# Package 'exposomex'

| December 13, 2022  |
|--|
| Title One integrated platform for exposomic analysis.  |
| Version 1.0.0  |
| Description  One integrated platform ``ExpsomeX" for exposomic analysis (see: http://www.exposomex.cn/), including 14 sub-packages: exstat,exviz,exdb,excros,exmo,exmeta,exmedt,exnta,exsurv, expanel, exmix,exstatlink,exbiolink and extidy.  |
| License GPL (>= 3)   |
| Encoding UTF-8   |
| Roxygen list(markdown = TRUE)  |
| RoxygenNote 7.2.2  |
| Imports httr,vroom,ggplot2,readxl,grid,gridExtra,writexl,ddpcr,GGally,gt   |
| NeedsCompilation no  |
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4 BioLink

| BioLink | Build the biological link |  |
|---------|---------------------------|--|
|         |                           |  |

# Description

Build the biological link between the exposures and diseases

# Usage

```
BioLink(PID, OutPath ="default", Mode, ChemCas="default", ChemInchikey= "default",
  DiseaseID= "default", MetabolomeID= "default", MetBiospec= "blood", ProteomeID= "default")
```

# Ar

| r | guments      |  |
|---|--------------|--|
|   | PID          | chr. Program ID. It must be the same with the PID generated by InitBioLink.  |
|   | OutPath      | chr. Output file directory. e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.   |
|   | Mode         | chr. Method to build the biological link between exposures and diseases. Available options include "PPI" (i.e., protein-protein interaction) and "GO" (i.e., gene ontoloty).   |
|   | ChemCas      | chr. CAS Registry Number of chemicals. Default means using the values in the input data file. Users can also copy the part of them by clicking "Available vars". It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., "7440-43-9,333-41-5,20461-54-5".  |
|   | ChemInchikey | chr. InChiKey serial number of chemicals. Default means using the values in the input data file. It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., "WABPQHHGFIMREM-UHFFFAOYSA-N,BTAGRXWGMYTPBY-UHFFFAOYSA-N,IAKOZHOLGAGEJT-UHFFFAOYSA-N".  |
|   | DiseaseID    | chr. ID of the concerned diseases. Both IDs from OMIM (e.g., OMIM:220100) and MESH (e.g., MESH:C536409) are accepted. It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., "OMIM:244200,MESH:C536409,OMIM:181500".  |
|   | MetabolomeID | chr. KEGG entry number of metabolites. Default means using the values in the input data file. Users can also copy the part of them by clicking "Available vars". It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., "C00022,C00117,C00794".   |
|   | MetBiospec   | chr. Biological sample matrix for the metabolome analysis. Options include "Blood" and "Urine".  |
|   | ProteomeID   | chr. Protein ID. Both IDs of Ensembl and UniProt are accepted. Default means using the values in the input data file. Users can also copy the part of them by clicking "Available vars". It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., "Q9Y3X0,Q8N5I3, ENSP00000000233,ENSP00000000412". |

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### Value

A list object containing the edges and nodes of the biological link.

#### Author(s)

Mingliang Fang, Bin Wang (corresponding author)

### **Examples**

```
res = InitBioLink()
  res1 = LoadBioLink(PID = res$PID, UseExample = "example#1")
  res2 = ConvToExpoID(PID = res$PID)
  res3 = BioLink(PID = res$PID, OutPath="default", Mode = "PPI", ChemCas = "default",
  ChemInchikey = "default",DiseaseID = "default",MetabolomeID = "default",
  MetBiospec = "blood", ProteomeID = "default")
```

ConvToExpoID

Convert different IDs to the unified ExposomeX IDs

### **Description**

Convert the IDs of exposure, chemicals, metabolites, or proteins to the unified ExposomeX ID, i.e., unified identifier in ExposomeX platform

# Usage

```
ConvToExpoID(PID, OutPath="default")
```

#### **Arguments**

chr. Program ID. It must be the same with the PID generated by InitBioLink.

OutPath

chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set

### Value

A data frame containing the converted ID information

### Author(s)

Mingliang Fang, Weinan Lin, Bin Wang (corresponding author)

```
res = InitBioLink()
  res1 = LoadBioLink(PID = res$PID, UseExample = "example#1")
  res2 = ConvToExpoID(PID = res$PID)
```

6 CrosAsso

|--|

# Description

Association analysis for cross-sectional data.

# Usage

```
CrosAsso(PID, OutPath = "default", EpiDesign = "cross.sectional",
   VarsY, VarsX = "all.cx", VarsN = "single.factor", VarsSel = FALSE, VarsSelThr = 0.1,
   IncCova = TRUE, Family ,RepMsr = FALSE, Corstr = "ar1")
```

# **Arguments**

| PID        | chr. Program ID. It must be the same with the PID generated by ExpoCros   |
|------------|---|
| OutPath    | chr. Output file directory, e.g., "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.   |
| EpiDesign  | chr. Epidemiological design of the study, including "cohort" "case.control" and "cross.sectional". It doesn't affect the modeling, but the format of the output file. For the three designs, the effect values are usually indicated by RR (relative risk) of cohort, OR (odds ratio) of case-control, and beta value of cross-sectional. |
| VarsY      | chr. Outcome variable used for modeling. Only one variable can be entered.  |
| VarsX      | chr. Exposure variable used for modeling. The default option is "all.x" (All exposure variables are included). Users can also choose available variables. It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., "X1,X2,X3"  |
| VarsN      | chr. Choose the single factor or multiple factor model. Available options include "single.factor" and "multiple.factor"   |
| VarsSel    | lgl. T (or TRUE) and F (or FALSE). Whether to select the significant variable for the final model. Available options.   |
| VarsSelThr | num. If "VarsSel" = TRUE, provide the selection threshold of the P-value. three values can be chosen, i.e. 0.05, 0.1, and 0.2.  |
| IncCova    | lgl. T (or TRUE) and F (or FALSE). Whether to include the covariate selected in the function "FindCovaCros"   |
| Family     | chr. The link function for the regression model according the data type of outcomes, including "gaussian" for continuous variable, "binomial" for binary variable, and "poisson" for counting variable  |
| RepMsr     | lgl. T (or TRUE) and F (or FALSE). Whether existing repeated measurement of the subjects. Available options.  |
| Corstr     | chr. If "RepMsr" = TRUE, the generalized estimating equations (GEE) will be used. For GEE, three correlation structure options are "exchangeable" "ar1" "unstructured".   |

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# Value

A list containing the association analysis results.

### Author(s)

Bin Wang

# **Examples**

```
res <- InitCros()
  res1 = LoadCros(PID = res$PID, UseExample = "example#1")
  res2 = CrosAsso(PID=res$PID, EpiDesign = "cohort",
  VarsY = "Y1", VarsX = "X5,X6,X7,X8,X9,X10,X11", VarsN = "single.factor",
  VarsSel = FALSE, VarsSelThr = 0.1, IncCova = TRUE, Family = "gaussian",
  RepMsr = FALSE,Corstr = "ar1")
  FuncExit(PID = res$PID)</pre>
```

CrosPred

Build prediction models

# **Description**

Build prediction models

### Usage

```
CrosPred(PID, OutPath = "default", VarsY, VarsX = "all.x",
    PredType = "response", VarsSel = FALSE, VarsSelThr = 0.1, IncCova = TRUE,
    RsmpMethod = "cv", Folds = 5, Ratio = 0.667, Repeats = 5)
```

#### **Arguments**

| PID        | chr. Program ID. It must be the same with the PID generated by ExpoCros  |
|------------|--|
| OutPath    | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.   |
| VarsY      | chr. Outcome variable used for modeling. Only one variable can be entered.   |
| VarsX      | chr. Exposure variable used for modeling. The default option is "all.x" (All exposure variables are included). Users can also choose available variables. It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., "X1,X2,X3" |
| PredType   | chr. Prediction type of the outcome variable, including "response" for the actual values and "prob" for outcome with binary variable.  |
| VarsSel    | lgl. Whether to select the significant variable for the final model. Available options include T (or TRUE) and F (or FALSE).   |
| VarsSelThr | num. If "VarsSel" = TRUE, provide the selection threshold of the P-value. three values can be chosen, i.e. 0.05, 0.1, and 0.2.   |

8 DelMiss

IncCova lgl. Whether to include the covariate selected in the function of "FindCovaCros".

Available options include T (or TRUE) and F (or FALSE).

RsmpMethod chr. Four resampling methods options for internal validation, including "cv"

(i.e., Cross validation), "loo" (i.e., eave-one-out), "bootstrap", and "holdout".

rolds num. Folds of Cross-validation resampling. It is ranging 2-10.

Ratio num. Ratio of Bootstrap resampling. It is ranging 0.4-0.9.

Repeats num. Number of Bootstrap resampling. It is ranging 2-20.

#### Value

A list containing the prediction performance evaluation.

#### Author(s)

Bin Wang

### **Examples**

```
res <- InitCros()
  res1 = LoadCros(PID = res$PID, UseExample = "example#1")
  res2 = CrosPred(PID=res$PID, VarsY = "Y1", VarsX = "X5,X6,X7,X8,X9,X10,X11",
  PredType = "response", VarsSel = FALSE, VarsSelThr = 0.1, IncCova = FALSE,
  RsmpMethod = "cv", Folds = 5, Ratio = 0.667, Repeats = 5)
  FuncExit(PID = res$PID)</pre>
```

DelMiss

Delete variables with missing values

### **Description**

Whether to delete missing variables with low variance. The default option is "yes". If skipped, it may result in failure during modeling.

### Usage

```
DelMiss(PID, OutPath = "default")
```

# **Arguments**

chr. Program ID. It must be the same with the PID generated by initial functions.

OutPath chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol

is "/", not "\". If "default", the current working directory will be set.

### Value

An R6 class object containing the variable(s) without missing values.

DelNearZeroVar 9

### Author(s)

Bin Wang

# **Examples**

```
res = InitTidy()
    res1 = LoadTidy(PID=res$PID, UseExample="example#1")
    res2 = DelMiss(PID=res$PID)
    FuncExit(PID = res$PID)
```

DelNearZeroVar

Delete variables with low variance

# Description

Whether to delete variables with low variance. The default option is "yes". If skipped, it may result in failure to build models.

### Usage

```
DelNearZeroVar(PID, OutPath = "default")
```

# Arguments

PID chr. Program ID. It must be the same with the PID generated by initial functions.

OutPath chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol

is "/", not "\". If "default", the current working directory will be set.

### Value

An R6 class object containing the variable(s) with acceptable variance.

### Author(s)

Bin Wang

```
res = InitTidy()
  res1 = LoadTidy(PID=res$PID, UseExample="example#1")
  res2 = DelNearZeroVar(PID=res$PID)
  FuncExit(PID = res$PID)
```

10 ExpoAnno

| Ex | <br>A I | _ | L_ |  |
|----|---------|---|----|--|
|    |         |   |    |  |
|    |         |   |    |  |

Explain the abbreviations

### **Description**

Explain the abbreviations in ExposomeX platform

### Usage

```
ExpoAbbr(PID, OutPath = "default", Keys)
```

# **Arguments**

PID chr. Program ID. It must be the same with the PID generated by ExpoDB

OutPath chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol

is "/", not "\". If "default", the current working directory will be set.

Keys chr. Any keywords to search. "default" means using the values . in the input

data file. Users can also enter the keywords here. It should be noted that there is fixed format for the entering characters separated with comma and without

space, e.g., "EpiDesign, Cros, Cohort".

#### Value

A data frame

# Author(s)

Bin Wang

#### **Examples**

```
res <- InitDb()
  res1 = LoadDb(PID = res$PID, UseExample = "example#1")
  res2 = ExpoAbbr(PID=res$PID, Keys = "default")
  FuncExit(PID = res$PID)</pre>
```

ExpoAnno

Annotate the non-targeted features

### Description

Annotate the non-targeted features from high-resolution mass spectrometry

### **Usage**

```
ExpoAnno(PID, OutPath = "default", MassToCharge, AdductPos,
  AdductNeg, Accuracy = 1)
```

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# **Arguments**

PID chr. Program ID. It must be the same with the PID generated by ExpoDB

OutPath chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol

is "/", not "\". If "default", the current working directory will be set.

MassToCharge chr. Mass to charge ratio (m/z). It ranges 50-1000. If "default", the values in

the input data file are used. Users can also enter the keywords here. It should be noted that there is fixed format for the entering characters separated with comma

and without space, e.g., "150,200,210".

AdductPos chr. Adducts collected in the positive mode. If "default", the values in the input

data file are chosen. Users can also enter the keywords here. It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., "M+H+Na,M+2ACN+2H,M+DMSO+H". All the positive

abducts are M+3ACN+2H,M+ACN+H,M+NH4,M+2ACN+2H,M+2H,M+3H,M+3Na, "M+2Na-H,M+ACN+Na,M+H+Na,M+2K-H,M+H+NH4,2M+K,M+K,2M+NH4,2M+Na, M+2Na,M+DMSO+H,M+2ACN+H,M+IsoProp+Na+H,M+2H+Na,M+ACN+2H,M+H,

2M+H,M+CH3OH+H,M+H+2Na,M+Na",2M+ACN+H,2M+ACN+Na,M+IsoProp+H,M+H+K"

AdductNeg chr. Adducts collected in the negative mode. If "default", the values in the input

H,M+Na-2H,M-2H,M+TFA-H,M+Cl,M-3H,2M-H".

Accuracy num. Upper limit of accuracy to match the target molecular.

#### Value

A data frame

# Author(s)

Bin Wang

```
res <- InitDb()
  res1 = LoadDb(PID = res$PID, UseExample = "example#1")
  res6 = ExpoAnno(PID=res$PID, MassToCharge = "default", AdductPos = "all",
  AdductNeg = "all", Accuracy = 5)
  FuncExit(PID = res$PID)</pre>
```

12 ExpoConv

| ExpoConv |  |
|----------|--|

Convert keywords

# **Description**

Convert the keywords from different sources in ExposomeX platform.

#### Usage

```
ExpoConv(PID, OutPath = "default", From, To, Keys)
```

# **Arguments**

PID chr. Program ID. It must be the same with the PID generated by ExpoDB

OutPath chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol

is "/", not "\". If "default", the current working directory will be set.

From chr. Choose the search range of the convert direction for the concerned key-

words (from -> to). Options include "chemical" <-> "cas.rn" (Chemical name <-> CAS Registry Number), "inchikey" <-> "chemical" (InChIKey <-> Chemical name), "metabolite" <-> "kegg.entry" (Metabolite name <-> InChIKey), "kegg.entry" <-> "metabolite" (KEGG Entry ID <-> Metabolite name), "protein" <-> "uniprot" (protein name <-> UniProt ID), "uniprot" <-> "ensembl" (UniProt ID <-> Chemical name), "enzyme" <-> "uniprot" (Enzyme name <->

UniProt ID), "disease" <-> "disease.id" (Disease <-> Disease.id)

To chr. see "from".

Keys chr. Any keywords belong to the classes of "from" and "to" to search. "default"

means using the values in the input data file. Users can also enter the keywords here. It should be noted that there is fixed format for the entering characters sep-

arated with comma and without space, e.g., "7440-43-9,OMIM:619217,zinc,GO:0010942".

# Value

A data frame

### Author(s)

Bin Wang

```
res <- InitDb()
  res1 = LoadDb(PID = res$PID, UseExample = "example#1")
  res2 = ExpoConv(PID=res$PID, From = "chemical", To = "cas.rn", Keys = "default")
  FuncExit(PID = res$PID)</pre>
```

ExpoDict 13

| ExpoDict | Explain keywords |
|----------|------------------|
|----------|------------------|

### **Description**

Explain the keyword in ExposomeX platform

### Usage

```
ExpoDict(PID, OutPath = "default", Class, Keys)
```

# **Arguments**

PID chr. Program ID. It must be the same with the PID generated by ExpoDB

OutPath chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol

is "/", not "\". If "default", the current working directory will be set.

Class chr. Choose the search range of the concerned keywords. Options include

"chemical" (Some exposure factors may be a mixture of chemicals, e.g. PM2.5, tobacco smoking. As chemicals account for the majority, we use "Chemical" for convenience), "metabolite" (the chemicals used for metabolome analysis in the KEGG database), "protein", "enzyme" (referring in particular to the enzymes in the KEGG database), "disease", "GO" (gene ontology), and "ion.adduct" (the

ion adducts in the liquid chromatograph-mass spectrometry).

Keys chr. Any keywords to search. "default" means using the values in the input data

file. Users can also enter the keywords here. It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g.,

"7440-43-9,OMIM:619217,zinc,GO:0010942".

# Value

A data frame

### Author(s)

Bin Wang

```
res <- InitDb()
  res1 = LoadDb(PID = res$PID, UseExample = "example#1")
  res2 = ExpoDict(PID=res$PID, Class = "GO", Keys = "default")
  FuncExit(PID = res$PID)</pre>
```

14 ExpoNexus

| ExpoNexus | Find the nexuses between keywords |
|-----------|-----------------------------------|
|           |                                   |

# Description

Find the nexuses between the keywords in ExposomeX platform. Nexus direction from keywords A (class A) to keywords B (class B)

# Usage

```
ExpoNexus(PID, OutPath = "default", ClassA, ClassB,
  KeysA = "default", KeysB = "default")
```

# **Arguments**

| PID     | chr. Program ID. It must be the same with the PID generated by ExpoDB  |
|---------|--|
| OutPath | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.                                       |
| ClassA  | chr. Find the nexuses between the keywords in ClassA and ClassB. Options include "chemical" <-> "protein", "chemical" <-> "GO", "protein" <-> "protein", "disease" <-> "GO", "protein" <-> "disease" |
| ClassB  | chr. See "ClassA".   |
| KeysA   | chr. The lowercases of name, alias, and ID of chemical, metabolite, protein, and enzyme are all accepted. e.g., "7440-43-9,OMIM:619217,zinc,GO:0010942".   |
| KeysB   | chr. See "KeysA".  |

### Value

A data frame

# Author(s)

Bin Wang

```
res <- InitDb()
  res1 = LoadDb(PID = res$PID, UseExample = "example#1")
  res2 = ExpoNexus(PID=res$PID, ClassA = "chemical", ClassB = "protein",
  KeysA = "default", KeysB = "default")
  FuncExit(PID = res$PID)</pre>
```

FindCovaCros 15

# Description

Find covariates

### Usage

```
FindCovaCros(PID, OutPath = "default", VarsY, VarsC_Prior = "default",
    VarsC_Fixed = NULL, Method = "single.factor", Thr = 0.1)
```

# **Arguments**

| PID         | chr. Program ID. It must be the same with the PID generated by ExpoCros  |
|-------------|--|
| OutPath     | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set. |
| VarsY       | chr. Outcome variable used for modeling. Only one variable can be entered.   |
| VarsC_Prior | chr. Potential covariates needing further statistical test. The default value is all covariate variables listed in the data file.                              |
| VarsC_Fixed | chr. Covariate variables fixed in the model by users.  |
| Method      | chr. Methods for screening the covariates, including two options, i.e. "single.factor" and "two.stage".  |
| Thr         | num. Threshold of the P-value for screening the covariates. It is ranging $0.05$ - $0.25$ . The default value is $0.1$ .                                       |

# Value

A list containing the selected covariates.

