
Panobbgo Documentation

Release 0.0.1pre

Harald Schilly

July 09, 2013

CONTENTS

| | | |
|----------|----------------------------|-----------|
| 1 | Introduction | 1 |
| 2 | Main | 3 |
| 2.1 | Core | 3 |
| 2.2 | Strategies | 6 |
| 2.3 | Heuristics | 6 |
| 2.4 | Configuration | 7 |
| 2.5 | User Interface | 7 |
| 3 | Library | 9 |
| 3.1 | Classic Problems | 9 |
| 3.2 | Library Classes | 11 |
| 4 | Examples | 15 |
| 5 | Links | 17 |
| | Bibliography | 19 |
| | Python Module Index | 21 |
| | Index | 23 |

INTRODUCTION

Warning: It is currently work in progress and definitely not ready for any kind of usage.

Panobbgo is an open-source framework for parallel noisy black-box global optimization. The primary aim is to experiment with new ideas and algorithms. A couple of functional building blocks build the solver and exchange information via an `EventBus` among each other. This allows to rapidly prototype new modules and to combine them with existing parts. There are three basic types of parts that work together:

- the `Strategy`
- several `Heuristics`
- and `Analyzers`

Various tools for extracting statistical data and inspecting the optimization process are included (*planned*). Additionally, parallel evaluation of the objective black-box function can be archived as SMP or on a cluster via IPython [IP].

In the background, there are additional utility features for the configuration and dependency management (*planned*) available.

This software package is licensed under the [Apache 2.0 License](#).

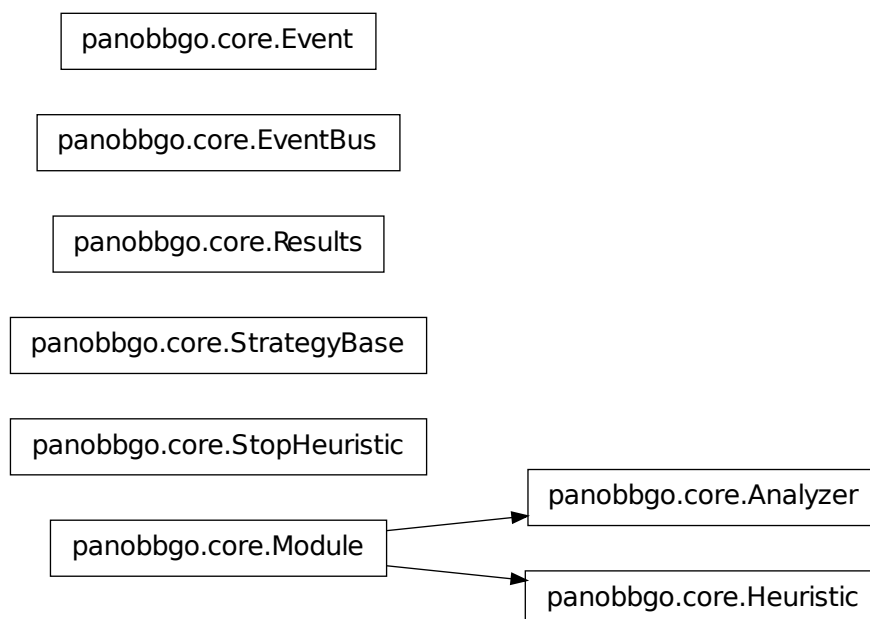
MAIN

This is the main part of Panobbgo.

2.1 Core

This is the core part. It contains the essential components and base-classes for the modules:

- `Results`: Database of all results, with some rudimentary queries and statistics.
- `EventBus`: This is the backbone for communicating between the strategy, the heuristics and the analyzers.
- “abstract” base-classes for the modules
 - `heuristics`
 - `analyzers`.
- and most importantly, the `StrategyBase` which holds everything together and subclasses in `strategies` implement the actual strategies.



class `panobbgo.core.Analyzer` (*name=None*)

Bases: `panobbgo.core.Module`

Abstract parent class for all types of analyzers.

class `panobbgo.core.Event` (***kwargs*)

Bases: `object`

This class holds the data for one single `EventBus` event.

class `panobbgo.core.EventBus`

Bases: `object`

This event bus is used to publish and send events. E.g. it is used to send information like “new best point” to all subscribing heuristics.

keys

List of all keys where you can send an `Event` to.

publish (*key, event=None, terminate=False, **kwargs*)

Publishes a new `Event` to all subscribers, who listen to the given `key`. It is either possible to send an existing event or to create an event object on the fly with the given `**kwargs`.

