| type    | choose one of the two options: perform "one-step" random walk, or "two-step" random walk on the list of affinity matrices in 'Wall' to generate a fused affinity matrix. Default: "two-step" random walk                                                                                                                                                                                                                                           |
| alpha   | a list of eight non-negative real numbers (which will be normalized internally to make it sums to 1). Only used when "two-step" (default value of 'type') random walk is used. 'alpha' is the weights for eight terms in the "two-step" random walk formula (check research paper for more explanations about the terms). Default value: (1, 1, 0, 0, 0, 0, 0, 0), i.e., only use the first two terms (since they are most effective in practice). |
| verbose | logical(1); if true, print some information                                                                                                                                                                                                                                                                                                                                                                                                        |

**Value**

a fused transition matrix (representing a fused network)

**Examples**

```
D1 = matrix(runif(400), nrow=20)
W1 = affinity_matrix(D1, 5)
D2 = matrix(runif(400), nrow=20)
W2 = affinity_matrix(D1, 5)
W = ANF(list(W1, W2), K=10)
```

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 eval\_clu

*Evaluate clustering result*


---

**Description**

Evaluate clustering result

**Usage**

```
eval_clu(true_class, w = NULL, d = NULL, k = 10, num_clu = NULL,
  surv = NULL, type_L = c("rw", "sym", "unnormalized"), verbose = TRUE)
```

**Arguments**

|            |                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                    |
|------------|--------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| true_class | A named vector of true class labels                                                                                                                                                                                                                                                                                                                                                                                                                                                                                |
| w          | affinity matrix                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                    |
| d          | distance matrix if w is NULL, calculate w using d                                                                                                                                                                                                                                                                                                                                                                                                                                                                  |
| k          | an integer, default 10; if w is null, w = affinity_matrix(d, k); otherwise unused.                                                                                                                                                                                                                                                                                                                                                                                                                                 |
| num_clu    | an integer; number of clusters; if NULL, set num_clu to be the number of classes using true_class                                                                                                                                                                                                                                                                                                                                                                                                                  |
| surv       | a data.frame with at least two columns: time (days_to_death or days_to_last_follow_up), and censored (logical(1))                                                                                                                                                                                                                                                                                                                                                                                                  |
| type_L     | (parameter passed to spectral_clustering: 'type') choose one of three versions of graph Laplacian: "unnormalized": unnormalized graph Laplacian matrix ( $L = D - W$ ); "rw": normalization closely related to random walk ( $L = I - D^{-1} * W$ ); (default choice) "sym": normalized symmetric matrix ( $L = I - D^{-0.5} * W * D^{-0.5}$ ) For more information: <a href="https://www.cs.cmu.edu/~aarti/Class/10701/readings/Luxburg06_TI">https://www.cs.cmu.edu/~aarti/Class/10701/readings/Luxburg06_TI</a> |
| verbose    | logical(1); if true, print some information                                                                                                                                                                                                                                                                                                                                                                                                                                                                        |

**Value**

a named list of size 3: "w": affinity matrix used for spectral\_clustering; "clu.res": a named vector of calculated "NMI" (normalized mutual information), "ARI" (Adjusted Rand Index), and "-log10(p)" of log rank test of survival distributions of patient clusters; "labels": a numeric vector as class labels

**Examples**

```

library(MASS)
true.class = rep(c(1,2), each=100)
feature.mat1 = mvrnorm(100, rep(0, 20), diag(runif(20,0.2,2)))
feature.mat2 = mvrnorm(100, rep(0.5, 20), diag(runif(20,0.2,2)))
feature1 = rbind(feature.mat1, feature.mat2)
d = dist(feature1)
d = as.matrix(d)
A = affinity_matrix(d, 10)
res = eval_clu(true_class=true.class, w=A)

```

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kNN\_graph

*Calculate k-nearest-neighbor graph from affinity matrix and normalize it as transition matrix*


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**Description**

Calculate k-nearest-neighbor graph from affinity matrix and normalize it as transition matrix

**Usage**

```
kNN_graph(W, K)
```

**Arguments**

W                    affinity matrix (its elements are non-negative real numbers)  
K                    the number of k nearest neighbors

**Value**

a transition matrix of the same shape as W

**Examples**

```

D = matrix(runif(400),20)
W = affinity_matrix(D, 5)
S = kNN_graph(W, 5)

```

---

pod

*Finding optimal discrete solutions for spectral clustering*


---

**Description**

Finding optimal discrete solutions for spectral clustering

**Usage**

```
pod(Y, verbose = FALSE)
```

**Arguments**

|         |                                                                                                                                                                                                                                                                                        |
|---------|----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Y       | a matrix with N rows and K columns, with N being the number of objects (e.g., patients), K being the number of clusters. The K columns of 'Y' should correspond to the first k eigenvectors of graph Laplacian matrix (of affinity matrix) corresponding to the k smallest eigenvalues |
| verbose | logical(1); if true, print some information                                                                                                                                                                                                                                            |

**Value**

class assignment matrix with the same shape as Y (i.e., N x K). Each row contains all zeros except one 1. For instance, if  $X_{ij} = 1$ , then object (eg, patient) i belongs to cluster j.

**References**

Stella, X. Yu, and Jianbo Shi. "Multiclass spectral clustering." ICCV. IEEE, 2003.

**Examples**

```
D = matrix(runif(400),20)
A = affinity_matrix(D, 5)
d = rowSums(A)
L = diag(d) - A
# `NL` is graph Laplacian of affinity matrix `A`
NL = diag(1/d) %*% L
e = eigen(NL)
# Here we select eigenvectors corresponding to three smallest eigenvalues
Y = Re(e$vector[, -1:-17])
X = pod(Y)
```

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spectral\_clustering    *spectral\_clustering*

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**Description**

spectral\_clustering

**Usage**

```
spectral_clustering(A, k, type = c("rw", "sym", "unnormalized"),
  verbose = FALSE)
```

**Arguments**

|         |                                                                                                                                                                                                                                                                                                                                                                                                            |
|---------|------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| A       | affinity matrix                                                                                                                                                                                                                                                                                                                                                                                            |
| k       | the number of clusters                                                                                                                                                                                                                                                                                                                                                                                     |
| type    | choose one of three versions of graph Laplacian: "unnormalized": unnormalized graph Laplacian matrix ( $L = D - W$ ); "rw": normalization closely related to random walk ( $L = I - D^{-1} * W$ ); (default choice) "sym": normalized symmetric matrix ( $L = I - D^{-0.5} * W * D^{-0.5}$ ) For more information: <a href="https://www.cs.cmu.edu/~aarti/Class/">https://www.cs.cmu.edu/~aarti/Class/</a> |
| verbose | logical(1); if true, print user-friendly information                                                                                                                                                                                                                                                                                                                                                       |

**Value**

a numeric vector as class labels

**Examples**

```
D = matrix(runif(400), nrow = 20)
A = affinity_matrix(D, 5)
labels = spectral_clustering(A, k=2)
```

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