# Author(s)

Bin Wang

```
res <- InitCros()
  res1 = LoadCros(PID = res$PID, UseExample = "example#1")
  res2 = FindCovaCros(PID=res$PID, VarsY = "Y1",
  VarsC_Prior = "default", VarsC_Fixed = NULL, Method = "single.factor", Thr = 0.1)
  FuncExit(PID = res$PID)</pre>
```

16 FindCovaMix

| FindCovaMix Find covariates |
|-----------------------------|
|-----------------------------|

# Description

Find covariates

# Usage

```
FindCovaMix(PID, OutPath = "default", VarsY, VarsC_Prior = "default",
    VarsC_Fixed = NULL, Method = "single.factor", Thr = 0.1)
```

# Arguments

| PID         | chr. Program ID. It must be the same with the PID generated by ExpoMixEffect   |
|-------------|--|
| OutPath     | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set. |
| VarsY       | chr. Outcome variable used for modeling. Only one variable can be entered.   |
| VarsC_Prior | chr. Potential covariates needing further statistical test. The default value is all covariate variables listed in the data file.                              |
| VarsC_Fixed | chr. Covariate variables fixed in the model by users.  |
| Method      | chr. Methods for screening the covariates, including two options, i.e. "single.factor" and "two.stage".  |
| Thr         | num. Threshold of the P-value for screening the covariates. It is ranging $0.05$ - $0.25$ . The defaults value is $0.1$ .                                      |

# Value

A list containing the selected covariates.

# Author(s)

Bin Wang

```
res <- InitMix()
  res = LoadMix(PID = res$PID, UseExample = "example#1")</pre>
```

FindCovaNta 17

| FindCovaNta | Find covariates |  |  |
|-------------|-----------------|--|--|
|-------------|-----------------|--|--|

# **Description**

Find covariates

# Usage

```
FindCovaNta(PID, OutPath = "default", VarsY, VarsC_Prior = "default",
    VarsC_Fixed = NULL, Method = "single.factor", Thr = 0.1)
```

# Arguments

| PID         | chr. Program ID. It must be the same with the PID generated by ExpoNTA   |
|-------------|--|
| OutPath     | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set. |
| VarsY       | chr. Outcome variable used for modeling. Only one variable can be entered.   |
| VarsC_Prior | chr. Potential covariates needing further statistical test. The default value is all covariate variables listed in the data file.                              |
| VarsC_Fixed | chr. Covariate variables fixed in the model by users.  |
| Method      | chr. Methods for screening the covariates, including two options, i.e. "single.factor" and "two.stage".  |
| Thr         | num. Threshold of the P-value for screening the covariates. It is ranging $0.05$ - $0.25$ . The defaults value is $0.1$ .                                      |

#### Value

A list containing the selected covariates.

# Author(s)

Mingliang Fang, Bin Wang (corresponding author)

```
res <- InitNTA()
  res1 = LoadNTA(PID = res$PID, UseExample = "example#1")
  res2 = FindCovaNta(PID=res$PID, VarsY = "Y1", VarsC_Prior = "default",
  VarsC_Fixed = "C2", Method = "single.factor", Thr = 0.1)</pre>
```

18 FindCovaPanel

| FindCovaPanel |
|---------------|
|---------------|

# **Description**

Find covariates

# Usage

```
FindCovaPanel(PID, OutPath = "default", VarsY, VarsC_Prior = "default",
    VarsC_Fixed = NULL, Method = "single.factor", Thr = 0.1)
```

# Arguments

| PID         | chr. Program ID. It must be the same with the PID generated by ExpoPanel   |
|-------------|--|
| OutPath     | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set. |
| VarsY       | chr. Outcome variable used for modeling. Only one variable can be entered.   |
| VarsC_Prior | chr. Potential covariates needing further statistical test. The default value is all covariate variables listed in the data file.                              |
| VarsC_Fixed | chr. Covariate variables fixed in the model by users.  |
| Method      | chr. Methods for screening the covariates, including two options, i.e. "single.factor" and "two.stage".  |
| Thr         | num. Threshold of the P-value for screening the covariates. It is ranging 0.05-0.25. The defaults value is 0.1.  |

#### Value

A list containing the selected covariates.

# Author(s)

Bin Wang

```
res <- InitPanel()
  res1 = LoadPanel(PID = res$PID, UseExample = "example#1")
  res2 = FindCovaPanel(PID=res$PID, VarsY = "Y1",
  VarsC_Prior = "default", VarsC_Fixed = "C1", Method = "single.factor", Thr = 0.1)</pre>
```

FindCovaSurv 19

|--|

# Description

Find covariates

# Usage

```
FindCovaSurv(PID, OutPath = "default", TimeY, EventY, VarsC_Prior = "default",
    VarsC_Fixed = NULL, Method = "single.factor", Thr = 0.1)
```

# Arguments

| PID         | chr. Program ID. It must be the same with the PID generated by ExpoCros  |
|-------------|--|
| OutPath     | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set. |
| TimeY       | chr. Outcome variable of survival time used for modelling. Only one variable can be entered.   |
| EventY      | chr. Outcome variable of status used for modelling. Only one variable can be entered.  |
| VarsC_Prior | chr. Potential covariates needing further statistical test. The default value is all covariate variables listed in the data file.                              |
| VarsC_Fixed | chr. Covariate variables fixed in the model by users.  |
| Method      | chr. Methods for screening the covariates, including two options, i.e. "single.factor" and "two.stage".  |
| Thr         | num. Threshold of the P-value for screening the covariates. It is ranging 0.05-0.25. The default value is 0.1.   |

# Value

A list containing the selected covariates.

# Author(s)

Changxin Lan, Bin Wang(corresponding author)

```
res <- InitSurv()
  res1 = LoadSurv(PID = res$PID, UseExample = "example#1")
  res3 = FindCovaSurv(PID=res$PID, TimeY = "Y1", EventY= 'Y2',
  VarsC_Prior = "default", VarsC_Fixed = NULL, Method = "single.factor", Thr = 0.1)
  FuncExit(PID = res$PID)</pre>
```

20 ImptM

FuncExit

End the module analysis

# Description

End the module analysis

# Usage

```
FuncExit(PID)
```

# **Arguments**

PID

chr. Program ID. It should be the same with the PID generated by initial functions.

# Value

Exit status

# Author(s)

Bin Wang (corresponding author)

# **Examples**

```
res = InitTidy()
  res1 = LoadTidy(PID=res$PID, UseExample="example#1")
  res2 = DelNearZeroVar(PID=res$PID)
  FuncExit(PID = res$PID)
```

ImptM

Estimate the importance of mediators

# Description

Estimate the importance of mediators.

# Usage

```
ImptM(PID, OutPath, VarsY, VarsX = "default", VarsC = "default")
```

ImptM 21

# **Arguments**

| PID     | chr. Program ID. It must be the same with the PID generated by InitMedt.   |
|---------|--|
| OutPath | chr. Output file directory, e.g. "D:/output". If "default", the current working directory will be set.It should be noted that the slash symbol is "/", not "\".  |
| VarsY   | chr. The outcome variable. Either continuous, binary or count type is permitted.   |
| VarsX   | chr. Exposure variables included in estimation procedure. When "default" is specified, all exposure variables in the data will be used. The shirnkaged exposure variables are also permitted. It should be noted that there is fixed format for the characters separated with comma and without space, e.g., "X1,X2,X3". |
| VarsC   | chr. Covariates included in estimation procedure. When "default" is specified, all covariates in the data will be used. It should be noted that there is fixed format for the characters separated with comma and without space, e.g., "C1,C2".  |

#### **Details**

ImptM function estimates the importance of mediators among given exposures. The estimation procedure is mainly realized by the hima function in HIMA package. ImptM also provides another evaluation method by the bama function in bama package. The users can search for these packages for further information.

#### Value

A list containing four elements where the raw estimation results as well as the tidy tables for display are stored. The elements of that list include:

- 1. "MedtImptM\_all": the raw estimation result where the importance of each mediator was evaluated among whole mediators.
- 2. "MedtImptM\_list": the raw estimation result where the importance of each mediator was evaluated among each mediator group.
- 3. "MedtImptM\_table1": the tidy table for MedtImptM\_all and MedtImptM\_list, where significant estimations (q value <0.2) are expressed with an asterisk mark (\*).
- 4. "MedtImptM\_table2": the tidy table for MedtImptM\_all and MedtImptM\_list, where only significant estimations (q value <0.2) are displayed in this table. MedtImptM\_table2 is as same content as MedtImptM\_table1.

#### Author(s)

Mengyuan Ren, Bin Wang(corresponding author)

```
res <- InitMedt()
res1 <- LoadMedt(PID = res$PID, UseExample = "example#1", DataPath = NULL,
VocaPath = NULL)
res2 <- XMlists(PID = res$PID)
res3 <- ImptM(PID = res$PID, VarsY = "Y1",
VarsX = "default", VarsC = "default")
res4 <- ImptM(PID = res$PID, VarsY = "Y1",</pre>
```

22 InitCros

```
VarsX = "X1, X2, X3", VarsC = "C1")
```

InitBioLink

Initialize ExpoBioLink module

# **Description**

Initialize ExpoBioLink module analysis. It can generate an R6 class object integrating all the analysis information

# Usage

InitBioLink()

# **Details**

ExpoBioLink module is designed to find the biological relationships between exposure factors and health outcome. This module adopts the most frequently-used and authoritative databases, e.g., T3DB, CTD, ToxCast, StringDB, STITCH, KEGG, and GO.

# Value

An R6 class object.

### Author(s)

Mingliang Fang, Bin Wang, (corresponding author)

# **Examples**

```
res <- InitBioLink()</pre>
```

InitCros

Initialize ExpoCros module

# **Description**

Initialize ExpoCros module analysis. It can generate an R6 class object.

# Usage

InitCros()

InitDb 23

# **Details**

ExpoCros module was designed to analyze the cross-sectional data from exposome-wide association study (EWAS). This data structure can be obtained from the epidemiological designs of cross-section, case-control, and cohort.

#### Value

An R6 class object.

### Author(s)

Bin Wang

# **Examples**

```
res <- InitCros()
   FuncExit(PID = res$PID)</pre>
```

InitDb

Initialize ExpoDB module

#### **Description**

Initialize ExpoDB module analysis. It can generate an R6 class object.

# Usage

InitDb()

### **Details**

ExpoDB module is designed as a convenient tool to explore the data, as well as facilitating to find the biological relationship between exposure and diseases from the perspective of bioinformatics. This module adopts the most frequently-used and authoritative databases, e.g., T3DB, CTD, ToxCast, StringDB, STITCH, KEGG, and GO.

### Value

An R6 class object.

# Author(s)

Bin Wang (corresponding author)

```
res <- InitDb()
  FuncExit(PID = res$PID)</pre>
```

24 InitMeta

InitMedt

Initialize ExpoMediation module

# **Description**

Initialize ExpoMediation module analysis. It can generate an R6 class object integrating all the analysis information.

# Usage

InitMedt()

### **Details**

InitMedt uses R6 package to generate an R6 class object where parameters to be used for the following mediation module program are initialized and save in that object. All executed function codes in the ExpoMediaiton packaged will be recorded in the form of log text in that object. Furthermore, a program ID (i.e., PID) is randomly created for the users to identify their own program.

#### Value

An R6 class object.

### Author(s)

Mengyuan Ren, Bin Wang(corresponding author)

### **Examples**

res <- InitMedt()</pre>

InitMeta

Initialize ExpoMeta Module

# **Description**

Initialize ExpoMeta module, the first step to start ExpoMeta Module.

### Usage

InitMeta()

### **Details**

ExpoMeta module mainly provides users preliminary information retrieval and screening for metaanalysis. Run InitMeta to get a unique PID for following steps. InitMix 25

# Value

An R6 class object.

### Author(s)

Weinan Lin, Bin Wang (corresponding author)

# **Examples**

```
res <- InitMeta()
```

InitMix

Initialize ExpoMixEffect module

# Description

Initialize ExpoMixEffect module analysis. It can generate an R6 class object.

# Usage

InitMix()

### **Details**

ExpoMixEffect module is designed to analyze mixture effect of the various exposure factors. It mainly aims to screen the representative features with high contribution to the health outcome, as well as their potential interaction effect.

# Value

An R6 class object.

# Author(s)

Bin Wang (corresponding author)

```
res <- InitMix()
```

26 InitNTA

InitMO

Initialize ExpoMultiomics module

### **Description**

Initialize ExpoMultiomics analysis. It can generate an R6 class object integrating all the analysis information.

# Usage

InitMO()

### **Details**

ExpoMultiomics module is designed to integrate the multi-omic data to predict the incidence risk. It mainly aims to construct various stacked generalization(SG) models to predict the probability of outcome incidence, as well as providing the statistical explanation. In addition, the module can provide visualization plots with high quality of the final calculation results to make it easier for users to understand.

### Value

An R6 class object.

### Author(s)

Guohuan Zhang, Yuting Wang, Bin Wang (corresponding author)

### **Examples**

res <- InitMO()

InitNTA

Initialize ExpoNTA module

# Description

Initialize ExpoNTA module analysis. It can generate an R6 class object.

### Usage

InitNTA()

InitPanel 27

# **Details**

ExpoNontarget module is designed to conduct the analysis of the features from the high-resolution mass spectrometry. It mainly aims to screen and annotate the significant features associated with the health outcomes.

### Value

An R6 class object.

### Author(s)

Mingliang Fang, Bin Wang (corresponding author)

### **Examples**

```
res <- InitNTA()
```

InitPanel

Initialize ExpoPanel module

# **Description**

Initialize ExpoPanel module analysis. It can generate an R6 class object.

### Usage

InitPanel()

#### **Details**

ExpoPanel module is designed to conduct the analysis of the panel data. It mainly aims to evaluate the associations between exposure factors and the health outcome.

### Value

An R6 class object.

#### Author(s)

Bin Wang (corresponding author)

```
res <- InitPanel()</pre>
```

28 InitStatLink

InitStat

Initialize ExpoStat Module

# Description

The first step to start ExpoStat Module

# Usage

InitStat()

# Value

An R6 class object.

# Author(s)

Yanqiu Feng, Bin Wang (corresponding author)

# **Examples**

```
res = InitStat()
```

InitStatLink

Initialize ExpoStatLink module

# Description

Initialize ExpoStatLink module analysis. It can generate an R6 class object.

# Usage

InitStatLink()

# **Details**

ExpoStatLink module is designed to find the statistical relationships between exposure factors and health outcome.

### Value

An R6 class object.

# Author(s)

Bin Wang

InitSurv 29

### **Examples**

```
res <- InitStatLink()</pre>
```

InitSurv

Initialize ExpoSurvival module

# Description

Initialize ExpoSurvival module analysis. It can generate an R6 class object integrating all the analysis information.

# Usage

InitSurv()

#### **Details**

InitSurv uses R6 package to generate an R6 class object where parameters to be used for the following mediation module program are initialized and save in that object. All executed function codes in the ExpoSurvival packaged will be recorded in the form of log text in that object. Furthermore, a program ID (i.e., PID) is randomly created for the users to identify their own program.

### Value

An R6 class object.

### Author(s)

Changxin Lan, Bin Wang(corresponding author)

### **Examples**

```
res <- InitSurv()
```

InitTidy

Initialize ExpoTidy module

# Description

Initialize ExpoTidy module analysis. It can generate an R6 class object.

# Usage

InitTidy()

30 InitViz

# **Details**

It is designed to tidy the data for the target model analysis.

#### Value

An R6 class object.

#### Author(s)

Bin Wang

# **Examples**

```
res = InitTidy()
  FuncExit(PID = res$PID)
```

InitViz

Initialize ExpoViz module

# **Description**

Initialize ExpoViz module analysis. It can generate an R6 class object integrating all the analysis information.

# Usage

InitViz()

### **Details**

ExpoViz module is designed for the data visualization of different statistical and biological analyses in a user friendly and easy way, including four typical classes of visualization.

### Value

An R6 class object.

### Author(s)

Ning Gao, Bin Wang (corresponding author)

```
res <- InitViz()
```

LoadBioLink 31

| LoadBioLink | Load data file for BioLink module |
|-------------|-----------------------------------|
|             |                                   |

# **Description**

Load data file for BioLink module

# Usage

```
LoadBioLink(PID, UseExample = "default", DataPath=NULL)
```

# Arguments

PID chr. Program ID. It must be the same with the PID generated by InitBioLink.

UseExample chr. Method of uploading data. If "default", user should upload their own data

files, or use "example#1" provided by this module.

DataPath chr. Input file directory, e.g. "D:/test/eg\_biolink.xlsx". It should be noted that

the slash symbol is "/", not "\"

### Value

An R6 class object containing the input data.

### Author(s)

Mingliang Fang, Bin Wang (corresponding author)

# **Examples**

```
res <- InitBioLink()
  res = LoadBioLink(PID = res$PID, UseExample = "example#1")</pre>
```

LoadCros

Load data file for ExpoCros module

# **Description**

Load data file for ExpoCros module.

# Usage

```
LoadCros(PID, UseExample = "default", DataPath=NULL, VocaPath=NULL)
```

32 LoadDb

### Arguments

PID chr. Program ID. It must be the same with the PID generated by ExpoCros

UseExample chr. Method of uploading data. If "default", user should upload their own data

files, or use "example#1" provided by this module.

DataPath chr. Input directory of data file, e.g. "D:/test/eg\_data\_expocros.xlsx". It should

be noted that the slash symbol is "/", not "\".

VocaPath chr. Input directory of vocabulary file, e.g. "D:/test/eg\_voca\_expocros.xlsx". It

should be noted that the slash symbol is "/", not "\".

### Value

An R6 class object containing the input data.

### Author(s)

Bin Wang

# **Examples**

```
res <- InitCros()
  res1 = LoadCros(PID = res$PID, UseExample = "example#1")
  FuncExit(PID = res$PID)</pre>
```

LoadDb

Load data file for ExpoDB module

### Description

Load data file for ExpoDB module

### Usage

```
LoadDb(PID, UseExample = "default", DataPath=NULL)
```

# **Arguments**

PID chr. Program ID. It must be the same with the PID generated by ExpoDB

UseExample chr. Method of uploading data. If "default", user should upload their own data

files, or use "example#1" provided by this module.

DataPath chr. Input directory of data file, e.g. "D:/test/eg\_data\_biolink.xlsx". It should be

noted that the slash symbol is "/", not "\".

### Value

An R6 class object containing the input data.

LoadMedt 33

#### Author(s)

Bin Wang

# **Examples**

```
res <- InitDb()
  res1 = LoadDb(PID = res$PID, UseExample = "example#1")
  FuncExit(PID = res$PID)</pre>
```

LoadMedt

Load data file for Mediation module

### **Description**

Load data file for Mediation module

### Usage

```
LoadMedt(PID, UseExample = "default", DataPath = NULL, VocaPath = NULL)
```

# **Arguments**

PID chr. Program ID. It must be the same with the PID generated by InitMedt.

UseExample chr. Method of uploading data. If "default", user should upload their own data

files, or use "example#1" provided by this module.

DataPath chr. Input data file directory, e.g. "D:/test/eg\_Medt\_data.xlsx". It should be

noted that the slash symbol is "/", not "\".

VocaPath chr. Input vocabulary file directory, e.g. "D:/test/eg\_Medt\_data.xlsx". It should

be noted that the slash symbol is "/", not "\".

### **Details**

LoadMedt function loads the data file and the vocabulary file into the R6 object that InitMedt created. Noted that there are several data format requirments for the data and vocabulary file. For data file, the first three column must be named as "SampleID", "SubjectID" and "Group" in sequence. The "Gourp" variable should be a character variable to category data into two groups: "train" and "test" group. Outcome variables should be named as "Y\*". e.g., Y1, Y2, Y3... Similarly, exposure variables should be named as "X\*". e.g., X1, X2, X3..., and mediator variables should be named as "M\*". e.g., M1, M2, M3... For vocabulary file, the first column should be a character variable named "SerialNo" indicating the names of outcome, exposure and mediator variables in the data file. These names should be consistent with the variable names in data file. The second column should be a character variable named "FullName" indicating the full names (labels) of the variables. The third column should be a character variable named "SubgroupName" indicating the groups the exposure or mediator variables belong to.

