# Package: mwcsr (via r-universe)

September 10, 2024

**Title** Solvers for Maximum Weight Connected Subgraph Problem and Its Variants

Version 0.1.9

Description Algorithms for solving various Maximum Weight Connected Subgraph Problems, including variants with budget constraints, cardinality constraints, weighted edges and signals. The package represents an R interface to high-efficient solvers based on relax-and-cut approach (Álvarez-Miranda E., Sinnl M. (2017) <doi:10.1016/j.cor.2017.05.015>) mixed-integer programming (Loboda A., Artyomov M., and Sergushichev A. (2016) <doi:10.1007/978-3-319-43681-4\_17>) and simulated annealing.

**Depends** R (>= 3.5)

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annealing\_solver

Construct an annealing solver

# Description

Simulated annealing is a heuristic method of solving optimization problems. Typically, it allows to find some good solution in a short time. This implementation doesn't compute any upper bound on solution, so there is no guarantee of optimality of solution provided.

# Usage

```
annealing_solver(
  schedule = c("fast", "boltzmann"),
  initial_temperature = 1,
  final_temperature = 1e-06,
  verbose = FALSE
)
```

bionet\_example 3

### Arguments

schedule boltzmann annealing or fast annealing

initial\_temperature

initial value for the temperature

final\_temperature

final value for the temperature

verbose whether be verbose or not

#### **Details**

Algorithm maintains connected subgraph staring with empty subgraph. Each iteration one random action is considered. It may be a removal of a vertex or an edge which does not separate graph or addition of an extra vertex or an edge neighboring existing graph. If the subgraph is empty all vertices are considered as candidates to form a subgaph. After candidate is chosen two subgraph scores are considered: for a new subgraph and for an old one. Simulated annealing operates with a notion of temperature. The candidate action is accepted with probability: p(S'IS) = exp(-E / T), where E is weight difference between subgraphs and T is current temperature.

Temperature is calculated in each iteration. in mwcsr there are two temperature schedules supported. So called Boltmann annealing uses the formula: T(k) = T0 / (ln(1 + k)), while in case of fast annealing this one is used: T(k) = T0 / k, where k is iteration number.

To tune the algorithm it is useful to realize how typical changes in the goal function for single actions are distributed. Calculating the acceptance probabilities at initial temperature and final temperatures may help to choose schedule and temperatures.

### Value

An object of class mwcs\_solver

# See Also

rnc\_solver will probably be a better choice with minimal tuning necessary

bionet\_example

Example MWCS instance obtained from BioNet package tutorial

### Description

Example MWCS instance obtained from BioNet package tutorial

#### Usage

bionet\_example

### **Format**

An object of class igraph of length 2559.

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gam\_example

GAM instance for MWCS problem

# Description

A dataset containing some real-world instances appeared in network enrichment analysis tool Shiny GAM (doi:10.1093/nar/gkw266).

# Usage

gam\_example

### **Format**

A vector of named vertex-weighted igraph instances

### Source

http://dimacs11.zib.de/instances/MWCS-GAM.zip

gatom\_example

Example of graph from which an SGMWCS instance can be obtained

# Description

The graph is based on gatom package

# Usage

gatom\_example

# **Format**

An object of class igraph of length 194.

get\_instance\_type 5

get\_instance\_type

Check the type and the validity of an MWCS instance

### **Description**

Check the type and the validity of an MWCS instance

### Usage

```
get_instance_type(instance)
```

### **Arguments**

instance

igraph object, containing an instance to be checked

#### Value

A list with members type containing the type of the instance, valid – boolean flag indicating whether the instance is valid or not, errors – a character vector containing the error messages

A list with two fields: the type of the instance with which it will be treated by solve\_mwcsp function and boolean showing validness of the instance.

### **Examples**

```
data(mwcs_example)
get_instance_type(mwcs_example)
```

get\_weight

Calculate weight of the solution. MWCS, GMWCS and SGMWCS instances are supported

# **Description**

Calculate weight of the solution. MWCS, GMWCS and SGMWCS instances are supported

### Usage

```
get_weight(solution)
```

### **Arguments**

solution

Either mwcsp\_solution or 'igraph" object representing the solution

#### Value

Weight of the subgraph

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gmwcs\_example

Example GMWCS instance

# Description

Instance is based on gatom package.

