### **GODLIKE**

GODLIKE is an abbreviation of Global Optimum Determination by Linking and Interchanging Kindred Evaluators. This algorithm is an attempt to generalize and improve the robustness of the four meta-heuristic optimization algorithms GA, PSO, DE and ASA, and generalize the optimization process by being capable to solve both single-objective and multi-objective optimization problems.

# Using GODLIKE for Single-Objective Optimization Problems

#### Typical Usage

Simple usage for single-objective problems is

```
[solution, function_value] = ...
GODLIKE(obj_function, popsize, lb, ub)
```

which returns the solution vector solution with associated [function\_value], which is the global minimum of the objective function obj\_function. The (total) population size to use is set by the positive integer popsize. The upper and lower bounds in each dimension is set by the arguments 1b and ub.

Output arguments:

**solution** the solution vector returned. It is always a row-vector of size  $[1 \times dimensions]$ .

**function\_value** the function value associated with the solution vector; the globally minimum function value. It is always a scalar  $[1 \times 1]$  value.

Input Arguments:

- **obj\_function** The user-provided objective function **obj\_function** must be a function handle to an anonymous (inline) function or a function in MAT-LAB's current path. This function must accept arguments in the same format as 1b or ub are given in, and return a scalar value.
- **popsize** This is the *total* population size GODLIKE will use, for *all* the algorithms combined. So at any point there will be no more than this amount of individuals in any of the algorithms.
- Ib & ub In case all bounds are the same for every dimension, either 1b or ub can be a scalar, in which case it is simply resized to the problem's dimensions. However, it is important to note that the dimension of the problem (the length of each trial solution, or equivalently, the number of decision variables) is determined by the maximum size or either 1b or ub. So at least one of the arguments 1b or ub must have the same size as the problem's dimensions.

All four of these input arguments are mandatory.

#### Extended Usage

An example of the most extended usage is

```
[solution, function_value, exitflag, output] = ...
GODLIKE(obj_function, popsize, lb, ub, which_ones, 'option',
    'value', ...)
or equivalently,
options = set_options('option', 'value', ...)
[solution, function_value, exitflag, output] = ...
GODLIKE(obj_function, popsize, lb, ub, which_ones, options)
```

All of the arguments are the same as before. However, the additional arguments (which may also be empty) are Additional Input Arguments:

which\_ones A single string, or cell-array of strings, that define which optimization algorithms will be used for the optimization. If omitted or empty, the
default is which\_ones = {'DE'; 'ASA'; 'PSO'; 'GA'} (All algorithms).
The strings must be either 'DE', 'ASA', 'PSO' or 'GA' (capitalization
not important). Note that also multiple of the same algorithms can be
used; for example which\_ones = {'DE'; 'DE'} will use two separate DEoptimizers.

options (or ('option', value) pairs) These set the options to be used by GODLIKE. The argument options may be provided as a structure created by the function set\_options, or more directly as ('option', value) pairs. As the possible options are quite numerous, these have been placed in their own section (see below).

Additional Output Arguments:

exitflag A simple value which informs the user of the conditions under which GODLIKE exited. As usual, positive values are "good", negative values are "bad". A value of 1 indicates normal convergence: the global optimum found by GODLIKE decreased less than options.MinDescent(1) \* options.MinDescentMultiplier for more than options.MinDescent(2) GODLIKE iterations. A value of -1 indicates the loop was exited because the maximum amount of function evaluations had been exceeded, set by options.MaxFunEvals. A value of -2 means that GODLIKE terminated because the maximum amount of GODLIKE iterations has been exceeded, set by options.MaxIters.

**output** A structure that contains the following fields:

algorithms lists the algorithms used in the optimization.

**message** A message that contains a description of the reason GODLIKE terminated.

algorithm\_info A structure that contains more information on each of the optimizers. It contains the total number of function evaluations made by that optimizer, the total number of iterations made, and the population and fitness values of the last population before termination.

funcCount total number of function evaluations made.

iterations total number of GODLIKE iterations made.

## Using GODLIKE for Multi-Objective Optimization Problems

#### Usage

Using multi-objective optimization is very much the same as single-objective optimization. Just include additional objective functions:

```
[solution, func_value, ...
Pareto_individuals, Pareto_fitnesses,...
exitflag, output] = ...
GODLIKE({obj_function1, obj_function2,...}, popsize, lb, ub,...
which_ones, options)
```

where everything is the same as in single-objective optimization, except for the arguments Pareto\_individuals and Pareto\_fitnesses; these are the [popsize × dimensions] non-dominated individuals and [popsize × number\_of\_objectives] associated function values.