34 LoadMeta

#### Value

An R6 class object containing the input data and vocabulary file.

#### Author(s)

Mengyuan Ren, Bin Wang(corresponding author)

### **Examples**

```
res <- InitMedt()
  res1 <- LoadMedt(PID = res$PID, UseExample = "example#1", DataPath = NULL,
  VocaPath = NULL)</pre>
```

LoadMeta

Load Data for ExpoMeta Module

# **Description**

Upload local data file for ExpoMeta Module.

### Usage

```
LoadMeta(PID, UseExample = "default", DataPath = NULL)
```

# **Arguments**

PID chr. Program ID. It must be the same with the PID generated by InitMeta.

UseExample chr. A character indicates whether uses example data for analyses, available

option include "example#1" for using example data1 and "default" for using

data uploaded.

DataPath chr. Input file directory, e.g. "D:/test/eg\_meta.xlsx". It should be noted that the

slash symbol is "/", not "\".

#### Details

After initializing ExpoMeta module, the second step is to upload local data file for ExpoMeta Module. Set param "UseExample = 'example#1'" to use example data1. LoadMeta can only run successfully after successfully running InitMeta. Please attention, PID must be got from the return result of InitMeta().

#### Value

An R6 class object containing the input data.

# Author(s)

Weinan Lin, Bin Wang (corresponding author)

LoadMix 35

### **Examples**

```
res <- InitMeta()
  res1 <- LoadMeta(PID = res$PID, UseExample = "example#1", DataPath = NULL)</pre>
```

LoadMix

Load data file for ExpoMixEffect module

# **Description**

Load data file for ExpoMixEffect module

### Usage

```
LoadMix(PID, UseExample = "default", DataPath = NULL, VocaPath = NULL)
```

# Arguments

chr. Program ID. It must be the same with the PID generated by ExpoMixEffect

chr. Method of uploading data. If "default", user should upload their own data files, or use "example#1" provided by this module.

DataPath

chr. Input directory of data file, e.g. "D:/test/eg\_data\_biolink.xlsx". It should be

noted that the slash symbol is "/", not "\".

VocaPath chr. Input directory of vocabulary file, e.g. "D:/test/eg\_voca\_biolink.xlsx". It

should be noted that the slash symbol is "/", not "\".

### Value

An R6 class object containing the input data.

# Author(s)

Bin Wang

```
res <- InitMix()
  res = LoadMix(PID = res$PID, UseExample = "example#1")</pre>
```

36 LoadNTA

| LoadM0 | Load data file for multiomics module |  |
|--------|--------------------------------------|--|
|        |                                      |  |

### **Description**

Upload data file for multiomics module.

# Usage

```
LoadMO(PID, UseExample= "default", DataPath, VocaPath)
```

### **Arguments**

PID chr. Program ID. It must be the same with the PID generated by InitMo.

UseExample chr. Method of uploading data. If "default", user should upload their own data

files, or use "example#1" provided by this module.

DataPath chr. Input file directory, e.g. "D:/test/eg\_data.xlsx". It should be noted that the

slash symbol is "/", not "\".

VocaPath chr. Input file vocabulary, e.g. "D:/test/eg\_voca.xlsx". It should be noted that

the slash symbol is "/", not "\".

### Value

An R6 class object containing the input data.

### Author(s)

Guohuan Zhang, Yuting Wang, Bin Wang (corresponding author)

# **Examples**

```
res <- InitMO()
res <- LoadMO(PID=res$PID, UseExample = "example#1", DataPath = NULL, VocaPath = NULL)</pre>
```

LoadNTA

Load data file for ExpoNTA module

### **Description**

Load data file for ExpoNTA module

### Usage

```
LoadNTA(PID, UseExample = "default", DataPath=NULL, VocaPath=NULL)
```

LoadPanel 37

## Arguments

PID chr. Program ID. It must be the same with the PID generated by ExpoNTA

UseExample chr. Method of uploading data. If "default", user should upload their own data

files, or use "example#1" provided by this module.

DataPath chr. Input directory of data file, e.g. "D:/test/eg\_data\_biolink.xlsx". It should be

noted that the slash symbol is "/", not "\".

VocaPath chr. Input directory of vocabulary file, e.g. "D:/test/eg\_voca\_biolink.xlsx". It

should be noted that the slash symbol is "/", not "\".

#### Value

An R6 class object containing the input data.

### Author(s)

Mingliang Fang, Bin Wang (corresponding author)

# **Examples**

```
res <- InitNTA()
  res = LoadNTA(PID = res$PID, UseExample = "example#1")</pre>
```

LoadPanel

Load data file for ExpoPanel module

### **Description**

Load data file for ExpoPanel module

### Usage

```
LoadPanel(PID, UseExample = "default", DataPath=NULL, VocaPath=NULL)
```

## **Arguments**

PID chr. Program ID. It must be the same with the PID generated by ExpoPanel

UseExample chr. Method of uploading data. If "default", user should upload their own data

files, or use "example#1" provided by this module.

DataPath chr. Input directory of data file, e.g. "D:/test/eg\_data\_biolink.xlsx". It should be

noted that the slash symbol is "/", not "\".

VocaPath chr. Input directory of vocabulary file, e.g. "D:/test/eg\_voca\_biolink.xlsx". It

should be noted that the slash symbol is "/", not "\".

### Value

An R6 class object containing the input data.

38 LoadStat

### Author(s)

Bin Wang

# **Examples**

```
res <- InitPanel()
  res = LoadPanel(PID = res$PID, UseExample = "example#1")</pre>
```

LoadStat

Upload data file for ExpoStat Module

# Description

Upload data file for ExpoStat Module

## Usage

```
LoadStat(PID, UseExample = "default", DataPath = NULL, VocaPath = NULL)
```

# **Arguments**

PID chr. Program ID. It must be the same with the PID generated by InitStat.

UseExample chr. Whether uses example data for analyses, available option include "exam-

ple#1" for using example data1 and "default" for using data.

DataPath chr. Input file directory, e.g. "D:/test/expostat\_data.xlsx". It should be noted

that the slash symbol is "/", not "\".

VocaPath chr. Input file directory, e.g. "D:/test/expostat\_voca.xlsx". It should be noted

that the slash symbol is "/", not "\".

### Value

A list object containing imported data.

## Author(s)

Yanqiu Feng, Bin Wang (corresponding author)

```
res = InitStat()
  res1 = LoadStat(PID = res$PID, UseExample = "example#1")
```

LoadStatLink 39

| LoadStatLink | Load data file for ExpoStatLink for module |  |
|--------------|--|--|
|              |  |  |

### **Description**

Load data file for ExpoStatLink module

# Usage

```
LoadStatLink(PID, UseExample = "default", DataPath=NULL, VocaPath=NULL)
```

#### **Arguments**

chr. Program ID. It must be the same with the PID generated by ExpoStatLink

chr. Method of uploading data. If "default", user should upload their own data files, or use "example#1" provided by this module.

DataPath

chr. Input directory of data file, e.g. "D:/test/eg\_data\_biolink.xlsx". It should be noted that the slash symbol is "/", not "\".

VocaPath

chr. Input directory of vocabulary file, e.g. "D:/test/eg\_voca\_biolink.xlsx". It should be noted that the slash symbol is "/", not "\".

### Value

An R6 class object containing the input data.

### Author(s)

Bin Wang

# **Examples**

```
res <- InitStatLink()
  res = LoadStatLink(PID = res$PID, UseExample = "example#1")</pre>
```

LoadSurv Load data file for Survival module

# **Description**

Load data file for Survival module

### Usage

```
LoadSurv( PID, UseExample = "default", DataPath=NULL, VocaPath=NULL)
```

40 LoadTidy

## Arguments

PID chr. Program ID. It must be the same with the PID generated by InitSurv.

UseExample chr. Method of uploading data. If "default", user should upload their own data

files, or use "example#1" provided by this module.

DataPath chr. Input data file directory, e.g. "D:/test/eg\_Surv\_data.xlsx". It should be

noted that the slash symbol is "/", not "\".

VocaPath chr. Input vocabulary file directory, e.g. "D:/test/eg\_Surv\_voca.xlsx". It should

be noted that the slash symbol is "/", not "\".

#### **Details**

LoadSurv function loads the data file and the vocabulary file into the R6 object that InitSurv created. Noted that there are several data format requirments for the data and vocabulary file. For data file, the first three columns should be named as "SampleID", "SubjectID", and "Group", respectively. For the "Group" variable, only two values can be used, i.e. "train" and "test". If there is no data for test, all values should be set as "train". For outcome variables, their initials must be set as "Y" and serialized by adding Arabic numerals if needed, e.g., Y1, Y2, Y3. In this module, the survival time (Y1) and status (Y2) must be provided. For exposure variables, their initials must be set as "X" and serialized by adding Arabic numerals if needed, e.g., X1, X2, X3. For covariate variables, their initials must be set as "C" and serialized by adding Arabic numerals if needed, e.g., C1, C2, C3. It should be noted the covariates are not required if users don't have. For vocabulary file, the first two columns must be named as "SerialNo" and "FullName", respectively. The list of SerialNo of outcomes, exposure, and covariates should be the same with the column names of "Data file". The list of the FullName is prepared as users' like.

#### Value

An R6 class object containing the input data and vocabulary file.

#### Author(s)

Changxin Lan, Bin Wang(corresponding author)

### **Examples**

```
res <- InitSurv()
  res1 <- LoadSurv(PID = res$PID, UseExample = "example#1", DataPath = NULL,
  VocaPath = NULL)</pre>
```

LoadTidy

Load data file for ExpoTidy module

# Description

Load data file for ExpoCros module

LoadViz 41

## Usage

```
LoadTidy(PID, UseExample = "default", DataPath=NULL, VocaPath=NULL)
```

### **Arguments**

PID chr. Program ID. It must be the same with the PID generated by ExpoCros

UseExample chr. Method of uploading data. If "default", user should upload their own data

files, or use "example#1" provided by this module.

DataPath chr. Input directory of data file, e.g. "D:/test/eg\_data\_biolink.xlsx". It should be

noted that the slash symbol is "/", not "\".

VocaPath chr. Input directory of vocabulary file, e.g. "D:/test/eg\_voca\_biolink.xlsx". It

should be noted that the slash symbol is "/", not "\".

### Value

An R6 class object containing the input data.

### Author(s)

Bin Wang

# **Examples**

```
res <- InitTidy()
  res = LoadTidy(PID = res$PID, UseExample = "example#1")
  FuncExit(PID = res$PID)</pre>
```

LoadViz

Load data file for ExpoViz module

# **Description**

Load data for visualization.

### Usage

```
LoadViz(PID, UseExample = "example#1", DataPath=NULL, VocaPath=NULL)
```

# **Arguments**

PID chr. Program ID. It must be the same with the PID generated by InitViz.

UseExample chr. Method of uploading data. If "default", user should upload their own data

files, or use "example#1" provided by this module.

DataPath chr. Input data file directory, e.g. "D:/test/eg\_expoviz\_data.xlsx". It should be

noted that the slash symbol is "/", not "\".

VocaPath chr. Input vocabulary file directory, e.g. "D:/test/eg\_expoviz\_voca.xlsx". It

should be noted that the slash symbol is "/", not "\".

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### Value

An R6 class object containing the input data.

### Author(s)

Ning Gao, Bin Wang (corresponding author)

# **Examples**

```
res = InitViz()
res1 = LoadViz(PID = res$PID, UseExample = "example#1")
```

MetaEffect

Pool Effect Value

# **Description**

Pool effect value in our meta database besed on chemical ID and disease ID

## Usage

```
MetaEffect(PID, OutPath = "default", CID = "default", DID = "default")
```

### **Arguments**

| PID chr. Program ID. It must be the same with the PID generated by InitMe |
|---|
|---|

OutPath chr. Output file directory, e.g. "D:/output". If "default", the current working

directory will be set. It should be noted that the slash symbol is "/", not "\".

CID chr. "default" or a chemical ID character (separate different values by ","). If

"default", the function will use the Chemical\_ID values in the file loaded by LoadMeta. If a character (separate different values by ","), the function will use the chemical ID in the character instead. Chemical\_ID refers to the target chemical ID which can be inchikey (eg. JIAARYAFYJHUJI-UHFFFAOYSA-L

), cas.rn (eg. 7784-42-1) or our EXC ID (eg. EX:C01631).

DID chr. "default" or a disease ID character (separate different values by ","). If "de-

fault", the function will use the Disease\_ID values in the file loaded by Load-Meta. If a character (separate different values by ","), the function will use the disease ID in the character instead. Disease\_ID refers to the target disease ID which can be MESH ID (format like MESH:D006973), OMIM ID (format like

OMIM:182940) or our EXD ID (eg. EX:D16243)

MetaRefer 43

#### **Details**

MetaEffect provides the functions of effect value pooling. In the publishd papers, what is the effect value between X and Y? This questions can be solved by MetaEffect function. It can provide the combined results of fixed effect model and random effect model. (It can only search the papers available in ExpoMeta database DB\_Meta) Please attention, PID must be got from the return result of InitMeta(). MetaEffect can only run successfully after successfully running InitMeta and LoadMeta functions.

#### Value

A list object containing forest plots.

#### Author(s)

Weinan Lin, Bin Wang (corresponding author)

### **Examples**

```
res <- InitMeta()
  res1 <- LoadMeta(PID = res$PID,
  UseExample = "example#1",
  DataPath = NULL)
  res2 <- MetaEffect(PID=res$PID,
  OutPath = "default",
  CID = "default",
  DID = "default")</pre>
```

MetaRefer

Search or Download Articles' Main Information

## Description

Search or download articles' main information based on keywords.

#### Usage

```
MetaRefer(PID, OutPath = "default", Mode = "search",
    VarX = "default", VarY = "default", VarM = "default", YearFrom = "default",
    YearEnd = "default", PMID = "default")
```

## **Arguments**

PID chr. Program ID. It must be the same with the PID generated by InitMeta.

OutPath chr. Output file directory, e.g. "D:/output". If "default", the current working

directory will be set. It should be noted that the slash symbol is "/", not "\".

Mode chr. Two modes are provided. "Search" for paper retrieval by keywords VarX/VarY/VarM/YearFrom/Year

and "Download" for downloading information (main information only) for spec-

ified PMID.

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| VarX     | chr. "default" or a chemical names character (separate different values by ","). If "default", the function will use the VarX values in the file loaded by LoadMeta. If a character (separate different values by ","), the function will use the chemical names in the character instead.                                       |
|----------|--|
| VarY     | chr. "default" or a disease names character (separate different values by ","). If "default", the function will use the VarY values in the file loaded by LoadMeta. If a character (separate different values by ","), the function will use the disease names in the character instead.   |
| VarM     | chr. "default" or a mediating factor names character (separate different values by ","). If "default", the function will use the VarM values in the file loaded by LoadMeta. If a character (separate different values by ","), the function will use the mediating factor names in the character instead.                       |
| YearFrom | chr. "default" or a year character (separate different values by ","). Limits the time range searched for "search" mode. If "default", the function will use the YearFrom values in the file loaded by LoadMeta. If a character (separate different values by ","), the function will use the YearFrom in the character instead. |
| YearEnd  | chr. "default" or a year character (separate different values by ","). Limits the time range searched for "search" mode. If "default", the function will use the YearEnd values in the file loaded by LoadMeta. If a character (separate different values by ","), the function will use the YearEnd in the character instead.   |
| PMID     | chr. "default" or a PMID character (separate different values by ","). Refers to the papers PMID for "download" mode. If "default", the function will use the PMID values in the file loaded by LoadMeta. If a character (separate different values by ","), the function will use the PMIDs in the character instead.           |

### **Details**

MetaRefer provides the functions of paper retrieval and relevance sorting, returning the information to the user based on keywords. Please attention, PID must be got from the return result of InitMeta(). MetaRefer can only run successfully after successfully running InitMeta and LoadMeta functions.

### Value

A list object containing dataframe of articles' information.

## Author(s)

Weinan Lin, Bin Wang (corresponding author)

```
res <- InitMeta()</pre>
   res1 <- LoadMeta(PID = res$PID, UseExample = "example#1", DataPath = NULL)</pre>
   res2 <- MetaRefer(PID = res$PID, OutPath = "default", Mode = "search",</pre>
   VarX = "default", VarY = "default", VarM = "default", YearFrom = "default",
   YearEnd = "default", PMID = "default")
```

MetaReview 45

| MetaReview | Review Relationship Between Exposure and Outcome |  |
|------------|--|--|
|            |  |  |

# Description

Review the relationship between exposure and outcome besed on chemical ID and disease ID.

# Usage

```
MetaReview(PID, OutPath = "default", CID = "default", DID = "default")
```

# **Arguments**

| PID<br>OutPath | chr. Program ID. It must be the same with the PID generated by InitMeta. chr. Output file directory, e.g. "D:/output". If "default", the current working directory will be set. It should be noted that the slash symbol is "/", not "\".   |
|----------------|---|
| CID            | chr. "default" or a chemical ID character (separate different values by ","). If "default", the function will use the Chemical_ID values in the file loaded by LoadMeta. If a character (separate different values by ","), the function will use the chemical ID in the character instead. Chemical_ID refers to the target chemical ID which can be inchikey (eg. JIAARYAFYJHUJI-UHFFFAOYSA-L), cas.rn (eg. 7784-42-1) or our EXC ID (eg. EX:C01631). |
| DID            | chr. "default" or a disease ID character (separate different values by ","). If "default", the function will use the Disease_ID values in the file loaded by Load-Meta. If a character (separate different values by ","), the function will use the disease ID in the character instead. Disease_ID refers to the target disease ID which can be MESH ID (format like MESH:D006973), OMIM ID (format like OMIM:182940) or our EXD ID (eg. EX:D16243)   |

# Details

MetaReview provides the functions of literature review. In the publishd papers, how many recorded that X is a protective/risky factor for Y? This questions can be solved by MetaReview function. (It can only search the papers available in our database) Please attention, PID must be got from the return result of InitMeta(). MetaReview can only run successfully after successfully running InitMeta and LoadMeta functions.

#### Value

A list object containing relationship visualization.