### Usage

gmwcs\_example

### **Format**

An object of class igraph of length 194.

 ${\tt gmwcs\_small\_instance} \quad \textit{Small example of GMWCS instance for demonstration purposes}.$ 

# Description

Small example of GMWCS instance for demonstration purposes.

### Usage

gmwcs\_small\_instance

### **Format**

An object of class igraph of length 5.

mwcs\_example

Example MWCS instance

# Description

Instance is based on gatom package.

### Usage

mwcs\_example

### **Format**

An object of class igraph of length 194.

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mwcs\_small\_instance

Small example of MWCS instance for demonstration purposes.

## **Description**

Small example of MWCS instance for demonstration purposes.

### Usage

```
mwcs_small_instance
```

#### **Format**

An object of class igraph of length 5.

```
normalize_sgmwcs_instance
```

Helper function to convert an igraph object into a proper SGMWCS instance

### **Description**

This function generates new igraph object with additional signals field added. The way the instance is constructed is defined by the function parameters. Nodes and edges are grouped separately, grouping columns are defined by nodes.group.by and edges.group.by arguments.group.only.positive param specifies whether to group only positive-weighted (specified by nodes/edges.weight.column) nodes and edges.

# Usage

```
normalize_sgmwcs_instance(
   g,
   nodes.weight.column = "weight",
   edges.weight.column = "weight",
   nodes.group.by = "signal",
   edges.group.by = "signal",
   group.only.positive = TRUE
)
```

#### **Arguments**

```
g Graph to convert nodes.weight.column
```

Nodes column name (e.g. weight, score, w) for scoring

8 parameters

```
edges.weight.column
Edges column name for scoring

nodes.group.by Nodes grouping column (e.g. signal, group, class)

edges.group.by Edges grouping column

group.only.positive

Whether to group only positive-scored nodes/edges#'
```

### Value

An igraph object with proper attributes set.

# **Examples**

```
data("gatom_example")
normalize_sgmwcs_instance(gatom_example)
```

parameters

The method returns all parameters supported by specific solver

# Description

The method returns all parameters supported by specific solver

### Usage

```
parameters(solver)
```

# Arguments

solver

a solver object

# Value

A table containing parameter names and possible values for each parameter.

rmwcs\_solver 9

rmwcs\_solver

Generate a rmwcs solver

### **Description**

The method is based on relax-and-cut approach and allows to solve Maximum Weight Subgraph Probleam and its budget and cardinality variants. By constructing lagrangian relaxation of MWCS problem necessary graph connectivity constraints are introduced in the objective function giving upper bound on the weight of the optimal solution. On the other side, primal heuristic uses individul contribution of the variables to lagrangian relaxation to find possible solution of the initial problem. The relaxation is then optimized by using iterative subgradient method.

# Usage

```
rmwcs_solver(
   timelimit = 1800L,
   max_iterations = 1000L,
   beta_iterations = 5L,
   separation = "strong",
   start_constraints = TRUE,
   pegging = TRUE,
   max_age = 10,
   sep_iterations = 10L,
   sep_iter_freeze = 50L,
   heur_iterations = 10L,
   subgradient = "classic",
   beta = 2,
   verbose = FALSE
)
```

### **Arguments**

```
timelimit Timelimit in seconds

max_iterations Maximum number of iterations
beta_iterations

Number of nonimproving iterations until beta is halved

separation Separation: "strong" or "fast"

start_constraints

Whether to add flow-conservation/degree constraints at start

pegging variable fixing

max_age number of iterations in aging procedure for non-violated cuts

sep_iterations Frequency of separating cuts (in iterations)

sep_iter_freeze
```

Number of iterations when a newly separated cut is an affected by subgradient algorithm.

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heur\_iterations

Frequency of calling heuristic method (in iterations)

subgradient Subgradient: "classic", "average", "cft" beta Initial step size of subgradient algorithm

verbose Should the solving progress and stats be printed?

#### **Details**

One iteration of algorithm includes solving lagrangian relaxation and updating lagrange multipliers. It may also contain cuts (or connectivity constraints) separation process, run of heuristic method, variable fixing routine. The initial step size for subgradient method can be passed as beta argument. If there is no improvement in upper bound in consequtive beta\_iterations iterations the step size is halved. There are three possible strategies for updating multipliers. See the references section for the article where differences are discussed.