The globally most efficient point is computed by first shifting the whole front to a new origin, defined by the outermost individuals in function-value space, followed by finding the individual that has the minimum distance to that origin (again in function-value space). Note that the output argument func\_value is now a [popsize × number\_of\_objectives] matrix.

The above may also be accomplished by issuing the command

```
[solution, func_value, ...
Pareto_individuals, Pareto_fitnesses,...
exitflag, output] = ...
GODLIKE(obj_function, popsize, lb, ub, ...
which_ones,options)
```

when obj\_function is a single function that returns multiple function values in one [popsize  $\times$  num\_of\_objectives] matrix (or 1  $\times$  num\_of\_objectives] if it only accepts [1  $\times$  dimensions] input).

### **Available Options**

individual options may be set directly by providing ('parameter', value) pairs to GODLIKE, or by first creating a structure in the same way using set\_options. Here is a direct copy from the help on the function set\_options, which lists all the available options:

```
% SET_OPTIONS
                             Set options for the various optimizers
% Usage:
%
%
    options = set_options('option1', value1, 'option2', value2, ...)
%
%
%
   SET_OPTIONS is an easy way to set all options for the global optimization
%
   algorithms PSO, DE, GA, ASA in GODLIKE. All options, and their possible
%
   values are:
%
%
%
   General Settings:
%
   ______
%
       Display: string, either 'off' (default), 'on' or 'CommandWindow',
%
                 'Plot'. This option determines the type of display that
%
                 is used to show the algorithm's progress. 'CommandWindow'
%
                 (or simply 'on') will show relevant information in the
%
                 command window, whereas 'Plot' will make a plot in every
%
                 iteration of the current population. Note that 'Plot'
%
                 will only work if the number of decision variables is 1
%
                 or 2 in case of single-pbjective optimization, or between
%
                 1 and 3 objectives for multi-objective optimization.
%
                 Please note that using any other display setting than
%
                 'off' can significantly slow down the optimization.
%
   MaxFunEvals : positive scalar, defining the maximum number of
%
                 allowable function evaluations. The default is 100,000.
%
                 Note that every objective and constraint function
%
                 evaluation will be counted as 1 function evaluation. For
%
                 multi-objective optimization, each objective function
%
                 will be counted.
%
      MaxIters : positive scalar, defining the maximum number of
%
                 iterations that can be performed. The default is 20.
%
      MinIters : positive scalar. This option defines the minimum amount
%
                 of iterations GODLIKE will perform. This is particularly
%
                 useful in multi-objective problems with small population
%
                 sizes, because this combination increases the probability
%
                 that GODLIKE reports convergence (all fronts are Pareto
                 fronts), while a Pareto front of much better quality is
```

% obtained if some additional shuffles are performed. The % default value is 2. % % \_\_\_\_\_\_ % Options specific to the GODLIKE Algorithm: % \_\_\_\_\_\_ % ItersLb : positive scalar. This sets the minimum number of % iterations that will be spent in one of the selected % heuristic optimizers, per GODLIKE iteration. The default % value is 10. % ItersUb: positive scalar. This sets the maximum TOTAL amount of % iterations that will be spent in all of the selected % heuristic optimizers combined. The default value is 100. % % \_\_\_\_\_ % General Settings for Single-Objective Optimization: % \_\_\_\_\_\_ % TolIters: positive scalar. This option defines how many consecutive % iterations the convergence criteria must hold for each % individual algorithm, before that algorithm is said to % have converged. The default setting is 15 iterations. % TolX: positive scalar. Convergence is assumed to be attained, % if the coordinate differences in all dimensions for a % given amount of consecutive iterations is less than % [TolX]. This amount of iterations is [TolIters] for each % individual algorithm, and simply 2 for  ${\tt GODLIKE-iterations}$ . % The default value is 1e-4. % TolFun : positive scalar. Convergence is said to have been % attained if the value of the objective function decreases % less than [TolFun] for a given amount of consecutive % iterations. This amount of iterations is [TolIters] for % each individual algorithm, and simply 2 for the % GODLIKE-iterations. The default value is 1e-4. AchieveFunVal : scalar. This value is used in conjunction with the % % [TolX] and [TolFun] settings. If set, the algorithm will % FIRST try to achieve this function value, BEFORE enabling % the [TolX] and [TolFun] convergence criteria. By default, % it is switched off (equal to AchieveFunVal = inf). % % \_\_\_\_\_\_ % General Settings for Multi-Objective Optimization: % % SkipTest : If set to 'on', some initial tests that are performed on % the objective and constraint functions. These tests % automatically determine whether the function accepts % vectorized input or not, and how many objectives the