### Author(s)

Weinan Lin, Bin Wang (corresponding author)

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# **Examples**

```
res <- InitMeta()
  res1 <- LoadMeta(PID = res$PID,
  UseExample = "example#1",
  DataPath = NULL)
  res2 <- MetaReview(PID = res$PID,
  OutPath = "default",
  CID = "default",
  DID = "default")</pre>
```

MixBKMR

Build the Bayesian Kernel Machine Regression (BKMR) model

# **Description**

Build the Bayesian Kernel Machine Regression (BKMR) model

# Usage

```
MixBKMR(PID, OutPath = "default", VarsY, VarsX, IncCova,
    Family, Group = F, Iter = 2000, qfixed = 0.5, qsbivar = "default",
    qsoverall = "default", qsdiff = "default")
```

| PID     | chr. Program ID. It must be the same with the PID generated by ExpoMixEffect   |
|---------|--|
| OutPath | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.   |
| VarsY   | chr. Outcome variable used for modeling. Only one variable can be entered.   |
| VarsX   | chr. Exposure variable used for modeling. The default option is "all.x" (All exposure variables are included). Users can also choose available variables. It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., "X1,X2,X3" |
| IncCova | lgl. T (or TRUE) and F (or FALSE). Whether to include the covariate selected in the function "FindCovaMix"   |
| Family  | chr. The link function for the regression model according the data type of outcomes, including "gaussian" for continuous variable, "binomial" for binary variable, and "poisson" for counting variable   |
| Group   | lgl. T (or TRUE) and F (or FALSE). Whether to use group indicators for fitting hierarchical variable selection. If "TRUE", the group name (GroupName) should be provided in the vocabulary data file.  |
| Iter    | num. Number of iterations for modeling. The default is 500. For more accurate and stable results, a minimum of 10,000 iteration is recommended.  |
| qfixed  | num. Quantile at which to fix the other predictors. The default is 0.5.  |

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qsbivar chr. Quantiles at which to fix the second variable. It should be noted that there

is fixed format for the entering characters separated with comma and without

space, e.g., the default character sequence is "0.1,0.5,0.9"

num. Quantiles at which to calculate the overall risk summary. It should be qsoverall

noted that there is fixed format for the entering characters separated with comma

and without space, e.g., the default character sequence is "0.25,0.30,0.35,0.40,0.45,0.50,0.55,0.60,0.65,0.7

qsdiff chr. Indicating the two quantiles for computing their effect difference. It should

be noted that there is fixed format for the entering characters separated with comma and without space, e.g., the default character sequence is "0.25,0.75".

#### Value

A list containing the BKMR analysis results.

#### Author(s)

Bin Wang

### **Examples**

```
res <- InitMix()</pre>
   res1 = LoadMix(PID = res$PID, UseExample = "example#1")
   res2 = MixBKMR(PID = res$PID, VarsY = "Y1", VarsX = "X4,X5,X6,X7,X8,X9,X10",
 IncCova = 'F', Family = "gaussian", Group = 'F', Iter = 2000, qfixed = 0.5, qsbivar = "default",
   qsoverall = "default",qsdiff = "default")
```

MixMLR

Build multiple linear regression (MLR) model

#### **Description**

Build multiple linear regression (MLR) model

### Usage

```
MixMLR(PID,OutPath = "default", VarsY, VarsX, IncCova = "F",
    SelMethod = "lasso",PredType = "response",Family)
```

# **Arguments**

PID chr. Program ID. It must be the same with the PID generated by ExpoMixEffect **OutPath** chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set. VarsY chr. Outcome variable used for modeling. Only one variable can be entered. VarsX chr. Exposure variable used for modeling. The default option is "all.x" (All

exposure variables are included). Users can also choose available variables. It should be noted that there is fixed format for the entering characters separated

with comma and without space, e.g., "X1,X2,X3"

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IncCova lgl. T (or TRUE) and F (or FALSE). Whether to include the covariate selected

in the function "FindCovaMix"

SelMethod chr. Method to select the important features to the final model. Options include

"stepwise" (stepwise regression), "lasso" (Regularization regression of least absolute shrinkage and selection operator), and "enet" (Regularization regression

of elastic net).

PredType chr. Prediction type of the outcome variable, including "response" for the actual

values and "prob" for outcome with binary variable.

Family chr. The link function for the regression model according the data type of out-

comes, including "gaussian" for continuous variable, "binomial" for binary vari-

able, and "poisson" for counting variable

#### Value

A list containing the MLR analysis.

#### Author(s)

Bin Wang

## **Examples**

```
res <- InitMix()
  res1 = LoadMix(PID = res$PID, UseExample = "example#1")
  res2 = MixMLR(PID = res$PID, VarsY = "Y1", VarsX = "all.x", IncCova = "F",
  SelMethod = "lasso", PredType = "response", Family = "gaussian")</pre>
```

MixWQS

Build weighted quantile sum regression (WQS) model

## **Description**

Build weighted quantile sum regression (WQS) model

#### Usage

```
MixWQS(PID, OutPath = "default", VarsY, VarsX, IncCova = "F", Family,
VarStrat = "none", RatioValidat = 0.3,q = 10,b = 100,b1_pos = F,b1_constr = F)
```

### **Arguments**

PID chr. Program ID. It must be the same with the PID generated by ExpoMixEffect

OutPath chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol

is "/", not "\". If "default", the current working directory will be set.

VarsY chr. Outcome variable used for modeling. Only one variable can be entered.

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| VarsX        | chr. Exposure variable used for modeling. The default option is "all.x" (All exposure variables are included). Users can also choose available variables. It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., "X1,X2,X3" |
|--------------|--|
| IncCova      | lgl. T (or TRUE) and F (or FALSE). Whether to include the covariate selected in the function "FindCovaMix" $$  |
| Family       | chr. The link function for the regression model according the data type of outcomes, including "gaussian" for continuous variable, "binomial" for binary variable, and "poisson" for counting variable.  |
| VarStrat     | chr. A factor variable used for stratifying for the model.   |
| RatioValidat | num. Percentage of the dataset to be used to validate the model. If validation = 0 then the test dataset is used as validation dataset too. The default is 0.3.  |
| q            | num. Levels for ranking mixture variables, e.g. in quartiles $(q = 4)$ , deciles $(q = 10)$ , or percentiles $(q = 100)$ . The default is 10.  |
| b            | num. Number of bootstrap samples used in parameter estimation. The default is 100.   |
| b1_pos       | lgl. T (or TRUE) and F (or FALSE). Whether the beta values were positive to derive weights from to build models.   |
| b1_constr    | lgl. T (or TRUE) and F (or FALSE). A logial value that determines whether to apply positive (if $b1\_pos = TRUE$ ) or negative (if $b1\_pos = FALSE$ ) constraints in the optimization function for the weight estimation.   |

### Value

A list containing the WQS analysis results.

# Author(s)

Bin Wang

# Examples

```
res <- InitMix()
  res1 = LoadMix(PID = res$PID, UseExample = "example#1")
  res3 = MixWQS(PID=res$PID, VarsY = "Y1", VarsX = "all.x", IncCova = "F",
  Family = "gaussian", VarStrat = "none", RatioValidat = 0.3,
  q = 10, b=100, b1_pos = 'F', b1_constr = 'F')</pre>
```

MulOmicsCros

Build multiomics model

# Description

MulOmicsCros function is designed to integrate the multi-omic data to predict the incidence risk. It mainly aims to construct various stacked generalization models to predict the probability of outcome incidence, as well as providing the statistical explanation.

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#### Usage

#### **Arguments**

PID chr. Program ID. It must be the same with the PID generated by InitMo.

OutPath chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol

is "/", not "\". If "default", the current working directory will be set.

OmicGroups chr. Groups to be integrated. The groups of outcome and covariates or con-

founders are not included. Note that separates different learners by "," and with-

out space(e.g. OmicGroups = "immunome,metabolome,proteome").

VarsY chr. Outcome variable for modelling. Only one variable can be entered.

VarsC chr. Covariates needing further statistical test. "all.c" option refers to all covari-

ate variables listed in the data file. Users can also select part of them by copying available vars. Note that separates different vars by "," and without space(e.g.

VarsC = "C1,C2").

TuneMethod chr. Method for hyper-parameter autotuning. Options include "default", "ran-

dom\_search", "grid\_search", "nloptr"(Non-linear optimization), and "gensa"(Generalized

simulated annealing). The "default" option uses the simple training method for

parameter optimization of mlr3 package.

TuneNum num. Upper limit of model tuning times. It should be more than 20 times to

search the appropriate parameters, but it takes more time. In theory, more time,

better training results.

RsmpMethod chr. Method for resampling. Options include "cv" (cross validation), "loo" (leave-

one-out cross validation), "bootstrap" (bootstrapping), "holdout" (holdout).

Folds num. Folds for cross validation resampling method. The default value is 5.

Ratio num. Ratio for "Holdout" resampling method. The default value is 5.

Repeats num. Repeats for "Bootstrap" resampling method.

VarsImpThr num. Threshold for feature selection. It refers to the ratio of accumulated im-

portance of all variables of the selected variables for building the final model.

SG\_Lrns chr. Learners for stacked generalization. Options include "lasso", "enet"(Elastic

net), "rf"(Random forest), and "xgboost"(Xgboost). One or more arbitrary options can be selected at the same time. Note that separates different learners by

"," and without space(e.g. SG\_Lrns ="lasso,enet,rf,xgboost").

# **Details**

The calculation time depends on the characteristics of your data, the number of learning methods, and the tuning method. For parameter "TuneMethod", the default option can provide faster calculations but less accurate results than other autotune methods. If you want to train a better model, choose other auto-tune method and increase the number of tuning times.

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#### Value

An R6 class object containing eight elements. The elements of that object include: (1) "Importance": A list containing dataframes that contain the importance of features after modeling a single omic from different omicgroups. (2) "Feature": A list containing dataframes that contain the the coefficients or importance of selected features after modeling a single omic from different learners. (3) "Feature\_select": A list containing dataframes that contain the selected features after modeling a single omic from different learners. (4) "ModelStat": A list containing dataframes that contain the r-square value of the single omic model built by different learners. (5) "Prediction\_comp": A list containing dataframes that contain the prediction values of the SG model built by different combinations of learners. (6) "SGModel\_summary": A dataframe containing the r-square value of the SG model built by different combinations of learners. (7) "NodeNum": The node number generated by different models. (8) "SGplot": A visualized plot for SG model summary.

#### Author(s)

Guohuan Zhang, Yuting Wang, Bin Wang (corresponding author)

# **Examples**

```
res <- InitMO()
res <- LoadMO(PID=res$PID, UseExample = "example#1", DataPath = NULL, VocaPath = NULL)
res2 <- MulOmicsCros(PID=res$PID, OutPath = "default", OmicGroups = "immunome, metabolome, proteome",
VarsY = "Y1", VarsC = "all.c", TuneMethod = "random_search", TuneNum = 5, RsmpMethod = "cv", Folds = 5,
Ratio = 0.67, Repeats = 5, VarsImpThr = 0.85, SG_Lrns = "lasso, enet, rf, xgboost")</pre>
```

NtaAnno

Annotate the non-targeted features

#### **Description**

Annotate the non-targeted features

### Usage

```
NtaAnno(PID, OutPath = "default", VarsY, VarsX = "default",
   VarsN = "single.factor", FdrCorrect = F, AdductPos = "all", AdductNeg = "all", Accuracy)
```

| PID     | chr. Program ID. It must be the same with the PID generated by ExpoNTA   |
|---------|--|
| OutPath | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.   |
| VarsY   | chr. Outcome variable used for modeling. Only one variable can be entered.   |
| VarsX   | chr. Exposure variable used for modeling. The default option is "all.x" (All exposure variables are included). Users can also choose available variables. It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., "X1,X2,X3" |

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VarsN chr. Choose the single factor or multiple factor model. Available options include

"single.factor" and "multiple.factor"

FdrCorrect lgl. T (or TRUE) and F (or FALSE). Whether to correct the multiple hypotheses

by false positive rate (FDR) method.

AdductPos chr. Adducts formed in the positive mode using LC-MS. The default is "all", i.e.,

all the adducts in positive mode will be chosen, including "M+3ACN+2H,M+ACN+H,M+NH4,M+2ACN H,M+ACN+Na,M+H+Na, M+2K-H,M+H+NH4,2M+K,M+K,2M+NH4,2M+Na,M+2Na,M+DMSO+H,

AdductNeg chr. Adducts formed in the negative mode using LC-MS. The default is "all",

i.e., all the adducts in positive mode will be chosen, including "M+FA-H,M+Hac-H,M+Br,3M-H,2M+Hac-H,M+K-2H,2M+FA-H,M-H,M-H2O-H,M+Na-2H, M-

2H,M+TFA-H,M+Cl,M-3H,2M-H"

Accuracy num. Accuracy threshold to match the target compounds. The default is 1 ppm.

#### Value

A list containing non-target analysis results

#### Author(s)

Mingliang Fang, Bin Wang (corresponding author)

#### **Examples**

```
res <- InitNTA()
  res1 = LoadNTA(PID = res$PID, UseExample = "example#1")
  res2 = NtaCros(PID=res$PID, VarsY = "Y1", VarsX = "all.x",
  VarsN = "single.factor", FdrCorrect = TRUE, SelMethod = "all",
  StepwizeThr = 0.1, RF_ImpThr = 0.9, IncCova = "F", Family = "gaussian",
  RepMsr = "F", Corstr = "ar1")
  res3 = NtaAnno(PID=res$PID, VarsY = "Y1", VarsX = "default", VarsN = "single.factor",
  FdrCorrect = "F", AdductPos = "M+H", AdductNeg = "M-H", Accuracy = 1)</pre>
```

NtaCros

Association analysis

### Description

Association analysis for non-targeted data

### Usage

```
NtaCros(PID,OutPath = "default", VarsY, VarsX = "all.x",
   VarsN = "single.factor", FdrCorrect = T, SelMethod = "all", StepwizeThr = 0.1,
   RF_ImpThr = 0.9, IncCova = F, Family, RepMsr = F, Corstr= "ar1")
```

NtaCros 53

# Arguments

| PID         | chr. Program ID. It must be the same with the PID generated by ExpoNTA   |
|-------------|--|
| OutPath     | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.   |
| VarsY       | chr. Outcome variable used for modeling. Only one variable can be entered.   |
| VarsX       | chr. Exposure variable used for modeling. The default option is "all.x" (All exposure variables are included). Users can also choose available variables. It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., "X1,X2,X3" |
| VarsN       | chr. Choose the single factor or multiple factor model. Available options include "single.factor" and "multiple.factor"  |
| FdrCorrect  | lgl. T (or TRUE) and F (or FALSE). Whether to correct the multiple hypotheses by false positive rate (FDR) method.   |
| SelMethod   | chr. Methods to select the significant features. Options include "stepwise" (multiple linear regress using stepwise algorithm), "lasso" (multiple linear regress using LASSO regularization algorithm), "random.forest" (random forest), and "all" (combination of the above three method)   |
| StepwizeThr | num. Threshold of the P value for stepwise regression to screen important variables. It ranges 0.05-0.25 with the default value of 0.1.  |
| RF_ImpThr   | num. Threshold of the total importance for the variables to a random forest model. It ranges 0.5-1.0 with the default value of 0.9.  |
| IncCova     | lgl. T (or TRUE) and F (or FALSE). Whether to include the covariate selected in the step of "FindCovaNta".   |
| Family      | chr. The link function for the regression model according the data type of outcomes, including "gaussian" for continuous variable, "binomial" for binary variable, and "poisson" for counting variable   |
| RepMsr      | lgl. T (or TRUE) and F (or FALSE). Whether existing repeated measurement of the subjects.  |
| Corstr      | chr. If "RepMsr" = T, the generalized estimating equations (GEE) will be used. For GEE, three correlation structure options are "exchangeable" "ar1" "unstructured".   |

# Value

A list containing non-target analysis association results

# Author(s)

Mingliang Fang, Bin Wang (corresponding author)

```
res <- InitNTA()
  res1 = LoadNTA(PID = res$PID, UseExample = "example#1")
  res2 = NtaCros(PID=res$PID, VarsY = "Y1", VarsX = "all.x",</pre>
```

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```
VarsN = "single.factor", FdrCorrect = T, SelMethod = "all",
StepwizeThr = 0.1, RF_ImpThr = 0.9, IncCova = "F", Family = "gaussian",
RepMsr = "F", Corstr = "ar1")
```

Pairwise

Implement pairwise mediation analyses

# **Description**

Implement pairwise mediation analyses for each pair of exposure and mediator.

# Usage

# Arguments

| PID     | chr. Program ID. It must be the same with the PID generated by InitMedt.   |
|---------|--|
| OutPath | chr. Output file directory, e.g. "D:/output". If "default", the current working directory will be set.It should be noted that the slash symbol is "/", not "\".  |
| VarsY   | chr. The outcome variable. Either continuous, binary or count type is permitted.   |
| VarsX   | chr. Exposure variables included in pairwise mediation modelling. When "default" is specified, all exposure variables in the data will be used. It should be noted that there is fixed format for the characters separated with comma and without space, e.g., "X1,X2,X3". |
| VarsM   | chr. Mediator variables included in pairwise mediation modelling. When "default" is specified, all mediator variables in the data will be used. It should be noted that there is fixed format for the characters separated with comma and without space, e.g., "M1,M2,M3". |
| VarsC   | chr. Covariates included in pairwise mediation modelling. When "default" is specified, all covariates in the data will be used. It should be noted that there is fixed format for the characters separated with comma and without space, e.g., "C1,C2".                    |
| Family  | chr. The error distribution and link function to be used in the model. Available options include "linear" and "gaussian" for continuous outcome variables, and "binomial" as well as "poisson" options for binary and count outcome variables.                             |
| Iter    | num. The number of iteration times. Default is 500. To get a more stable result, a minimum iteration of 1,000 is recommended. To obtain more digits of P value of parameter estimation, a minimum iteration of 5,000 is suggested.   |

# **Details**

Pairwise function implements mediation modelling for each pair of exposure and mediator. Given M exposures and N mediators, an exhaustive rule will be executed and M\*N pair-wised mediation modelling are fitted. The modelling was realized using mediate function in mediation package.

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# Value

A list containing one dataframe that contains the pairwise mediation modelling results.

1. "MedtPairWise\_Stats": pairwise mediation modelling results.

# Author(s)

Mengyuan Ren, Bin Wang(corresponding author)

## **Examples**

```
res <- InitMedt()
res1 <- LoadMedt(PID = res$PID, UseExample = "example#1", DataPath = NULL,
VocaPath = NULL)
res2 <- XMlists(PID = res$PID)
res3 <- Pairwise(PID=res$PID, VarsY = "Y1",
VarsX = "default", VarsM = "default", VarsC = "default", Family = "linear",
Iter = 500)
res4 <- Pairwise(PID=res$PID, VarsY = "Y1",
VarsX = "X1,X2,X3", VarsM = "M1,M2,M3", VarsC = "C1", Family = "linear",
Iter = 500)</pre>
```

PanelAsso

Association analysis of panel data

# Description

Association analysis of panel data

# Usage

```
PanelAsso(PID, OutPath = "default", VarsY, VarsX, VarsN = "single.factor",
    VarsRandomIpt = "SubjectID", VarsRandomSlp = "none", IncCova = F)
```

| PID     | chr. Program ID. It must be the same with the PID generated by ExpoPanel   |
|---------|--|
| OutPath | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.   |
| VarsY   | chr. Outcome variable used for modeling. Only one variable can be entered.   |
| VarsX   | chr. Exposure variable used for modeling. The default option is "all.x" (All exposure variables are included). Users can also choose available variables. It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., "X1,X2,X3" |
| VarsN   | chr. Choose the single factor or multiple factor model. Available options include "single.factor" and "multiple.factor"  |

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VarsRandomIpt chr. Random intercept variable for the linear mixed-effect model. The default is

"SubjectID".

VarsRandomSlp chr. Random slope variable for the linear mixed-effect model. The default is

"none". It should be noted that there is fixed format for the entering characters

separated with comma and without space, e.g., "X1,X2,X3"

IncCova lgl. T (or TRUE) and F (or FALSE). Whether to include the covariate(s) selected

in the function "FindCovaPanel"

#### Value

A list containing the association analysis results.

### Author(s)

Bin Wang

#### **Examples**