Some initial cuts are added at the start of the algorithm if start\_constraints is set to TRUE. Other constraints are separated on the fly and are unaffected in the next sep\_iter\_freeze iterations of the subgradient mehod. Then the corresponding lagrange mutipliers are updated from iteration to iteration. Aging procedure for cuts is incorporated in the algorithm meaning constraint multipliers are updated for non-violated cuts for up to max\_age iterations from the point where a cut was violated last time. There are two separation methods implemented: fast and strong, where tha latter is supposed to minimize number of variables used in generated constraint while in the former case there is no need to explore whole graph to construct a constraint.

A variant of MST approximation of PCSTP is used as Primal Heuristic. See references for more details.

The frequences of running separation process and heuristic are specified in sep\_iterations and heur\_iterations.

#### Value

An object of class mwcs\_solver.

#### References

Álvarez-Miranda E., Sinnl M. (2017) "A Relax-and-Cut framework for large-scale maximum weight connected subgraph problems" doi:10.1016/j.cor.2017.05.015

rnc\_solver Construct relax-and-cut SGMWCS solver

### **Description**

The solver is based on the same approach as rmwcs solver. Modifications to the original scheme are introduced to tackle problems arising with introduction of edge weights and signals. It is recommended to use rmwcs solver to solve MWCS problems, while due to differences in primal heuristic it may be a good pratice to run both solvers on the same problem.

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### Usage

```
rnc_solver(
  max_iterations = 1000L,
  beta_iterations = 50L,
  heur_iterations = 10L,
  sep_iterations = 10L,
  verbose = FALSE
)
```

### Arguments

```
max_iterations Maximum number of iterations
beta_iterations
Number of nonimproving iterations until beta is halved
heur_iterations
Frequency of calling heuristic method (in iterations)
sep_iterations
Frequency of separating cuts (in iterations)
verbose
Should the solving progress and stats be printed?
```

#### Value

An object of class mwcs\_solver

### See Also

rmwcs\_solver

scipjack\_solver

Construct a SCIP-jack solver

# Description

This solver requires STP extension of SCIP-jack solver. To use this class you first need to download and build SCIP-jack and SCIPSTP application.

### Usage

```
scipjack_solver(scipstp_bin, config_file = NULL)
```

# Arguments

```
scipstp_bin path to scipstp binary.

config_file scipstp-formatted file. Parameters list is accessible at Official SCIP website.
```

### **Details**

You can access solver directly using run\_scip function. See example.

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### References

Rehfeldt D., Koch T. (2019) "Combining NP-Hard Reduction Techniques and Strong Heuristics in an Exact Algorithm for the Maximum-Weight Connected Subgraph Problem." doi:10.1137/17M1145963

## **Examples**

```
## Not run:
data("bionet_example")
scip <- scipjack_solver(scipstp_bin='/path/to/scipoptsuite/build/bin/applications/scipstp')
sol <- solve_mwcsp(scip, bionet_example)
## End(Not run)</pre>
```

set\_parameters

Sets values of specific parameters

# Description

Sets values of specific parameters

# Usage

```
set_parameters(solver, ...)
```

### **Arguments**

solver a solver

. . . listed parameter names and values assigned to them

### Value

The solver with parameters changed.

sgmwcs\_example

Example SGMWCS instance

# Description

Instance is based on gatom package.

## Usage

```
sgmwcs_example
```

### **Format**

An object of class igraph of length 194.

sgmwcs\_small\_instance

sgmwcs\_small\_instance Small example of SGMWCS instance for demonstration purposes.

### **Description**

Small example of SGMWCS instance for demonstration purposes.

# Usage

```
sgmwcs_small_instance
```

#### **Format**

An object of class igraph of length 6.

solve\_mwcsp

Solves a MWCS instance.

### **Description**

Generic function for solving MWCS instances using solvers collected in the package.

# Usage

```
solve_mwcsp(solver, instance, ...)
## S3 method for class 'virgo_solver'
solve_mwcsp(solver, instance, ...)
## S3 method for class 'rmwcs_solver'
solve_mwcsp(solver, instance, max_cardinality = NULL, budget = NULL, ...)
## S3 method for class 'rnc_solver'
solve_mwcsp(solver, instance, ...)
## S3 method for class 'simulated_annealing_solver'
solve_mwcsp(solver, instance, warm_start, ...)
## S3 method for class 'scipjack_solver'
solve_mwcsp(solver, instance, ...)
```

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### Arguments

solver a solver object returned by rmwcs\_solver, annealing\_solver, rnc\_solver or virgo\_solver.

instance an MWCS instance, an igraph object with problem-related vertex, edge and

graph attributes. See details.

