

# Package ‘SFtools’

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**Type** Package

**Title** Space Filling Based Tools for Data Mining

**Version** 0.1.0

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**Description** Contains space filling based tools for machine learning and data mining. Some functions offer several computational techniques and deal with the out of memory for large big data by using the ff package.

**Imports** wordspace, doParallel, ff, parallel, stats

**License** GPL-3

**URL** <https://sites.google.com/site/mohamedlaibwebpage/>

**BugReports** <https://github.com/mlaib/SFtools/issues>

**Encoding** UTF-8

**LazyData** true

**Note** The GPU computing version can be found soon, on following url  
<https://sites.google.com/site/mohamedlaibwebpage/Software>.

**RoxxygenNote** 6.0.1

**NeedsCompilation** no

**Repository** CRAN

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SFtools-package

*SFtools: Space Filling Based Tools for Data Mining***Description**

Contains space filling based tools for machine learning and data mining. Some functions offer several computational techniques and deal with the out of memory for large big data by using the ff package.

**Author(s)**

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**References**

- M. Laib and M. Kanevski (2017). Unsupervised Feature Selection Based on Space Filling Concept, [arXiv:1706.08894](https://arxiv.org/abs/1706.08894).
- J. A. Royle, D. Nychka, An algorithm for the construction of spatial coverage designs with implementation in Splus, Computers and Geosciences 24 (1997) p. 479–488.
- J. Franco, Planification d’expériences numériques en phase exploratoire pour la simulation des phénomènes complexes, Thesis (2008) 282.
- D. Dupuy, C. Helbert, J. Franco (2015). DiceDesign and DiceEval: Two R Packages for Design and Analysis of Computer Experiments. Journal of Statistical Software, 65(11), 1-38. [Jstatsoft](https://doi.org/10.18637/jss.v065.i01).

**See Also**

Useful links:

- <https://sites.google.com/site/mohamedlaibwebpage/>
- Report bugs at <https://github.com/mlaib/SFtools/issues>

Infinity

*Simulated dataset***Description**

Generates a simulated dataset (the Infinity dataset)

**Usage**

```
Infinity(n=1000)
```

**Arguments**

**n** Number of generated data points (by default: n=1000).

**Value**

A `data.frame` of simulated dataset, with 7 features (4 of them are redundant)

**Author(s)**

Mohamed Laib <Mohamed.Laib@unil.ch>

**Examples**

```
infinity<-Infinity(n=1000)
plot(infinity$x1,infinity$x2)

## Not run:

##### Visualisation of the infinity dataset (3D) #####
require(rgl)
require(colorRamps)

c <- cut(infinity$z,breaks=100)
cols <- matlab.like(100)[as.numeric(c)]
plot3d(infinity$x1,infinity$x2,infinity$z,radius=0.01, col=cols,
type="s",xlab="x1",ylab="x2",zlab="z",box=F)
grid3d(c("x","y","z"),col="black",lwd=1)

## End(Not run)
```

**Description**

Applies the UfsCov algorithm based on the space filling concept, by using a sequential forward search (SFS).

**Usage**

`UfsCov(data)`

**Arguments**

**data** Data of class: `matrix` or `data.frame`.

## Details

Since the algorithm is based on pairwise distances, and according to the computing power of your machine, large number of data points can take much time and needs more memory. See [UfsCov\\_par](#) for parallel computing, or [UfsCov\\_ff](#) for memory efficient storage of large data on disk and fast access (by using the `ff` and the `ffbase` packages).

## Value

A list of two elements:

- `CovD` a vector containing the coverage measure of each step of the SFS.
- `IdR` a vector containing the added variables during the selection procedure.

## Note

The algorithm does not deal with missing values and constant features. Please make sure to remove them.

## Author(s)

Mohamed Laib <Mohamed.Laib@unil.ch>

## References

M. Laib and M. Kanevski (2017). Unsupervised Feature Selection Based on Space Filling Concept, [arXiv:1706.08894](#).

## Examples

```
infinity<-Infinity(n=800)
Results<- UfsCov(infinity)

cou<-colnames(infinity)
nom<-cou[Results[[2]]]
par(mfrow=c(1,1), mar=c(5,5,2,2))
names(Results[[1]])<-cou[Results[[2]]]
plot(Results[[1]], pch=16, cex=1, col="blue", axes = FALSE,
xlab = "Added Features", ylab = "Coverage measure")
lines(Results[[1]], cex=2, col="blue")
grid(lwd=1.5, col="gray" )
box()
axis(2)
axis(1,1:length(nom), nom)
which.min(Results[[1]])

## Not run:

#### UfsCov on the Butterfly dataset ####
require(IDmining)

N <- 1000
```

```

raw_dat <- Butterfly(N)
dat<-raw_dat[,-9]

Results<- UfsCov(dat)
cou<-colnames(dat)
nom<-cou[Results[[2]]]
par(mfrow=c(1,1), mar=c(5,5,2,2))
names(Results[[1]])<-cou[Results[[2]]]

plot(Results[[1]] ,pch=16,cex=1,col="blue", axes = FALSE,
xlab = "Added Features", ylab = "Coverage measure")
lines(Results[[1]] ,cex=2,col="blue")
grid(lwd=1.5,col="gray" )
box()
axis(2)
axis(1,1:length(nom),nom)
which.min(Results[[1]])

## End(Not run)