```
res <- InitPanel()
  res1 = LoadPanel(PID = res$PID, UseExample = "example#1")
  res2 = PanelAsso(PID=res$PID, VarsY = "Y1",
  VarsX = "X1,X2,X3,X4,X5,X6,X7,X8,X9,X10,X11,X12", VarsN = "single.factor",
  VarsRandomIpt = "SubjectID", VarsRandomSlp = "none", IncCova = F)</pre>
```

RedM

Mediator dimension reduction

## Description

Implement mediator dimension reduction for mediators.

### Usage

# **Arguments**

PID chr. Program ID. It must be the same with the PID generated by InitMedt.

OutPath chr. Output file directory, e.g. "D:/output". If "default", the current working

directory will be set.It should be noted that the slash symbol is "/", not "\".

VarsY chr. The outcome variable. Either continuous, binary or count type is permitted.

VarsX chr. Exposure variables included in mediation modelling. When "default" (recommended)

is specified, all exposure variables in the data will be used. It should be noted that there is fixed format for the characters separated with comma and without

space, e.g., "X1,X2,X3".

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| VarsC  | chr. Covariates included in mediation modelling. When "default" is specified, all covariates in the data will be used. It should be noted that there is fixed format for the characters separated with comma and without space, e.g., "C1,C2".      |
|--------|---|
| Method | chr. Dimension reduction method. Available options include "mean" and "pdm1" (default). "mean" option is recommended when outcome variable is a binary variable because in some situations error might occur in "pdm1" settings for binary outcome. |
| Family | chr. The error distribution and link function to be used in the model. Available options include "linear" and "gaussian" for continuous outcome variables, and "binomial" as well as "poisson" options for binary and count outcome variables.      |
| Iter   | num. The number of iteration times. Default is 500. To get a more stable result, a minimum iteration of 1,000 is recommended. To obtain more digits of P value of parameter estimation, a minimum iteration of 5,000 is suggested.                  |

#### **Details**

RedM function provides two alternative methods for mediator dimension reduction, including sum method as well as pdm1 method via PDM package. By default, all mediators will be included for dimension reduction. Afterwards, mediation models will be built between given exposures as well as shrinkaged mediator variables.

### Value

A list containing two elements where the mediator dimension reduction modelling results with exposures are stored. That list include:

- "MedtRedM\_all": a dataframe containing the mediator dimension reduction result where all
  mediators are considered as one group and that shrinkaged mediator is paired and modelled
  with each exposure.
- "MedtRedM\_list": a dataframe containing the mediator dimension reduction result where mediators are shrinkaged in their own subgroups, and these shrinkaged mediators are paired and modelled with each exposure.

### Author(s)

Mengyuan Ren, Bin Wang(corresponding author)

```
res <- InitMedt()
res1 <- LoadMedt(PID = res$PID, UseExample = "example#1", DataPath = NULL,
VocaPath = NULL)
res2 <- XMlists(PID = res$PID)
res3 <- RedM(PID=res$PID, VarsY = "Y1", VarsX = "default",
VarsC = "default", Method = "mean", Family = "linear", Iter = 500)
res4 <- RedM(PID=res$PID, VarsY = "Y1", VarsX = "X1,X2,X3",
VarsC = "C1", Method = "mean", Family = "linear", Iter = 500)</pre>
```

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|--|

# Description

Implement dimension reduction for exposures.

# Usage

# **Arguments**

| PID     | chr. Program ID. It must be the same with the PID generated by InitMedt.  |
|---------|---|
| OutPath | chr. Output file directory, e.g. "D:/output". If "default", the current working directory will be set.It should be noted that the slash symbol is "/", not "\".   |
| VarsY   | chr. The outcome variable. Either continuous, binary or count type is permitted.  |
| VarsC   | chr. Covariates included in mediation modelling. When "default" is specified, all covariates in the data will be used. It should be noted that there is fixed format for the characters separated with comma and without space, e.g., "C1,C2".  |
| VarsM   | chr. Mediator variables included in pairwise mediation modelling. When "default" is specified, all mediator variables in the data will be used. It should be noted that there is fixed format for the characters separated with comma and without space, e.g., "M1,M2,M3".                      |
| Method  | chr. Dimension reduction method. Available options include "gcdnet" and "mean" (default). "mean" option is recommended when outcome variable is a binary variable because in some situations low variance of shrinkaged exposure variable might obtain in "gcdnet" settings for binary outcome. |
| Folds   | num. Number of cross validation for gcdnet method. Default is 10.   |
| Family  | chr. The error distribution and link function to be used in the model. Available options include "linear" and "gaussian" for continuous outcome variables, and "binomial" as well as "poisson" options for binary and count outcome variables.  |
| Iter    | num. The number of iteration times. Default is 500. To get a more stable result, a minimum iteration of 1,000 is recommended. To obtain more digits of P value of parameter estimation, a minimum iteration of 5,000 is suggested.  |
|         |   |

# **Details**

RedX function provides two alternative methods for exposure dimension reduction, including sum method as well as adaptive elastic net method via gcdnet package. By default, all exposures will be included for dimension reduction. Afterwards, mediation models will be built between given mediators as well as shrinkaged exposure variables.

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### Value

A list containing three elements where the exposure dimension reduction variables as well as their mediation modelling results with mediators are stored. That list include:

- 1. "MedtRedX\_ERSall": a dataframe containing the exposure dimension reduction result where all exposures are considered as one group (ERS\_All).
- 2. "MedtRedX\_ERSlist": a dataframe containing the exposure dimension reduction results where exposures are shrinkaged in their own subgroups.
- 3. "MedtRedX\_Stats": a dataframe containing the mediation modelling results where the shrinkaged exposure variables were paired with each mediator provided.

### Author(s)

Mengyuan Ren, Bin Wang(corresponding author)

### **Examples**

```
res <- InitMedt()
res1 <- LoadMedt(PID = res$PID, UseExample = "example#1", DataPath = NULL,
VocaPath = NULL)
res2 <- XMlists(PID = res$PID)
res3 <- RedX(PID=res$PID, VarsY = "Y1",
VarsC = "default", VarsM = "default", Method = "mean", Folds = 10,
Family = "linear", Iter = 500)
res4 <- RedX(PID=res$PID, VarsY = "Y1",
VarsC = "C1", VarsM = "M1,M2,M3", Method = "mean", Folds = 10,
Family = "linear", Iter = 500)</pre>
```

RedXM

Exposure and mediator dimension reduction

# Description

Implement exposure and mediator dimension reduction. It should be noted that the exposure dimension reduction result has been built by RedX function prior to using it.

### Usage

```
RedXM(PID, OutPath, VarsY, VarsC = "default", Method = "mean",
    Family, Iter = 500)
```

RedXM

# Arguments

| PID     | chr. Program ID. It must be the same with the PID generated by InitMedt.   |
|---------|--|
| OutPath | chr. Output file directory, e.g. "D:/output". If "default", the current working directory will be set.It should be noted that the slash symbol is "/", not "\".  |
| VarsY   | chr. The outcome variable. Either continuous, binary or count type is permitted.   |
| VarsC   | chr. Covariates included in mediation modelling. When "default" is specified, all covariates in the data will be used. It should be noted that there is fixed format for the characters separated with comma and without space, e.g., "C1,C2".     |
| Method  | chr. Dimension reduction method. Available options include "mean" and "pdm1"(default). "mean" option is recommended when outcome variable is a binary variable because in some situations error might occur in "pdm1" settings for binary outcome. |
| Family  | chr. The error distribution and link function to be used in the model. Available options include "linear" and "gaussian" for continuous outcome variables, and "binomial" as well as "poisson" options for binary and count outcome variables.     |
| Iter    | num. The number of iteration times. Default is 500. To get a more stable result, a minimum iteration of 1,000 is recommended. To obtain more digits of P value of parameter estimation, a minimum iteration of 5,000 is suggested.                 |

#### **Details**

RedXM function provides two alternative methods for mediator dimension reduction, including sum method as well as pdm1 method via PDM package. By default, all mediators will be included for dimension reduction. Afterwards, mediation models will be built between shrinkaged exposure variables as well as shrinkaged mediator variables. Prior to using RedXM, make sure that RedX function has been executed to obtain shrinkaged exposure variables.

### Value

A list containing two elements where the mediator dimension reduction modelling results with shrinkaged exposures are stored. That list include:

- "MedtRedXM\_all": a dataframe containing the mediator dimension reduction result where all mediators are considered as one group and that shrinkaged mediator is paired and modelled with shrinkaged exposures.
- "MedtRedXM\_list": a dataframe containing the mediator dimension reduction result where mediators are shrinkaged in their own subgroups, and these shrinkaged mediators are paired and modelled with shrinkaged exposures.

# Author(s)

Mengyuan Ren, Bin Wang(corresponding author)

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# **Examples**

```
res <- InitMedt()
res1 <- LoadMedt(PID = res$PID, UseExample = "example#1", DataPath = NULL,
VocaPath = NULL)
res2 <- XMlists(PID = res$PID)
res3 <- RedX(PID=res$PID, VarsY = "Y1",
VarsC = "default", VarsM = "default", Method = "mean", Folds = 10,
Family = "linear", Iter = 500)
res4 <- RedXM(PID=res$PID, VarsY = "Y1",
VarsC = "default", Method = "mean", Family = "linear", Iter = 500)
res5 <- RedXM(PID=res$PID, VarsY = "Y1",
VarsC = "C1", Method = "mean", Family = "linear", Iter = 500)</pre>
```

StatComp

Size comparison between groups

# **Description**

Size comparison between groups

# Usage

```
StatComp(PID, OutPath="default", Group, Task = "mean",
  Vars, VarsBy, Method = "wilcox", Layout = "density", Brightness = "dark" ,
  Palette = "default1")
```

| PID        | chr. Program ID. It must be the same with the PID generated by InitStat.  |
|------------|---|
| OutPath    | chr. Output file directory, e.g. "D:/ExpoStat/StatComp". It should be noted that the slash symbol is "/", not "\".If "default", the current working directory will be set.  |
| Group      | lgl. Whether to separate dataset into train and test data for normality test. The default is "TRUE".  |
| Task       | chr. Comparison task. At present, only the mean comparison is available.  |
| Vars       | chr. Target variables used for modelling. It should be noted that there is fixed format for the entering characters separated with "," and without space. The default values is "all" (all variables are included). |
| VarsBy     | chr. Variable used to group the observation for size comparison.  |
| Method     | chr. Comparison method. At present, only "wilcox" (Wilcoxon rank sum test) is available.  |
| Layout     | chr. Visualization layout. Available values include "column.points", "density".   |
| Brightness | chr. Visualization brightness. Available values include "light" and "dark".   |
| Palette    | chr. Visualization palette. Available values include "default1", "default2", "default3" and 5 journal option including "cell", "nature", "science", "lancet", "nejm".   |

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# Value

A list object containing the results of size comparisons between groups for variables and visualization of the results.

### Author(s)

Yanqiu Feng, Bin Wang (corresponding author)

# **Examples**

```
res = InitStat()
  res1 = LoadStat(PID = res$PID, UseExample = "example#1")
  res2 = StatComp(PID=res$PID, Group = T, Task = "mean", Vars = "X5,X6,X7,X8,X9",
  VarsBy = "Y1", Method = "wilcox", Layout = "density", Brightness = "dark",
  Palette = "default1")
```

StatCorr

Correlation analysis between variables

# **Description**

Correlation analysis between variables

# Usage

```
StatCorr(PID, OutPath="default", Group, VarsX, VarsY, VarsBy,
   Method = "spearman", Layout= "bubble", Brightness = "dark", Palette = "default1")
```

| PID     | chr. Program ID. It must be the same with the PID generated by InitStat.  |
|---------|---|
| OutPath | chr. Output file directory, e.g. "D:/ExpoStat/StatCorr". It should be noted that the slash symbol is "/", not "\".If "default", the current working directory will be set.  |
| Group   | lgl. Whether to separate dataset into train and test data for normality test. The default is "TRUE".  |
| VarsX   | chr. Target variables used for modelling. It should be noted that there is fixed format for the entering characters separated with "," and without space. The default values is "all.x" (all variables are included). |
| VarsY   | chr. Target outcome variables used for correlation analysis.  |
| VarsBy  | chr. Variable used to group the observation for correlation analysis.   |
| Method  | chr. Method for orrelation analysis. Available values include "spearman" (Spearman's rank correlation analysis) and "pearson" (Pearson correlation analysis).   |
| Layout  | chr. Visualization layout. Available values include "heatmap", "bubble", "matrix".  |

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Brightness chr. Visualization brightness. Available values include "light" and "dark".

Palette chr. Visualization palette. Available values include "default1", "default2", "default3" and 5 journal option including "cell", "nature", "science", "lancet", "neim".

#### Value

A list object containing the results of correlation analysis between variables and visualization of the

# Author(s)

Yanqiu Feng, Bin Wang (corresponding author)

## **Examples**

```
res = InitStat()
  res1 = LoadStat(PID = res$PID, UseExample = "example#1")
  res2 = StatCorr(PID = res$PID, Group = T, VarsX = "X5,X6,X7,X8,X9", VarsY = "Y1",
  VarsBy = "Y1", Method = "pearson", Layout = "bubble", Brightness = "dark",
  Palette = "nature")
```

StatDesc

Variable description

### **Description**

Variable description

# Usage

```
StatDesc(PID, OutPath="default", Group, Vars, VarsBy, Layout="box",
    Brightness="light", Palette="default1")
```

| PID     | chr. Program ID. It must be the same with the PID generated by InitStat.  |
|---------|---|
| OutPath | chr. Output file directory, e.g. "D:/ExpoStat/StatDesc". It should be noted that the slash symbol is "/", not "\".If "default", the current working directory will be set.  |
| Group   | lgl. Whether to separate dataset into train and test data for normality test. The default is "TRUE".  |
| Vars    | chr. Target variables used for modelling. It should be noted that there is fixed format for the entering characters separated with "," and without space. The default values is "all" (all variables are included). |
| VarsBy  | chr. Variable used to group the observation for size description.   |

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Layout chr. Visualization layout. Available values include "box", "violin".

Brightness chr. Visualization brightness. Available values include "light" and "dark".

Palette chr. Visualization palette. Available values include "default1", "default2" and 5 journal option including "cell", "nature", "science", "lancet", "nejm".

#### Value

A list object containing the results of variable description for continuous and discrete variables respectively and visualization of the continuous variables.

# Author(s)

Yanqiu Feng, Bin Wang (corresponding author)

## **Examples**

```
res = InitStat()
  res1 = LoadStat(PID = res$PID, UseExample = "example#1")
  res2 = StatDesc(PID = res$PID, Group = T, Vars = "C1,C2,X5,X6,X7,X8,X9",
  VarsBy = NULL, Layout = "box", Brightness = "dark", Palette = "default2")
```

StatExtre

Extreme value calculation

# **Description**

Extreme value calculation

### Usage

```
StatExtre(PID, OutPath="default", Group, Vars, LimitLow = 0.025,
   LimitUpper = 0.975, Layout = "column.points", Brightness = "light",
   Palette = "default2")
```

# Arguments

| PID      | chr. Program ID. It must be the same with the PID generated by InitStat.  |
|----------|---|
| OutPath  | chr. Output file directory, e.g. "D:/ExpoStat/StatExtre". It should be noted that the slash symbol is "/", not "\".If "default", the current working directory will be set.   |
| Group    | lgl. Whether to separate dataset into train and test data for normality test. The default is "TRUE".  |
| Vars     | chr. Target variables used for modelling. It should be noted that there is fixed format for the entering characters separated with "," and without space. The default values is "all" (all variables are included). |
| LimitLow | num. Lower limit ratio to screen the small extreme values located from 0 to this  |

lower limit of the target variables.

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| LimitUpper | num. Upper limit ratio to screen the large extreme values located from this lower limit to 1 of the target variables.  |
|------------|--|
| Layout     | $chr.\ Visualization\ layout\ .\ Available\ values\ include\ "column.points",\ "heatmap".$   |
| Brightness | chr. Visualization brightness . Available values include "light" and "dark".   |
| Palette    | chr. Visualization palette . Available values include "default1", "default2", "default3" and 5 journal option including "cell", "nature", "science", "lancet", "nejm". |

### Value

A list object containing the results of extremum for variables and visualization of the results.

## Author(s)

Yanqiu Feng, Bin Wang (corresponding author)

### **Examples**

```
res = InitStat()
  res1 = LoadStat(PID = res$PID, UseExample = "example#1")
  res2 = StatExtre(PID = res$PID, Group = T, Vars = "X5,X6,X7,X8,X9",
  LimitLow = 0.025, LimitUpper = 0.975, Layout = "column.points",
  Brightness = "dark", Palette = "default2")
```

StatLinkCros

Build statistical link for cross-sectional data.

# **Description**

Build statistical link for cross-sectional data.

# Usage

```
StatLinkCros(PID, OutPath = "default", VarsY, VarsX, LinkModel = "ranger",
   ObsrPartType = "raw",ObsrPartNum = "50",ObsrProfType = "partial",
   ObsrProfNum = "100",ObsrProfVars = "all.x",ObsrProfGeom = "profiles",
   SubjPredSeq = "none",SubjPartType = "break_down")
```

| PID     | chr. Program ID. It must be the same with the PID generated by ExpoStatLink  |
|---------|--|
| OutPath | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set. |
| VarsY   | chr. Outcome variable used for modelling. Only one variable can be entered.  |

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| VarsX        | chr. Exposure variable used for modelling. The default option is "all.x" (All exposure variables are included). Users can also choose available variables. It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., "X1,X2,X3" |
|--------------|---|
| LinkModel    | chr. Methods to interpret the model. Options include "ranger" (random forest), "glmnet" (elastic net), "svm" (support vector machine), "glm" (linear regression), "gam" (generalized additive model), and "xgboost" (eXtreme gradient boosting).  |
| ObsrPartType | chr. Type of transformation that should be applied for dropout loss. Options include "raw" (drop losses), "ratio" (drop_loss/drop_loss_full_model), and "difference" (drop_loss - drop_loss_full_model)   |
| ObsrPartNum  | chr. Number of observations that should be sampled for calculation of variable importance. The default means variable importance will be calculated on whole dataset (no sampling). If "defult", use all Obsrrvations.  |
| ObsrProfType | chr. Type of variable profile. Options include "partial", "conditional", and "accumulated"  |
| ObsrProfNum  | int. Number of observations used for calculation of aggregated profiles. By default 100.  |
| ObsrProfVars | chr. Names of variables to be explained. If "all.x", all "X variable" above are chosen.   |
| ObsrProfGeom | chr. Layout of the explanation profile in dataset level including "aggregates", "profiles" or "points".   |
| SubjPredSeq  | chr. Subjects which need explanation. Options include "all" (all the subjects), "none" (no subjects), and "other" (copy the subject list by clicking "Available vars").   |
| SubjPartType | chr. Layout of the explanation profile in subject level. Options include "shap", "oscillations", "break_down", and "none".  |

### Value

A list containing all the statistical explanation results.

# Author(s)

Bin Wang

```
res <- InitStatLink()
  res1 = LoadStatLink(PID = res$PID, UseExample = "example#1")
  res2 = StatLinkCros(PID=res$PID, VarsY = "Y1" ,VarsX = "all.x",
  LinkModel = "ranger",ObsrPartType = "raw" ,ObsrPartNum = "50",
  ObsrProfType = "partial" ,ObsrProfNum = "100", ObsrProfVars = "all.x",
  ObsrProfGeom = "profiles",SubjPredSeq = "S1,S2,S3",SubjPartType = "break_down")</pre>
```

StatNorm 67

| StatNorm Normality test for numeric variables |
|---|
|---|

# **Description**

Normality test for numeric variables

# Usage