... other arguments to be passed.

max\_cardinality

integer maximum number of vertices in solution.

budget numeric maximum budget of solution.

warm\_start warm start solution, an object of the class mwcsp solution.

#### **Details**

MWCS instance here is represented as an undirected graph, an igraph object. The package supports four types of instances: Simple MWCS, Generalized MWCS, Budget MWCS, signal MWCS problems. All the necessary weights and costs are passed by setting vertex and edge attributes. See get\_instance\_type to check if the igraph object is a correct MWCS instance. For Simple MWCS problem numeric vertex attribute weight must be set. For generalized version weights can be provided for edges. For budget version of the problem in addition to vertex weights it is required that igraph object would have budget\_cost vertex attribute with positive numeric values.

Signal MWCS instance is quite different. There is no weight attribute for neither vertices nor edges. Instead, vertex and edge attribute signal should be provided with signal names. A numeric vector containing weights for the signals should be assigned to graph attribute signals.

See vignette for description of the supported problems. See igraph package documentation for more details about getting/setting necessary attributes.

#### Value

An object of class mwcsp\_solution consisting of resulting subgraph, its weight and other information about solution provided.

### **Examples**

```
library(igraph)
# for a MWCS instance

data(mwcs_example)
head(V(mwcs_example)$weight)
# for a GMWCS instance
data(gmwcs_example)
head(E(gmwcs_example)$weight)
# for a SGMWCS instance
data(sgmwcs_example)
head(V(sgmwcs_example)$signal)
head(E(sgmwcs_example)$signal)
```

timelimit<-

```
head(sgmwcs_example$signals)
```

timelimit<-

Sets time limitation for a solver

### **Description**

Sets time limitation for a solver

### Usage

```
timelimit(x) \leftarrow value
```

### **Arguments**

```
x a variable name.
```

value a value to be assigned to x.

### Value

The solver with new timelimit set.

virgo\_solver

Construct a virgo solver

### **Description**

This solver uses reformulation of MWCS problem in terms of mixed integer programming. The later problem can be efficiently solved with commercial optimization software. Exact version of solver uses CPLEX and requires it to be installed. CPLEX 12.7.1 or higher is required.

### Usage

```
virgo_solver(
  cplex_dir,
  threads = parallel::detectCores(),
  timelimit = NULL,
  penalty = 0,
  memory = "2G",
  log = 0,
  cplex_bin = NULL,
  cplex_jar = NULL,
  mst = FALSE,
  dryrun = FALSE,
  jvmargs = NULL
)
```

virgo\_solver

# **Arguments**

cplex\_dir a path to dir containing cplex\_bin and cplex\_jar, setting this to NULL sets mst`` param to TRUE'

threads number of threads for simultaneous computation timelimit maximum number of seconds to solve the problem

penalty additional edge penalty for graph edges memory maximum amount of memory(-Xmx flag)

log verbosity level

cplex\_bin a path to cplex binary dir cplex\_jar a path to cplex jar file

mst whether to use approximate MST solver, no CPLEX files required with this

parameter is set to TRUE

dryrun if set to TRUE only prints the solver command, without actually running it jvmargs character vector with additional arguments for Java Virtual Machine

#### **Details**

The solver currently does not support repeated negative signals, i.e. every negative signal should be present only once among all edges and vertices.

You can access solver directly using run\_main function. See example.

#### Value

An object of class mwcs\_solver.

### References

Loboda A., Artyomov M., and Sergushichev A. (2016) "Solving generalized maximum-weight connected subgraph problem for network enrichment analysis" doi:10.1007/9783319436814\_17

# **Examples**

```
data("sgmwcs_small_instance")
approx_vs <- virgo_solver(mst=TRUE, threads = 1)
approx_vs$run_main("-h")
sol <- solve_mwcsp(approx_vs, sgmwcs_small_instance)
## Not run:
vs <- virgo_solver(cplex_dir='/path/to/cplex')
sol <- solve_mwcsp(approx_vs, sgmwcs_example)
## End(Not run)</pre>
```

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