```

**UfsCov\_ff***UfsCov for unsupervised features selection***Description**

Applies the UfsCov algorithm based on the space filling concept, by using a sequential forward search (for memory efficient storage of large data on disk and fast access).

**Usage**

```
UfsCov_ff(data, blocks=2)
```

**Arguments**

- |               |   |
|---------------|---|
| <b>data</b>   | Data of class: <code>matrix</code> or <code>data.frame</code> .   |
| <b>blocks</b> | Number of splits to facilitate the computation of the distance matrix (by default: <code>blocks=2</code> ). |

**Value**

A list of two elements:

- `CovD` a vector containing the coverage measure of each step of the SFS.
- `IdR` a vector containing the added variables during the selection procedure.

**Note**

This function is still under development.

**Author(s)**

Mohamed Laib <Mohamed.Laib@unil.ch>

**References**

M. Laib and M. Kanevski (2017). Unsupervised Feature Selection Based on Space Filling Concept, [arXiv:1706.08894](https://arxiv.org/abs/1706.08894).

**Examples**

```
## Not run:
##### Infinity dataset #####
N <- 1000
dat<-Infinity(N)
Results<- UfsCov_ff(dat)

cou<-colnames(dat)
nom<-cou[Results[[2]]]
par(mfrow=c(1,1), mar=c(5,5,2,2))
names(Results[[1]])<-cou[Results[[2]]]
plot(Results[[1]], pch=16, cex=1, col="blue", axes = FALSE,
xlab = "Added Features", ylab = "Coverage measure")
lines(Results[[1]], cex=2, col="blue")
grid(lwd=1.5, col="gray" )
box()
axis(2)
axis(1,1:length(nom), nom)
which.min(Results[[1]])

##### Butterfly dataset #####
require(IDmining)
N <- 1000
raw_dat <- Butterfly(N)
dat<-raw_dat[,-9]

Results<- UfsCov_ff(dat)

## End(Not run)
```

**Description**

Applies the UfsCov algorithm based on the space filling concept, by using a sequential forward search (SFS). This function offers a parallel computing.

**Usage**

```
UfsCov_par(data, ncores=2)
```

**Arguments**

- |        |   |
|--------|---|
| data   | Data of class: <code>matrix</code> or <code>data.frame</code> . |
| ncores | Number of cores to use (by default: <code>ncores=2</code> ).    |

**Details**

Since the algorithm is based on pairwise distances, and according to the computing power of your machine, large number of data points needs more memory. See [UfsCov\\_ff](#) for memory efficient storage of large data on disk and fast access (by using the `ff` and the `ffbase` packages).

**Value**

A list of two elements:

- `CovD` a vector containing the coverage measure of each step of the SFS.
- `IdR` a vector containing the added variables during the selection procedure.

**Note**

The algorithm does not deal with missing values and constant features. Please make sure to remove them. Note that it is not recommended to use this function with small data, it takes more time than using the standard [UfsCov](#) function.

**Author(s)**

Mohamed Laib <Mohamed.Laib@unil.ch>

**References**

M. Laib and M. Kanevski (2017). Unsupervised Feature Selection Based on Space Filling Concept, [arXiv:1706.08894](#).

**See Also**

[UfsCov](#), [UfsCov\\_ff](#)

**Examples**

```
N <- 800
dat<-Infinity(N)
Results<- UfsCov_par(dat,ncores=2)

cou<-colnames(dat)
nom<-cou[Results[[2]]]
par(mfrow=c(1,1), mar=c(5,5,2,2))
names(Results[[1]])<-cou[Results[[2]]]
```

```
plot(Results[[1]] ,pch=16,cex=1,col="blue", axes = FALSE,
      xlab = "Added Features", ylab = "Coverage measure")
lines(Results[[1]] ,cex=2,col="blue")
grid(lwd=1.5,col="gray" )
box()
axis(2)
axis(1,1:length(nom),nom)
which.min(Results[[1]])

## Not run:

N<-5000
dat<-Infinity(N)

## Little comparison:
system.time(Uf<-UfsCov(dat))
system.time(Uf.p<-UfsCov_par(dat, ncores = 4))

## End(Not run)
```

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