```
StatNorm(PID, OutPath="default", Group, Vars, Method = "shapiro.test", Layout = "rose.chart",
    Brightness = "light", Palette = "default1")
```

# **Arguments**

| PID        | chr. Program ID. It must be the same with the PID generated by InitStat.  |
|------------|---|
| OutPath    | chr. Output file directory, e.g. "D:/ExpoStat/StatNorm". It should be noted that the slash symbol is "/", not "\".If "default", the current working directory will be set.  |
| Group      | lgl. Whether to separate dataset into train and test data for normality test. The default is "TRUE".  |
| Vars       | chr. Target variables used for modelling. It should be noted that there is fixed format for the entering characters separated with "," and without space. The default values is "all" (all variables are included). |
| Method     | chr. Normality test method. Only "shapiro.test" method is available at present.   |
| Layout     | chr. Visualization layout. Available values include "column", "column.points", "rose.chart", and "density".   |
| Brightness | chr. Visualization brightness. Available values include "light" and "dark".   |
| Palette    | chr. Visualization palette. Available values include "default1", "default2", "default3" and 5 journal option including "cell", "nature", "science", "lancet", "nejm".   |

# Value

A list object containing the results of normality test for variables and visualization of the results.

# Author(s)

Yanqiu Feng, Bin Wang (corresponding author)

```
res = InitStat()
  res1 = LoadStat(PID = res$PID, UseExample = "example#1")
  res2 = StatNorm(PID=res$PID, Group = T, Vars = 'X5,X6,X7,X8,X9',
  Method = "shapiro.test",Layout = "rose.chart" , Brightness = "dark",
  Palette = "default3")
```

68 StatTable1

| Stat | [able |
|------|-------|
| Juan | ante  |

Create Table 1 for for different epidemilogical study designs

#### **Description**

Create Table 1 for different epidemilogical study designs

# Usage

```
StatTable1(PID, OutPath="default", EpiDesign = "cohort",
   Group, VarsY, VarsC, Missing = "ifany")
```

#### **Arguments**

chr. Program ID. It must be the same with the PID generated by InitStat.

OutPath

chr. Output file directory, e.g. "D:/ExpoStat/StatTable1". It should be noted that the slash symbol is "/", not "\".If "default", the current working directory will be set.

EpiDesign chr. Research types provided for users, include "cohort", "case-control", "cross-

section".

Group lgl. Whether to separate dataset into train and test data for creating Table 1. The

default is "TRUE".

VarsY chr. Outcome variable used for modelling. Only one variable can be entered.

VarsC chr. Covariate variables needing further statistical test. It should be noted that

there is fixed format for the entering characters separated with "," and without space. The defaults value is all covariate variables listed in the data file, which

can be entered with "all.c".

Missing chr. Counts of missing values in the table, available options include are "no"

(never display missing values), "ifany" (only display if any missing values), and "always" (includes missing count row for all variables). Default is "ifany".

# Value

A list object containing standardized table 1.

### Author(s)

Yanqiu Feng, Bin Wang (corresponding author)

```
res = InitStat()
  res1 = LoadStat(PID = res$PID, UseExample = "example#1")
  res2 = StatTable1(PID = res$PID, EpiDesign = "cohort",
  Group = 'T', VarsY = "Y1", VarsC = "C1,C2,C3,C4,C5,C6",
  Missing = "ifany")
```

SurvAsso 69

|--|

# Description

Association analysis for survival data

# Usage

# **Arguments**

| PID     | chr. Program ID. It must be the same with the PID generated by InitSurv()   |
|---------|---|
| OutPath | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.  |
| TimeY   | chr. Outcome variable of survival time used for modelling. Only one variable can be entered.  |
| EventY  | chr. Outcome variable of status used for modelling. Only one variable can be entered.   |
| VarsX   | Exposure variable used for modeling. The default option is "all.x" (All exposure variables are included). Users can also choose available variables. It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., "X1,X2,X3" |
| VarsN   | chr. Choose the single factor or multiple factor model. Available options include "single.factor" and "multiple.factor"   |
| VarsSel | lgl. T (or TRUE) and F (or FALSE). Whether to select the significant variable for the final model. Available options includes T and F $$  |
| IncCova | lgl. T (or TRUE) and F (or FALSE). Whether to include the covariate selected in the function "FindCovaSurv" $$  |

# Value

A list containing the association analysis results.

# Author(s)

Changxin Lan, Bin Wang(corresponding author)

70 SurvPred

# **Examples**

```
res <- InitSurv()
  res1 = LoadSurv(PID = res$PID, UseExample = "example#1")
  res3 = FindCovaSurv(PID=res$PID, TimeY = "Y1", EventY= 'Y2',
  VarsC_Prior = "default", VarsC_Fixed = NULL, Method = "single.factor", Thr = 0.1)
  res4 = SurvAsso(PID=res$PID, TimeY = "Y1", EventY= 'Y2', VarsX='all.x',
  VarsN="single.factor", VarsSel=T, IncCova=T)
  FuncExit(PID = res$PID)</pre>
```

SurvPred

Build prediction models

# Description

Build prediction models

# Usage

# Arguments

| PID        | chr. Program ID. It must be the same with the PID generated by InitSurv()  |
|------------|--|
| OutPath    | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.   |
| TimeY      | chr. Outcome variable of survival time used for modelling. Only one variable can be entered.   |
| EventY     | chr. Outcome variable of status used for modelling. Only one variable can be entered.  |
| VarsX      | chr. Exposure variable used for modeling. The default option is "all.x" (All exposure variables are included). Users can also choose available variables. It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., "X1,X2,X3" |
| IncCova    | lgl. Whether to include the covariate selected in the function of "FindCovaSurv". Available options include T (or TRUE) and F (or FALSE).  |
| RsmpMethod | chr. Three resampling methods options for internal validation, including "cv" (i.e., Cross validation) , "bootstrap", and "holdout".   |
| Folds      | num. Folds of Cross-validation resampling. It is ranging 2-10.   |
| Ratio      | num. Ratio of Bootstrap resampling. It is ranging 0.4-0.9.   |
| Repeats    | num. Number of Bootstrap resampling. It is ranging 2-20.   |
|            |  |

# Value

A list containing the prediction performance evaluation.

TransClass 71

### Author(s)

Changxin Lan, Bin Wang(corresponding author)

#### **Examples**

```
res <- InitSurv()
  res1 = LoadSurv(PID = res$PID, UseExample = "example#1")
  res3 = FindCovaSurv(PID=res$PID, TimeY = "Y1", EventY= 'Y2',
  VarsC_Prior = "default", VarsC_Fixed = NULL, Method = "single.factor", Thr = 0.1)
  res4 = SurvPred(PID=res$PID, TimeY = "Y1", EventY= 'Y2', VarsX='all.x',
  IncCova=T,RsmpMethod="cv",Folds=3,Ratio=0.667,Repeats=3)
  FuncExit(PID = res$PID)</pre>
```

TransClass

Classify variables into various groups

# Description

Classify variables into various groups

## Usage

```
TransClass(PID, OutPath = "default", Group, Vars, LevelTo)
```

# **Arguments**

chr. Program ID. It must be the same with the PID generated by initial functions.

Chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.

Group lgl. Whether to separate dataset into train and test data for processing data.

Vars Variables to be imputed. Available options include: "all.x", all exposure variables; "all.c", all covariates; "all.cx", combination of All X and All C. Users can also choose available variables by selecting "Other" option, and copy the variables by clicking "Available vars". It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., "X1,X2,X3".

LevelTo The number of levels to convert variables to.

#### Value

An R6 class object containing the variable(s) after classifying data into various levels.

### Author(s)

Bin Wang

72 TransDistr

### **Examples**

```
res = InitTidy()
  res1 = LoadTidy(PID=res$PID, UseExample="example#1")
  res2 = TransClass(PID=res$PID, Group= FALSE, Vars="X1", LevelTo="4")
  FuncExit(PID = res$PID)
```

TransDistr

Transform variable distribution

# **Description**

Transform variable distribution

### **Usage**

```
TransDistr(PID,OutPath = "default", Vars, Method)
```

### **Arguments**

PID chr. Program ID. It must be the same with the PID generated by initial functions.

OutPath chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol

is "/", not "\". If "default", the current working directory will be set.

Variables to be imputed. Available options include: "all.x", all exposure vari-

ables; "all.c", all covariates; "all.cx", combination of All X and All C. Users can also choose available variables by selecting "Other" option, and copy the variables by clicking "Available vars". It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g.,

"X1,X2,X3".

Method chr. Methods used for imputation. Available options include "lod" or "cart". For

"lod" method, limit of detection (LOD) should be included in the "Vocabulary"

file.

#### Value

An R6 class object containing the variable(s) after transforming distribution.

### Author(s)

Bin Wang

```
res = InitTidy()
  res1 = LoadTidy(PID=res$PID, UseExample="example#1")
  res2 = TransDistr(PID=res$PID, Vars="X6,X7", Method="log10")
  FuncExit(PID = res$PID)
```

TransDummy 73

| TransDummy | Transform factor variables into dummy ones |
|------------|--|
|            |  |

## **Description**

Transform factor variables into dummy ones

#### Usage

```
TransDummy(PID, OutPath = "default", Vars="default")
```

#### **Arguments**

PID chr. Program ID. It must be the same with the PID generated by initial functions.

OutPath chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol

is "/", not "\". If "default", the current working directory will be set.

Vars chr. Variables to be transformed as dummy variables. It should be noted that

there is fixed format for the entering characters separated with comma and without space, e.g., "X1,X2,X3". If "default", all the factor variables will be transformed into dummy ones. These variables need to be transformed as factor ones

in previous transform step using TransType function.

## Value

An R6 class object containing the variable(s) after transforming the factor variables into dummy ones.

#### Author(s)

Bin Wang

```
res = InitTidy()
  res1 = LoadTidy(PID=res$PID, UseExample="example#1")
  res2 = TransDummy(PID=res$PID, Vars="default")
  FuncExit(PID = res$PID)
```

74 TransGroup

| TransGroup | Transform exposure groups |  |
|------------|---------------------------|--|
|            |                           |  |

## **Description**

Transform exposure groups

## Usage

```
TransGroup(PID, OutPath = "default", Vars="default", ToGroup)
```

### **Arguments**

PID chr. Program ID. It must be the same with the PID generated by initial functions.

OutPath chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol

is "/", not "\". If "default", the current working directory will be set.

Variables to be imputed. Available options include: "all.x", all exposure vari-

ables; "all.c", all covariates; "all.cx", combination of All X and All C. Users can also choose available variables by selecting "Other" option, and copy the variables by clicking "Available vars". It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g.,

"X1,X2,X3".

ToGroup chr. Label the group of the target variables. Four common used names are

recommended, including Exposure, Metabolome, Proteome, and Immunome.

Users can also label the groups as you like.

#### Value

An R6 class object containing the variable(s) after grouping the variables.

## Author(s)

Bin Wang

```
res = InitTidy()
  res1 = LoadTidy(PID=res$PID, UseExample="example#1")
  res2 = TransGroup(PID=res$PID, Vars="X4,X5", ToGroup = "G1")
  FuncExit(PID = res$PID)
```

TransImput 75

| TransImput | Missing data imputation  |  |
|------------|--------------------------|--|
|            | Missing data imputation. |  |
|            |                          |  |

## Description

Missing data imputation.

## Usage

```
TransImput(PID,OutPath = "default",Group,Vars,Method)
```

## Arguments

| PID     | chr. Program ID. It must be the same with the PID generated by initial functions.   |
|---------|---|
| OutPath | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.  |
| Group   | lgl. Whether to separate dataset into train and test data for processing data.  |
| Vars    | Variables to be imputed. Available options include: "all.x", all exposure variables; "all.c", all covariates; "all.cx", combination of All X and All C. Users can also choose available variables by selecting "Other" option, and copy the variables by clicking "Available vars". It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., "X1,X2,X3". |
| Method  | Methods used for imputation. Available options include "lod" or "cart" methods. For "lod" method, limit of detection (LOD) should be included in the "Vocabulary" file.   |

## Value

An R6 class object containing variable(s) with imputation.

## Author(s)

Bin Wang

```
res = InitTidy()
  res1 = LoadTidy(PID=res$PID, UseExample="example#1")
  res2 = TransImput(PID=res$PID, Group=TRUE, Vars="all.x", Method="lod")
  FuncExit(PID = res$PID)
```

76 TransScale

## Description

Scale variables

## Usage

```
TransScale(PID,OutPath = "default", Group = T, Vars, Method = "normal",
    Direct="positive", RangeLow="0", RangeUpper="1")
```

## Arguments

| PID        | chr. Program ID. It must be the same with the PID generated by initial functions.   |
|------------|---|
| OutPath    | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.  |
| Group      | lgl. T (or TRUE) and F (or FALSE). Whether to separate dataset into train and test data for processing data.  |
| Vars       | Variables to be imputed. Available options include: "all.x", all exposure variables; "all.c", all covariates; "all.cx", combination of All X and All C. Users can also choose available variables by selecting "Other" option, and copy the variables by clicking "Available vars". It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., "X1,X2,X3". |
| Method     | chr. Scaling methods. Available options include "normal" and "range".   |
| Direct     | chr. Direction to be transformed, Available options include "positive" and "negative".  |
| RangeLow   | num. Lower limit for range method.  |
| RangeUpper | num. Upper limit for range method. It should be greater than the lower limit.   |

## Value

An R6 class object containing the variable(s) after scaling data.

## Author(s)

Bin Wang

```
res = InitTidy()
  res1 = LoadTidy(PID=res$PID, UseExample="example#1")
  res2 = TransScale(PID=res$PID, Group= TRUE, Vars="all.x", Method="normal")
  FuncExit(PID = res$PID)
```

TransType 77

| TransType T | ransform data type |
|-------------|--------------------|
|             | V                  |

## Description

Transform data type

## Usage

```
TransType(PID,OutPath = "default",Vars,To)
```

## Arguments

| PID     | chr. Program ID. It must be the same with the PID generated by initial functions.   |
|---------|---|
| OutPath | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.  |
| Vars    | Variables to be imputed. Available options include: "all.x", all exposure variables; "all.c", all covariates; "all.cx", combination of All X and All C. It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., "X1,X2,X3". |
| То      | chr. Indicate the type of the chosen variables to be transformed into. Available options include "integer", "numeric", "character", "factor", "logical", and "date".  |

### Value

An R6 class object containing the variable(s) after transforming data type.

## Author(s)

Bin Wang

```
res = InitTidy()
  res1 = LoadTidy(PID=res$PID, UseExample="example#1")
  res2 = TransType(PID=res$PID, Vars = "X1,X2", To = "character")
  FuncExit(PID = res$PID)
```

78 VizBioLink

#### **Description**

Visualize the biological link. It should be noted that the corresponding link has been built by BioLink function prior to using it

#### Usage

```
VizBioLink(PID, OutPath="default", Mode, Layout = "force-directed", Brightness = "dark", Palette = "def
```

#### **Arguments**

PID chr. Program ID. It must be the same with the PID generated by InitBioLink. **OutPath** chr. Output file directory. e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set. Mode chr. Method to build the biological link between exposures and diseases. Available options include "PPI" (i.e., protein-protein interaction) and "GO" (i.e., gene ontoloty). Layout chr. Visualization layout. Available options include "force-directed" and "degreecircle". Brightness chr. Visualization brightness. Available options include "light" and "dark". Palette chr. Visualization palette. Available options include "default1", "default2" and several journal preference styles (i.e., cell, nature, science, lancet, nejm, and jama).

#### Value

A list object containing the plot of the biological link. This plot can be further processed using ggplot2 package.

#### Author(s)

Mingliang Fang, Ning Gao, Bin Wang (corresponding author)

```
res = InitBioLink()
  res1 = LoadBioLink(PID = res$PID,UseExample = "example#1")
  res2 = ConvToExpoID(PID = res$PID)
  res3 = BioLink(PID = res$PID, OutPath="default", Mode = "PPI", ChemCas = "default",
  ChemInchikey = "default",DiseaseID = "default",MetabolomeID = "default",
  MetBiospec = "blood", ProteomeID = "default")
  res4 = VizBioLink(PID = res$PID, Mode = 'PPI', Layout = "force-directed",
  Brightness = "dark", Palette = "default1")
```

VizCateDot 79

| VizCateDot | Plot category dot |  |
|------------|-------------------|--|
|            |                   |  |

## Description

Visualize data via dot plot.

## Usage

## **Arguments**

| PID        | chr. Program ID. It must be the same with the PID generated by InitViz.  |
|------------|--|
| OutPath    | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\".If "default", the current working directory will be set.  |
| Group      | lgl.Whether to separate dataset into train and test datasets for data imputation,including T or F.The default option is F.   |
| Vars       | chr. Specifying the variables. Available options include: "all.x", all independent variables; "all.c", all covariate variables; "all.cx", combination of All x and All x; or input a character string specifying the variables, separated by comma "," without space(e.g."X4,X5,X6,X7,X8,X9,X10"). No more than 50 variables be entered is recommended (< 50 variables). |
| Parameter  | chr. Specifying which parameter of the data to be the ordinate of the output plot. Available options include: "mean", "median", "min", "max", "mad" or "sd".Default is "mean".   |
| Brightness | chr. Visualization brightness. Available options include "light" and "dark".   |
| Palette    | chr. Visualization palette. Available options include "default1", "default2" and "Journal". The "Journal" option provides several journal preference styles including cell, nature, science, lancet, nejm, and jama.   |

## Details

The dot plot is used to display the relative position of two data points in the same time period, or compare the difference between the two categorical variables.

## Value

One or three ggplot plots which can be further modified using the ggplot2 package. When Group=T, (1) "all\_light\_default1": the whole dataset visualization result; (2) "train\_light\_default1": the train dataset visualization result; (3) "test\_light\_default1": the test dataset visualization result. When Group=F, (1) "light\_default1": the whole dataset visualization result.

#### Author(s)

Ning Gao, Bin Wang(corresponding author)

#### **Examples**

```
res = InitViz()
  res1 = LoadViz(PID = res$PID, UseExample = "example#1")
  res2 = VizCateDot(PID=res$PID,OutPath="default",Group="F",Vars="X4,X5,X6,X7,X8,X9,X10",
    Parameter="mean",Brightness="light",Palette="default1")
```

VizCompoDendrogram

Plot component dendrogram

#### **Description**

Visualize data via dendrogram plot.

## Usage

```
VizCompoDendrogram(PID,OutPath="default",Group = "T",Vars,
    Parameter = "median",DistMethod = "euclidean", ClusterMethod = "ward.D",
    ClusterNum = "4",Brightness = "light",Palette = "default1")
```

#### **Arguments**

outPath

chr. Program ID. It must be the same with the PID generated by InitViz.

outPath

chr. Output file directory. e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.

Group lgl. Whether to separate dataset into train and test datasets for data imputation, including

T or F.The default option is T.

Vars chr. Variables to be visualized(e.g. "X4,X5,X6,X7,X8,X9,X10").Available op-

tions include: "all.x", all independent variables; "all.c", all covariate variables; "all.cx", combination of all.x and all.c; or input a character string specifying the variables, separated by comma "," without space(e.g. "X4,X5,X6,X7,X8,X9,X10").

Parameter chr. Specifying which parameter of the data to be the ordinate of the output

plot. Available options include: "mean", "median", "min", "max", "mad" or

"sd".Default is "mean".

DistMethod chr.The distance measure. This must be one of "euclidean", "maximum" or

"manhattan".Default is "euclidean".

ClusterMethod chr.The agglomeration method. This should be one of "ward.D", "ward.D2" or

"single".Default is "ward.D".

ClusterNum num. The number of groups for cutting the tree.Default is 4.

Brightness chr. Visualization brightness. Available options include "light" and "dark".

Palette chr. Visualization palette. Available options include "default1", "default2" and

"Journal". The "Journal" option provides several journal preference styles in-

cluding cell, nature, science, lancet, nejm, and jama.

VizCrosAsso 81

#### **Details**

The dendrogram plot is used to plot beautiful dendrograms.

#### Value

One or three ggplot plots which can be further modified using the ggplot2 package. When Group=T, (1) "all\_light\_default1": the whole dataset visualization result; (2) "train\_light\_default1": the train dataset visualization result; (3) "test\_light\_default1": the test dataset visualization result. When Group=F, (1) "light\_default1": the whole dataset visualization result.

#### Author(s)

Ning Gao, Bin Wang (corresponding author)

## **Examples**