% problem has. The default is 'on', but it may be switched 'off'. In case it's switched 'off', the algorithm assumes % % all functions accept vectorized input, AND the number of % objectives (the next option) has been given, AND the % dimensionality of the problem is also given (two options % down). The 'off'-switch will be ignored if either of these % demands is not true. % NumObjectives: Positive scalar. Sets the number of objectives manually. % When the objective function is a single function that % returns multiple objectives, the algorithm has to first % determine how many objectives there are. This takes some % function evaluations, which may be skipped by setting this % value manually. % % \_\_\_\_\_ % Options specific to the Differential Evolution algorithm: % \_\_\_\_\_\_ % Flb : scalar. This value defines the lower bound for the range % from which the scaling parameter will be taken. The % default value is -1.5. % Fub : scalar. This value defines the upper bound for the range % from which the scaling parameter will be taken. The % default value is +1.5. These two values may be set equal % to each other, in which case the scaling parameter F is % simply a constant. % CrossConst : positive scalar. It defines the probability with which a % new trial individual will be inserted in the new % population. The default value is 0.95. % % \_\_\_\_\_\_ % Options specific to the Genetic Algorithm: % \_\_\_\_\_\_ % Crossprob : positive scalar, defining the probability for crossover % for each individual. The default value is 0.25. % MutationProb : positive scalar, defining the mutation probability for % each individual. The default value is 0.1. % Coding: string, can either be 'binary' or 'real'. This decides % the coding, or representation, of the variables used by % the genetic algorithm. The default is 'Binary'. % NumBits : positive scalar. This options sets the number of bits % to use per decision variable, if the 'Coding' option is % set to 'Binary'. Note that this option is ignored when % the 'Coding' setting is set to 'real'. The default

number of bits is 52 (maximum precision).

%

%

```
Options specific to the Adaptive Simulated Annealing Algorithm:
   ______
%
%
               TO: positive scalar. This is the initial temperature for
%
                    all particles. If left empty, an optimal one will be
%
                    estimated; this is the default.
%
  CoolingSchedule : function handle, with [iteration], [T0], and [T] as
%
                    parameters. This function defines the cooling schedule
%
                    to be applied each iteration. The default is
%
%
                      @(T,T0,iteration) T0 * 0.87^iteration
%
%
                    It is only included for completeness, and testing
%
                    purposes. Only in rare cases is it beneficial to change
%
                    this setting.
%
        ReHeating: positive scalar. After an interchange operation in
%
                    GODLIKE, the temperature of an ASA population should
%
                    be increased to allow the new individuals to move
%
                    over larger portions of the search space. The default
%
                    value is
%
%
%
   Options specific to the Particle Swarm Algorithm:
%
   ______
%
           eta1 : scalar < 4. This is the 'social factor', the
%
                  acceleration factor in front of the difference with the
%
                  particle's position and its neighbrhood-best. The
%
                  default value is 2. Note that negative values result in
%
                  a Repulsive Particle Swarm algorithm.
%
           eta2 : scalar < 4. This is the 'cooperative factor', the
%
                  acceleration factor in front of the difference with the
%
                  particle's position and the location of the global
%
                  minimum found so far. The default value is 2.
%
           eta3 : scalar < 4. This is the 'nostalgia factor', the
%
                  acceleration factor in front of the difference with the
%
                  particle's position and its personal-best. The default
%
                  value is 0.5.
%
          omega : scalar. This is the 'inertial constant', the tendency of
%
                  a particle to continue its motion undisturbed. The
%
                  default value is 0.5.
%
   NumNeighbors: positive scalar. This defines the maximum number of
%
                  'neighbors' or 'friends' assigned to each particle. The
                  default value is 5.
% NetworkTopology: string, equal to either 'fully_connected', 'star', or
%
                  'ring'. This defines the topology of the social network
%
                  for each particle. In case 'star' is selected (the
%
                  default), the setting for NumNeighbors will define the
```

```
total number of partiles per star; the same holds in
case 'ring' is selected. When 'fully_connected' is
selected however, the value for NumNeighbors will be
ignored (all particles are connected to all other
particles).

see also GODLIKE, pop_multi, pop_single.
```