```
res = InitViz()
  res1 = LoadViz(PID = res$PID, UseExample = "example#1")
  res2= VizCompoDendrogram(PID=res$PID,OutPath="default",Group = "T",
  Vars = "X4,X5,X6,X7,X8,X61,X66,X67,X200",Parameter = "median",
  DistMethod = "euclidean",ClusterMethod = "ward.D2",ClusterNum = "4",
  Brightness = "light",Palette = "default1")
```

VizCrosAsso

Visualize association analysis

## Description

Visualize association analysis

#### Usage

| PID        | chr. Program ID. It must be the same with the PID generated by ExpoCros   |
|------------|---|
| OutPath    | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.            |
| VarsY      | chr. Outcome variable used for modeling. Only one variable can be entered.  |
| VarsN      | chr. Choose the single factor or multiple factor model. Available options include "single.factor" and "multiple.factor"   |
| Layout     | chr. Visualization layout. Available options include "forest" and "volcano".  |
| Brightness | chr. Visualization brightness. Available options include "light" and "dark".  |
| Palette    | chr. Visualization palette. Available options include "default1", "default2" and several journal preference styles (i.e., cell, nature, science, lancet, nejm, and jama). |

82 VizCrosPred

#### Value

An R6 class object containing the results' plot.

#### Author(s)

Bin Wang

## **Examples**

```
res <- InitCros()
  res1 = LoadCros(PID = res$PID, UseExample = "example#1")
  res2 = CrosAsso(PID=res$PID, EpiDesign = "cohort", VarsY = "Y1",
  VarsX = "X5,X6,X7,X8,X9,X10,X11", VarsN = "single.factor",
  VarsSel = FALSE, VarsSelThr = 0.1, IncCova = TRUE, Family = "gaussian",
  RepMsr = FALSE,Corstr = "ar1")
  res3 = VizCrosAsso(PID=res$PID,VarsY = "Y1",VarsN="single.factor", Layout = "forest",
  Brightness = "dark",Palette = "default1")
  FuncExit(PID = res$PID)</pre>
```

VizCrosPred

Visualize the prediction performance

#### **Description**

Visualize the prediction performance

### Usage

## **Arguments**

chr. Program ID. It must be the same with the PID generated by ExpoCros

chr. Output file directory, e.g., "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.

VarsY chr. Outcome variable used for modeling. Only one variable can be entered.

Layout chr. Visualization layout. Available options include "bar" and "roc"

Brightness chr. Visualization brightness. Available options include "light" and "dark".

Palette chr. Visualization palette. Available options include "default1", "default2" and several journal preference styles (i.e., cell, nature, science, lancet, nejm, and

jama).

#### Value

A list containing the results' plot.

VizDistrSierra 83

#### Author(s)

Bin Wang

#### **Examples**

```
res <- InitCros()
  res1 = LoadCros(PID = res$PID, UseExample = "example#1")
  res2 = CrosPred(PID=res$PID, VarsY = "Y1", VarsX = "X5,X6,X7,X8,X9,X10,X11",
  PredType = "response", VarsSel = FALSE, VarsSelThr = 0.1,IncCova = FALSE,
  RsmpMethod = "cv", Folds = 5, Ratio = 0.667, Repeats = 5)
  res3 = VizCrosPred(PID=res$PID, VarsY = "Y1", Layout = "bar", Brightness = "light",
  Palette = "science")
  FuncExit(PID = res$PID)</pre>
```

VizDistrSierra

Plot distribution sierra

#### **Description**

Visualize data via sierra plot.

#### **Usage**

```
VizDistrSierra(PID,OutPath="default",Group = "F",Vars,Brightness = "light",
    Palette = "default1")
```

#### **Arguments**

PID chr. Program ID. It must be the same with the PID generated by InitViz. OutPath chr. Output file directory. e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set. lgl. Whether to separate dataset into train and test datasets for data imputation, including Group T or F.The default option is F. Vars chr. Variables to be visualized(e.g. "X4,X5,X6,X7,X8,X9,X10"). Available options include: "all.x", all independent variables; "all.c", all covariate variables; "all.cx", combination of all.x and all.c; or input a character string specifying the variables, separated by comma "," without space(e.g. "X4,X5,X6,X7,X8,X9,X10"). No more than 50 variables be entered is recommended (< 20 variables). Brightness chr. Visualization brightness. Available options include "light" and "dark". chr. Visualization palette. Available options include "default1", "default2" and Palette "Journal". The "Journal" option provides several journal preference styles in-

cluding cell, nature, science, lancet, nejm, and jama.

#### Details

The sierra plot is used to visualize the kernel density estimation of data.

84 VizMedtPair

#### Value

One or three ggplot plots which can be further modified using the ggplot2 package. When Group=T, (1) "all\_light\_default1": the whole dataset visualization result; (2) "train\_light\_default1": the train dataset visualization result; (3) "test\_light\_default1": the test dataset visualization result. When Group=F, (1) "light\_default1": the whole dataset visualization result.

#### Author(s)

Ning Gao, Bin Wang(corresponding author)

## **Examples**

```
res = InitViz()
  res1 = LoadViz(PID = res$PID, UseExample = "example#1")
  res2 = VizDistrSierra(PID=res$PID,OutPath="default",Group = "F",
  Vars = "X14,X15,X16,X17,X18,X19,X20",Brightness = "light",Palette = "default1")
```

VizMedtPair

Visualize pairwise mediation modelling result

## Description

Visualize the pairwise mediation result. It should be noted that the pairwise mediation modelling result has been built by Pairwise function prior to using it.

#### Usage

```
VizMedtPair(PID, OutPath, Brightness = "light", Pallette = "default1")
```

#### **Arguments**

PID chr. Program ID. It must be the same with the PID generated by InitMedt.

OutPath chr. Output file directory, e.g. "D:/output". If "default", the current working

directory will be set. It should be noted that the slash symbol is "/", not "\".

Brightness chr. Visualization brightness. Available options include "light" and "dark".

Pallette chr. Visualization palette. Available options include "default1", "default2" and

"Journal". The "Journal" option provides several journal preference styles in-

cluding cell, nature, science, lancet, nejm, and jama.

#### **Details**

VizMedtPair draws a visualized display for pairwise modelling results. Piror to using VizMedtPair, make sure that the users have built mediation models by Pairwise function.

VizMixBKMR 85

## Value

A list containing two elements where the visualized pairwise modelling plot as well as the organized plotting data are stored. The elements of that list include:

- 1. "plotdata": a dataframe containing the organized plotting data extracted from #' pairwise mediation modelling result.
- 2. "plot": a visualized plot for pairwise mediation result.

## Author(s)

Mengyuan Ren, Bin Wang(corresponding author)

### **Examples**

```
res <- InitMedt()
res1 <- LoadMedt(PID = res$PID, UseExample = "example#1", DataPath = NULL,
VocaPath = NULL)
res2 <- XMlists(PID = res$PID)
res3 <- PairWise(PID=res$PID, VarsY = "Y1",
VarsX = "default", VarsM = "default", VarsC = "default", Family = "linear",
Iter = 500)
res4 <- VizMedtPair(PID=res$PID, Brightness = "Bright",
Pallette = "default1")</pre>
```

VizMixBKMR

Visualize the model results of Bayesian Kernel Machine Regression (BKMR)

## Description

Visualize the model results of Bayesian Kernel Machine Regression (BKMR)

## Usage

```
VizMixBKMR(PID, OutPath = "default", VarsY, Brightness = "dark", Palette = "default1")
```

| PID        | chr. Program ID. It must be the same with the PID generated by ExpoMixEffect  |
|------------|---|
| OutPath    | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.            |
| VarsY      | chr. Outcome variable used for modeling. Only one variable can be entered.  |
| Brightness | chr. Visualization brightness. Available options include "light" and "dark".  |
| Palette    | chr. Visualization palette. Available options include "default1", "default2" and several journal preference styles (i.e., cell, nature, science, lancet, nejm, and jama). |

86 VizMixMLR

#### Value

A list containing the BKMR analysis results' plot.

#### Author(s)

Bin Wang

## **Examples**

```
res <- InitMix()
  res1 = LoadMix(PID = res$PID, UseExample = "example#1")
  res2 = MixBKMR(PID = res$PID, VarsY = "Y1", VarsX = "X4,X5,X6,X7,X8,X9,X10",
  IncCova = 'F', Family = "gaussian", Group = 'F',Iter = 2000,qfixed = 0.5,
  qsbivar = "default", qsoverall = "default",qsdiff = "default")
  res3 = VizMixBKMR(PID=res$PID, VarsY = "Y1",Brightness = "dark",Palette = "default1")</pre>
```

VizMixMLR

Visualize the model results

## **Description**

Visualize the results of multiple linear regression (MLR) model

#### Usage

```
VizMixMLR(PID,OutPath = "default", VarsY, SelMethod, Brightness = "light", Palette = "default1")
```

## Arguments

| PID        | chr. Program ID. It must be the same with the PID generated by ExpoMixEffect  |  |
|------------|---|--|
| OutPath    | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbols "/", not "\". If "default", the current working directory will be set.  |  |
| VarsY      | chr. Outcome variable used for modeling. Only one variable can be entered.  |  |
| SelMethod  | chr. Method to select the important features to the final model. Options include "stepwise" (stepwise regression), "lasso" (Regularization regression of least absolute shrinkage and selection operator), and "enet" (Regularization regression of elastic net). |  |
| Brightness | chr. Visualization brightness. Available options include "light" and "dark".  |  |
| Palette    | chr. Visualization palette. Available options include "default1", "default2" and several journal preference styles (i.e., cell, nature, science, lancet, nejm, and  |  |

#### Value

A list containing the MLR analysis plot.

jama).

VizMixWQS 87

### Author(s)

Bin Wang

### **Examples**

```
res <- InitMix()
  res1 = LoadMix(PID = res$PID, UseExample = "example#1")
  res2 = MixMLR(PID = res$PID, VarsY = "Y1", VarsX = "all.x",
  IncCova = "F", SelMethod = "lasso", PredType = "response", Family = "gaussian")
  res3 = VizMixMLR(PID=res$PID, VarsY = "Y1", SelMethod = 'lasso',
  Brightness = "light", Palette = "default1")</pre>
```

VizMixWQS

Visualize results of weighted quantile sum regression (WQS) model

#### **Description**

Visualize results of weighted quantile sum regression (WQS) model

#### Usage

```
VizMixWQS(PID, OutPath = "default", VarsY, Brightness = "dark", Palette = "default1")
```

## **Arguments**

PID chr. Program ID. It must be the same with the PID generated by ExpoMixEffect

OutPath chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol

is "/", not "\". If "default", the current working directory will be set.

VarsY chr. Outcome variable used for modeling. Only one variable can be entered.

Brightness chr. Visualization brightness. Available options include "light" and "dark".

Palette chr. Visualization palette. Available options include "default1", "default2" and

several journal preference styles (i.e., cell, nature, science, lancet, nejm, and

jama).

#### Value

A list containing the WQS analysis results' plot.

#### Author(s)

Bin Wang

88 VizMulOmicCros

## **Examples**

```
res <- InitMix()
  res1 = LoadMix(PID = res$PID, UseExample = "example#1")
  res2 = MixWQS(PID=res$PID, VarsY = "Y1", VarsX = "all.x",
  IncCova = "F",Family = "gaussian", VarStrat = "none", RatioValidat = 0.3,
  q = 10, b=100, b1_pos = 'F', b1_constr = 'F')
  res3 = VizMixWQS(PID = res$PID, VarsY = "Y1",
  Brightness = "dark",Palette = "default1")</pre>
```

VizMulOmicCros

Visualize multiomics model results

## **Description**

VizMulOmicCros function is mainly aimed to visualize the modeling results calculated by MulOmicsCros function. It can provide plots with high quality of the final results to make it easier for users to understand.

## Usage

VizMulOmicCros(PID, OutPath, VarsY, NodeNum, EdgeThr, Layout, Brightness, Palette)

## Arguments

| PID   | chr. Program ID. It must be the same with the PID generated by InitMo.   |  |
|---|--|--|
| OutPath   | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set. |  |
| VarsY   | chr. Outcome variable for modeling. Only one variable can be entered.  |  |
| NodeNum   | num. Number of nodes in the network plot. The maximum number is generated by Multiomics function. User can set a smaller value if needed.                      |  |
| EdgeThr num. Threshold of correlation coefficient ranging 0-1 for generating the cerned edges of the network plot.  |  |  |
| Layout chr. Visualization layout. Available options include "force-directed" and "decircle".  |  |  |
| Brightness  | chr. Visualization brightness. Available options include "light" and "dark".   |  |
| Palette chr. Visualization palette. Available options include "default1", "default2" other options about some journal preference styles including "cell", "natu "science", "lancet", "nejm", etc. |  |  |

#### **Details**

You can get different styles of images by selecting different parameters.

VizNtaAnno 89

#### Value

An R6 class object containing seven elements. The elements of that object include: (1) "Importance\_plot": Plots for the importance of features after modeling a single omic from different learners. (2) "Measures\_boxplot": Plots for the r-square value of the single omic model built by different learners. (3) "NetWork\_State": A list containing dataframes that contain nodes and edges used to draw interOmic network from models built by different learners. (4) "Nodeplot": Interomic node plots from models built by different models. (5) "Networkplot": Interomic network plots from models built by different models. (6) "Prediction\_train\_plot": Plots for the prediction value of the train set in the SG model built by different combinations of learners. (7) "Prediction\_test\_plot": Plots for the prediction value of the test set in the SG model built by different combinations of learners.

#### Author(s)

Guohuan Zhang, Yuting Wang, Ning Gao, Bin Wang (corresponding author)

#### **Examples**

```
res <- InitMO()
res <- LoadMO(PID=res$PID, UseExample = "example#1", DataPath = NULL, VocaPath = NULL)
res2 <- MulOmicsCros(PID=res$PID, OutPath = "default", OmicGroups = "immunome, metabolome, proteome",
VarsY = "Y1", VarsC = "all.c", TuneMethod = "random_search", TuneNum = 5, RsmpMethod = "cv", Folds = 5,
Ratio = 0.67, Repeats = 5, VarsImpThr = 0.85, SG_Lrns = "lasso, enet, rf, xgboost")
res3 <- VizMulOmicCros(PID=res$PID, OutPath = "default", VarsY = "Y1", NodeNum=100, EdgeThr= 0.45,
Layout = "force-directed", Brightness = "light", Palette = 'default1')</pre>
```

VizNtaAnno

Visualize annotation results

### **Description**

Visualize annotation results of non-targeted data

## Usage

```
VizNtaAnno(PID, OutPath = "default", VarsY, VarsN ,Accuracy = 1,
    Brightness = "light",Palette = "default1")
```

| PID      | chr. Program ID. It must be the same with the PID generated by ExpoNTA  |  |
|----------|---|--|
| OutPath  | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbis "/", not "\". If "default", the current working directory will be set. |  |
| VarsY    | chr. Outcome variable used for modeling. Only one variable can be entered.  |  |
| VarsN    | chr. Choose the single factor or multiple factor model. Available options inclusingle.factor" and "multiple.factor"   |  |
| Accuracy | num. Upper limit of accuracy to match the target molecular. The default is 1.   |  |

90 VizNtaCros

Brightness chr. Visualization brightness. Available options include "light" and "dark".

Palette chr. Visualization palette. Available options include "default1", "default2" and several journal preference styles (i.e., cell, nature, science, lancet, nejm, and jama).

#### Value

A list containing plots of non-target annotation analysis results

#### Author(s)

Mingliang Fang, Bin Wang (corresponding author)

#### **Examples**

```
res <- InitNTA()
    res1 = LoadNTA(PID = res$PID, UseExample = "example#1")
    res2 = NtaCros(PID=res$PID, VarsY = "Y1", VarsX = "all.x",
    VarsN = "single.factor", FdrCorrect = T, SelMethod = "all",
    StepwizeThr = 0.1, RF_ImpThr = 0.9, IncCova = "F", Family = "gaussian",
    RepMsr = "F", Corstr = "ar1")
    res3 = NtaAnno(PID=res$PID, VarsY = "Y1", VarsX = "default", VarsN = "single.factor",
    FdrCorrect = "F", AdductPos = "M+H", AdductNeg = "M-H", Accuracy = 1)
    res4 = VizNtaAnno(PID=res$PID, VarsY = "Y1", VarsN = "single.factor",
    Accuracy = 1,Brightness = "light",Palette = "default1")</pre>
```

VizNtaCros

Visualize the results of Association analysis

## **Description**

Visualize the results of Association analysis for non-targeted data

### Usage

| PID     | chr. Program ID. It must be the same with the PID generated by ExpoNTA   |  |
|---------|--|--|
| OutPath | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbols "/", not "\". If "default", the current working directory will be set. |  |
| VarsY   | chr. Outcome variable used for modeling. Only one variable can be entered.   |  |
| VarsN   | chr. Choose the single factor or multiple factor model. Available options inc "single.factor" and "multiple.factor"  |  |
| Layout  | chr. Visualization layout. Available options include "forest" and "volcano".   |  |

VizPanelAsso 91

| EffectThr | num. Threshold of the total importance for the variables to a random forest |
|-----------|---|
|           | model. It ranges 0.5-1.0 with the default value of 0.9.                     |

Brightness chr. Visualization brightness. Available options include "light" and "dark".

Palette chr. Visualization palette. Available options include "default1", "default2" and

several journal preference styles (i.e., cell, nature, science, lancet, nejm, and

jama).

#### Value

A list containing plots of non-target analysis association results

#### Author(s)

Mingliang Fang, Bin Wang (corresponding author)

## **Examples**

```
res <- InitNTA()
  res1 = LoadNTA(PID = res$PID, UseExample = "example#1")
  res2 = NtaCros(PID=res$PID, VarsY = "Y1", VarsX = "all.x",
  VarsN = "single.factor", FdrCorrect = T, SelMethod = "all",
  StepwizeThr = 0.1, RF_ImpThr = 0.9, IncCova = "F", Family = "gaussian",
  RepMsr = "F", Corstr = "ar1")
  res3 = VizNtaCros(PID=res$PID, VarsY = "Y1", VarsN = "single.factor",
  Layout = "volcano", EffectThr = 0.5, Brightness = "light", Palette = "default1")</pre>
```

VizPanelAsso

Visualize the results of association analysis for panel data

## **Description**

Visualize the results of association analysis for panel data

#### **Usage**

| PID       | chr. Program ID. It must be the same with the PID generated by ExpoPanel  |  |
|-----------|---|--|
| OutPath   | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbolis "/", not "\". If "default", the current working directory will be set. |  |
| VarsY     | chr. Outcome variable used for modeling. Only one variable can be entered.  |  |
| VarsN     | chr. Choose the single factor or multiple factor model. Available options inclu "single.factor" and "multiple.factor"   |  |
| EffectThr | num. Insert the cutoff line for the effect values.  |  |

92 VizRedXM

Layout chr. Visualization layout. Available options include "forest" and "volcano".

Brightness chr. Visualization brightness. Available options include "light" and "dark".

Palette chr. Visualization palette. Available options include "default1", "default2" and several journal preference styles (i.e., cell, nature, science, lancet, nejm, and jama).

#### Value

A list containing the plots of association analysis results.

#### Author(s)

Bin Wang

## **Examples**

```
res <- InitPanel()
  res1 = LoadPanel(PID = res$PID, UseExample = "example#1")
  res2 = PanelAsso(PID=res$PID, VarsY = "Y1",
  VarsX = "X1,X2,X3,X4,X5,X6,X7,X8,X9,X10,X11,X12", VarsN = "single.factor",
   VarsRandomIpt = "SubjectID", VarsRandomSlp = "none", IncCova = F)
  res3 = VizPanelAsso(PID = res$PID, VarsY = "Y1",
  VarsN = "single.factor", Layout = "forest", Brightness = "dark",Palette = "default1")</pre>
```

VizRedXM

Visualize RedXM mediation modelling result

## Description

Visualize the RedXM mediation result. It should be noted that the RedXM mediation modelling result has been built by RedXM function prior to using it.

## Usage

```
VizRedXM(PID, OutPath, Brightness = "light", Pallette = "default1")
```

| PID        | chr. Program ID. It must be the same with the PID generated by InitMedt.   |  |
|------------|--|--|
| OutPath    | chr. Output file directory, e.g. "D:/output". If "default", the current working directory will be set.It should be noted that the slash symbol is "/", not "\".  |  |
| Brightness | chr. Visualization brightness. Available options include "Light" and "Dark".   |  |
| Pallette   | chr. Visualization palette. Available options include "default1", "default2" and "Journal". The "Journal" option provides several journal preference styles including cell, nature, science, lancet, nejm, and jama. |  |

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#### **Details**

VizRedXM draws a visualized display for RedXM results. Piror to using VizMedtPair, make sure that the users have built mediation models by RedXM function.

#### Value

A list containing two elements where the visualized exposure and mediator dimension reduction plot as well as the organized plotting data are stored. The elements of that list include:

- 1. "MedtRedXM\_plotadta": a dataframe containing the organized plotting data extracted from exposure and mediator dimension reduction result.
- 2. "MedtRedXM\_plot": a visualized plot for exposure and mediator dimension reduction result.

#### Author(s)

Mengyuan Ren, Bin Wang(corresponding author)

## **Examples**

```
res <- InitMedt()
res1 <- LoadMedt(PID = res$PID, UseExample = "example#1", DataPath = NULL,
VocaPath = NULL)
res2 <- XMlists(PID = res$PID)
res3 <- RedX(PID=res$PID, VarsY = "Y1",
VarsC = "default", VarsM = "default", Method = "mean", Folds = 10,
Family = "linear", Iter = 500)
res4 <- RedXM(PID=res$PID, VarsY = "Y1",
VarsC = "default", Method = "mean", Family = "linear", Iter = 500)
res5 <- VizRedXM(PID=res$PID, Brightness = "bright",
Pallette = "nature")</pre>
```

VizRefer

Visualize the Articles' Main Information

## **Description**

Visualize the articles' main information after MetaRefer function.

#### Usage

```
VizRefer(PID, OutPath = "default")
```

#### **Arguments**

PID chr. Program ID. It must be the same with the PID generated by InitMeta.

OutPath chr. Output file directory, e.g. "D:/output". If "default", the current working directory will be set. It should be noted that the slash symbol is "/", not "\".

#### **Details**

VizRefer provides the visual function of articles' main information, showing the year and region distribution directly. Please attention, PID must be got from the return result of InitMeta(). VizRefer can only run successfully after successfully running InitMeta, LoadMeta and MetaRefer functions.

## Value

A list object containing plots of article information visualization.

#### Author(s)

Weinan Lin, Bin Wang (corresponding author)

## **Examples**

```
res <- InitMeta()
  res1 <- LoadMeta(PID = res$PID,
   UseExample = "example#1",
  DataPath = NULL)
  res2 <- MetaRefer(PID = res$PID, OutPath = "default", Mode = "search",
  VarX = "default", VarY = "default", VarM = "default", YearFrom = "default",
  YearEnd = "default", PMID = "default")
  res3 <- VizRefer(PID=res$PID, OutPath = "default")</pre>
```

VizRelatEdgeBundling Plot elationship edge bundling

## Description

Visualize data via edge bundling plot.

## Usage

```
VizRelatEdgeBundling(PID,OutPath="default",VarsY, VarsC="all.c", VarsX = "all.x",
    Family = "gaussian", SizeFor = "pvalue",Brightness = "light",
    Palette = "default1")
```

| PID     | chr. Program ID. It must be the same with the PID generated by InitViz.   |  |
|---------|---|--|
| OutPath | chr. Output file directory. e.g. "D:/test". It should be noted that the slash symbol is "/", not "\".If "default", the current working directory will be set.                                   |  |
| VarsY   | chr. Dependent variables for visualization(e.g."Y2").   |  |
| VarsC   | chr. Covariate variable. Available options include: "all.c", all covariate variables; or input a character string specifying the variables, separated by comma "," without space(e.g. "C1,C2"). |  |

VizRelatHeatmap 95

| VarsX   | chr. Independent variables. Available options include: "all.x", all independent variables; or input a character string specifying the variables, separated by comma "," without space(e.g. "X4,X5,X6,X7,X8,X9,X10").  |  |
|---|---|--|
| Family  | chr. The link function for the regression model according the data type of o comes,including "gaussian" for continuous variable, "binomial" for binary va able,and "poisson" for counting variable. Notice that the family are determine by data type of an outcome, or the plot can not be visualized. The default options "gaussian". |  |
| SizeFor   | chr. Parameter to represent the size of the points in the output plot. Available options include "pvalue" and "beta". The default option is "pvalue".   |  |
| Brightness chr. Visualization brightness. Available options include "light" and "dark". |   |  |
| Palette   | alette chr. Visualization palette. Available options include "default1", "default2' "Journal". The "Journal" option provides several journal preference style cluding cell, nature, science, lancet, nejm, and jama.  |  |

## **Details**

The edge bundling plot is used to bundle the edges closely in order to reduce complexity.

#### Value

A ggplot plot which can be further modified using the ggplot2 package. (1) "light\_default1": the visualization result;

#### Author(s)

Ning Gao, Bin Wang (corresponding author)

## **Examples**

```
res = InitViz()
  res1 = LoadViz(PID = res$PID, UseExample = "example#1")
  res2 = VizRelatEdgeBundling(PID=res$PID,OutPath="default",VarsY = "Y2",
  VarsX = "all.x",VarsC = "all.c",Family = "gaussian" ,SizeFor = "pvalue",
  Brightness = "light",Palette = "default1")
```

VizRelatHeatmap

Plot relationship heatmep

### **Description**

Visualize data via heatmap plot.

#### Usage

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## **Arguments**

| PID chr. Program ID. It must be the same with the PID generated by InitViz.  |  |
|--|--|
| OutPath  | chr. Output file directory. e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.   |
| Group lgl.Whether to separate dataset into train and test datasets for data imputation,inc T or F.The default option is F. |  |
| VarsY  | chr. Dependent variables for visualization(e.g. "Y2").   |
| VarsX  | chr. Independent variables. Available options include: "all.x", all independent variables; or input a character string specifying the variables, separated by comma "," without space(e.g. "X4,X5,X6,X7,X8,X9,X10"). |
| Method chr. Method to calculate the correlation. Default option is "spearman".   |  |
| Brightness   | chr. Visualization brightness. Available options include "light" and "dark".   |
| Palette  | chr. Visualization palette. Available options include "default1", "default2" and "Journal". The "Journal" option provides several journal preference styles including cell, nature, science, lancet, nejm, and jama. |

## **Details**

The heatmap plot is used to display data in color changes as a matrix.

#### Value

One or two ggplot plots which can be further modified using the ggplot2 package. When Group=T, (1) "train\_light\_default1": the train dataset visualization result; (2) "test\_light\_default1": the test dataset visualization result. When Group=F, (1) "light\_default1": the whole dataset visualization result.

## Author(s)

Ning Gao, Bin Wang (corresponding author)

```
res = InitViz()
  res1 = LoadViz(PID = res$PID, UseExample = "example#1")
  res2 = VizRelatHeatmap(PID=res$PID,OutPath="default",Group = "F",
  VarsY = "Y2",VarsX = "X1,X4,X5,X6,X7,X8,X9,X10",Method = "spearman",
  Brightness = "light",Palette = "default1")
```

VizRelatMatrix 97

| VizRelatMatrix | Plot relationship matrix |  |
|----------------|--------------------------|--|
|                |                          |  |

## Description

Visualize data via matrix plot.

## Usage

```
VizRelatMatrix(PID,OutPath="default",Group = "F",VarsY,VarsX,Method = "spearman")
```

## **Arguments**

| PID     | chr. Program ID. It must be the same with the PID generated by InitViz.  |
|---------|--|
| OutPath | chr. Output file directory. e.g. "D:/test". It should be noted t hat the slash symbol is "/", not "\". If "default", the current working directory will be set.  |
| Group   | lgl.Whether to separate dataset into train and test datasets for data imputation,including T or F.The default option is F.   |
| VarsY   | chr. Dependent variables for visualization(e.g. "Y2").   |
| VarsX   | chr. Independent variables. Available options include: "all.x", all independent variables; or input a character string specifying the variables, separated by comma "," without space(e.g. "X4,X5,X6,X7,X8,X9,X10"). Notice that no more than 20 variables can be inputed. (< 20 variables). |
| Method  | chr. Method to calculate the correlation. Default option is "spearman".  |

#### **Details**

The matrix plot is used to make a matrix of plots with a given data set.

## Value

One or two ggmatrix plots which can be further modified using the ggplot2 package. When Group=T, (1) "Train": the train dataset visualization result; (2) "Test": the test dataset visualization result. When Group=F, (1) "All": the whole dataset visualization result.

#### Author(s)

Ning Gao, Bin Wang (corresponding author)

```
res = InitViz()
  res1 = LoadViz(PID = res$PID, UseExample = "example#1")
  res2 = VizRelatMatrix(PID=res$PID,OutPath="default",Group = "F",
  VarsY = "Y2",VarsX = "X4,X5,X6,X7,X8,X9,X10",Method = "spearman")
```

98 VizRelatNetwork

|--|

## Description

Visualize data via network plot.

## Usage

```
VizRelatNetwork(PID,OutPath="default",VarsY,VarsC="all.c",VarsX="all.x",
    Family="gaussian",Layout="force-directed",CutOff=0.8,Brightness="light",
    Palette="default1")
```

## Arguments

| PID        | chr. Program ID. It must be the same with the PID generated by InitViz.  |
|------------|--|
| OutPath    | chr. Output file directory. e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.   |
| VarsY      | chr. Specifying the dependent variables(e.g."Y2").   |
| VarsC      | chr. Specifying the covariate variable. Available options include: "all.c", all covariate variables; or input a character string specifying the variables, separated by comma "," without space(e.g. "C1,C2").   |
| VarsX      | chr. Specifying the independent variables. Available options include: "all.x", all independent variables; or input a character string specifying the variables, separated by comma "," without space(e.g. "X4,X5,X6,X7,X8,X9,X10").  |
| Family     | chr. The link function for the regression model according the data type of outcomes, including "gaussian" for continuous variable, "binomial" for binary variable, and "poisson" for counting variable. Notice that the family are determined by data type of an outcome, or the plot can not be visualized. The default option is "gaussian". |
| Layout     | chr. Visualization layout. Available options include "force-directed" and "degree-circle".   |
| CutOff     | num. Partial outcomes to visualize which is determined by correlation coefficient r. The range must between 0 and 1.   |
| Brightness | chr. Visualization brightness. Available options include "light" and "dark".   |
| Palette    | chr. Visualization palette. Available options include "default1", "default2" and "Journal". The "Journal" option provides several journal preference styles including cell, nature, science, lancet, nejm, and jama.   |

## **Details**

The network plot is used to visualize the relationship between the input variables by using ggraph package.

VizSurvAsso 99

## Value

A ggplot plot which can be further modified using the ggplot2 package. (1) "light\_default1": the visualization result;

#### Author(s)

Ning Gao, Bin Wang (corresponding author)

## **Examples**

```
res = InitViz()
    res1 = LoadViz(PID = res$PID, UseExample = "example#1")
    res2 = VizRelatNetwork(PID=res$PID,OutPath="default",VarsY="Y2",VarsC="all.c",
    VarsX="all.x",Family="gaussian",Layout="force-directed",CutOff=0.8,
    Brightness="light",Palette="default1")
```

VizSurvAsso

Visualize association analysis

#### **Description**

Visualize association analysis

#### Usage

```
VizSurvAsso(PID, OutPath = "default", VarsN = "single.factor",
    Layout = "volcano", Brightness = "light", Palette = "default1", ColorFor= "p.value", SizeFor= "p.value"
```

## **Arguments**

| PID        | chr. Program ID. It must be the same with the PID generated by InitSurv()   |
|------------|---|
| OutPath    | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.                        |
| VarsN      | chr. Choose the single factor or multiple factor model. Available options include "single.factor" and "multiple.factor"   |
| Layout     | chr. Visualization layout. Available options include "forest" and "volcano".  |
| Brightness | chr. Visualization brightness. Available options include "light" and "dark".  |
| Palette    | chr. Visualization palette. Available options include "default1", "default2" and several journal preference styles (i.e., "cell", "nature", "science", "lancet", "nejm", and "jama"). |
| ColorFor   | chr. Volcano plot dot color. Available options include "p.value" and "hr".  |
| SizeFor    | chr. Volcano plot dot size. Available options include "p.value" and "hr".   |

## Value

A list containing the results' plot.

100 VizSurvCompGroup

#### Author(s)

Changxin Lan, Ning Gao, Bin Wang(corresponding author)

#### **Examples**

```
res <- InitSurv()
  res1 = LoadSurv(PID = res$PID, UseExample = "example#1")
  res3 = FindCovaSurv(PID=res$PID, TimeY = "Y1", EventY= 'Y2',
  VarsC_Prior = "default", VarsC_Fixed = NULL, Method = "single.factor", Thr = 0.1)
  res4 = SurvAsso(PID=res$PID, TimeY = "Y1", EventY= 'Y2', VarsX='all.x',
  VarsN="single.factor", VarsSel=T, IncCova=T)
  res5 = VizSurvAsso(PID=res$PID, VarsN="single.factor", Layout="volcano", Brightness= "light",
  Palette = "default1", ColorFor= "p.value", SizeFor= "p.value")
  FuncExit(PID = res$PID)</pre>
```

VizSurvCompGroup

Compare the survival curves of two groups

## **Description**

Compare the survival curves of two groups

## Usage

```
VizSurvCompGroup(PID,OutPath = "default",TimeY,EventY,
    VarsG,Model='km',VarsAdj,AdjMethod='average',Brightness = "light",Palette = "default1")
```

## Arguments

Brightness

| PID       | chr. Program ID. It must be the same with the PID generated by InitSurv()   |
|-----------|---|
| OutPath   | chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol is "/", not "\". If "default", the current working directory will be set.                                  |
| TimeY     | chr. Outcome variable of survival time used for modelling. Only one variable can be entered.  |
| EventY    | chr. Outcome variable of status used for modelling. Only one variable can be entered.   |
| VarsG     | chr. Grouping variable, must be a binary variable.  |
| Model     | chr. Methods to depict the survival curve. Options include 'km' (Kaplan-Meier estimate) and "coxph" (Cox proportional hazards regression mode).   |
| VarsAdj   | If you choose the cox model, co-variables used for modelling. It should be noted that there is fixed format for the entering characters separated with comma and without space, e.g., X1,X2,X3. |
| AdjMethod | If you choose the cox model, method for adjusting model, include: "average", "single", "margin" and "conditional".  |

chr. Visualization brightness. Available options include "light" and "dark".

VizSurvPred 101

Palette chr. Visualization palette. Available options include "default1", "default2" and

several journal preference styles (i.e., "cell", "nature", "science", "lancet", "nejm",

and "jama").

#### Value

A list containing the results' plot.

#### Author(s)

Changxin Lan, Ning Gao, Bin Wang(corresponding author)

## **Examples**

```
res <- InitSurv()
  res1 = LoadSurv(PID = res$PID, UseExample = "example#1")
  res6 = VizSurvCompGroup(PID=res$PID,TimeY="Y1",EventY="Y2",VarsG="C3",
  Model="km",Brightness="light",Palette='default1')
  FuncExit(PID = res$PID)</pre>
```

VizSurvPred

Visualize the prediction performance

## **Description**

Visualize the prediction performance

#### Usage

## **Arguments**

PID chr. Program ID. It must be the same with the PID generated by InitSurv()

OutPath chr. Output file directory, e.g. "D:/test". It should be noted that the slash symbol

is "/", not "\". If "default", the current working directory will be set.

Layout chr. Visualization layout. Available options include "curve", "bar" and 'all'.

Brightness chr. Visualization brightness. Available options include "light" and "dark".

Palette chr. Visualization palette. Available options include "default1", "default2" and

several journal preference styles (i.e., "cell", "nature", "science", "lancet", "nejm",

and "jama").

#### Value

A list containing the results' plot.

102 XMIists

#### Author(s)

Changxin Lan, Ning Gao, Bin Wang(corresponding author)

#### **Examples**

```
res <- InitSurv()
  res1 = LoadSurv(PID = res$PID, UseExample = "example#1")
  res3 = FindCovaSurv(PID=res$PID, TimeY = "Y1", EventY= 'Y2',
  VarsC_Prior = "default", VarsC_Fixed = NULL, Method = "single.factor", Thr = 0.1)
  res4 = SurvPred(PID=res$PID, TimeY = "Y1", EventY= 'Y2', VarsX='all.x',
  IncCova=T,RsmpMethod="cv",Folds=3,Ratio=0.667,Repeats=3)
  res5 = VizSurvPred(PID=res$PID,Layout="curve",Brightness="light",Palette='default1')
  FuncExit(PID = res$PID)</pre>
```

XMlists

Divide exposures and mediators into different groups

## **Description**

Divide exposures and mediators into different groups according to the information specified in vocabulary file.

#### Usage

```
XMlists(PID, OutPath)
```

#### **Arguments**

PID chr. Program ID. It must be the same with the PID generated by InitMedt.

OutPath chr. Output file directory, e.g. "D:/output". If "default", the current working directory will be set.It should be noted that the slash symbol is "/", not "\".

#### **Details**

XMlists divides all exposures and mediators into different groups. Therefore, the group information (i.e., the "Subgroup" variable) in vocabulary file is essential for XMlists function. Before using XMlist, the users must provide the information in advance and upload it by LoadMedt function.

#### Value

A list containing two lists where exposure and mediator variables were respectively categorized into subgroups in the form of dataframe. The elements of that list include:

- 1. "ExpoList": a list containing several dataframes that represent various exposure subgroups.
- 2. "MediList": a list containing several dataframes that represent various mediator subgroups.

## Author(s)

Mengyuan Ren, Bin Wang(corresponding author)

XMlists 103

```
res <- InitMedt()
  res1 <- LoadMedt(PID = res$PID, UseExample = "example#1", DataPath = NULL,
  VocaPath = NULL)
  res2 <- XMlists(PID = res$PID)</pre>
```

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