Args:

- **event**: if set, this given `Event` is sent (and not a new one created).
- **terminate**: if **True**, the associated thread will end. (use it for `on_start` and similar).
- ****kwargs**: any additional keyword arguments are stored inside the `Event` if `event` is `None`.

re = `<module 're' from '/usr/lib/python2.7/re.pyc'>`

register (*target*)

Registers a given `target` for this `EventBus` instance. It needs to have suitable `on_<key>` methods. For each of them, a `Thread` is spawn as a daemon.

subscribe (*key, target*)

Called by `register()`.

Note: counterpart is `unsubscribe()`.

unsubscribe (*key, target*)

Args:

- if `key` is `None`, the `target` is removed from all keys.

class `panobbgo.core.Heuristic` (*name=None, cap=None*)

Bases: `panobbgo.core.Module`

This is the “abstract” parent class for all types of point generating classes, which we call collectively “`Heuristics`”.

Such a heuristic is capable of the following:

- 1.They can be parameterized by passing in optional arguments in the constructor. This should be reflected in the `name`!
- 2.The `EventBus` spawns a thread for each `on_*` method and calls them when a corresponding `Event` occurs.
- 3.Of course, they are capable of storing their state in the instance. This is also the way of how information is shared between those threads.
- 4.The *main purpose* of a heuristic is to emit new search points by calling either `emit()` or returning a list of points. The datatype must be `numpy.ndarray` of `floats`.
- 5.Additionally, the can get hold of other heuristics or analyzers via the strategy instance.

6. The `EventBus` inside this strategy instance allows them to publish their own events, too. This can be used to signal related heuristics something or to queue up tasks for itself.

active

This is queried by the strategy to determine, if it should still consider it. This is the case, iff there is still something in its output queue or if there is a chance that there will be something in the future (at least one thread is running).

clear_output ()**emit (points)**

This is used to send out new search points for evaluation. Args:

- `points`: Either a `numpy.ndarray` of `float64` or preferably a list of them.

get_points (limit=None)

this drains the output Queue until `limit` elements are removed or the Queue is empty. For each actually emitted point, the performance value is discounted (i.e. “punishment” or “energy consumption”)

class `panobbgo.core.Module (name=None)`

Bases: `object`

“Abstract” parent class for various panobbgo modules, e.g. `Heuristic` and `Analyzer`.

eventbus**name**

The module’s name.

Note: It should be unique, which is important for parameterized heuristics or analyzers!

problem**results****strategy****ui**

class `panobbgo.core.Results (strategy)`

Bases: `object`

A very simple database of results with a notification for new results. The new results are fed directly by the `StrategyBase`, outside of the `EventBus`.

Note: Later on, maybe this will be a cool actual database which allows to persistently store past evaluations for a given problem. This would allow resuming and further a-posteriori analysis.

add_results (new_results)

Add one single or a list of new `@Result` objects. Then, publish a `new_result` event.

info ()**n_best (n)**

exception `panobbgo.core.StopHeuristic (msg='stopped')`

Bases: `exceptions.Exception`

Indicates the heuristic has finished and should be ignored/removed.

Args:

- `msg`: a custom message, will be visible in the log. (default: “stopped”)

class `panobbgo.core.StrategyBase (problem, heurs)`

Bases: `object`

This abstract `BaseStrategy` is the parent class of all `Strategies`.

Use it this way:

1. Subclass it, write your optional initializer, *afterwards* call the initializer of this class (it will start its the main loop).
2. Overwrite the `execute()`, which returns a list of new search points (by requesting them from the `heuristics` via the `get_points()` method) and might also emit `Events`.

This `execute` method will be called repeatedly as long as there are less than the given maximum number of search points evaluated.

PROBLEM_KEY = 'problem'

add_analyzer (*a*)

add_heuristic (*h*)

analyzer (*who*)

avg_time_per_task

best

execute ()

Overwrite this method when you extend this base strategy.

heuristic (*who*)

heuristics

info ()

init_module (*module*)

StrategyBase calls this method.

name

run ()

time_cpu

effective cpu time in seconds

time_start_str

time_wall

wall time in seconds

2.2 Strategies

This part outlines the coordination between the point-producing heuristics, the interaction with the cluster and the `DB of evaluated points`.

Basically, one or more threads produce points where to search, and another one consumes them and dispatches tasks. Subclass the `StrategyBase` class to implement a new strategy.

2.3 Heuristics

The main idea behind all heuristics is, ...

Each heuristic needs to listen to at least one stream of `Events` from the `EventBus`. Most likely, it is the *one-shot* event `start`, which is `published` by the `StrategyBase`.

2.4 Configuration

It's purpose is to parse a config file (create a default one if none is present) and replace values stored within it with those given via optional command-line arguments.

Note: This will also hold a class for configuring the Panobbgo framework in general. I.e. modules declare other modules as dependencies, etc...

```
class panobbgo.config.Config
    Bases: object

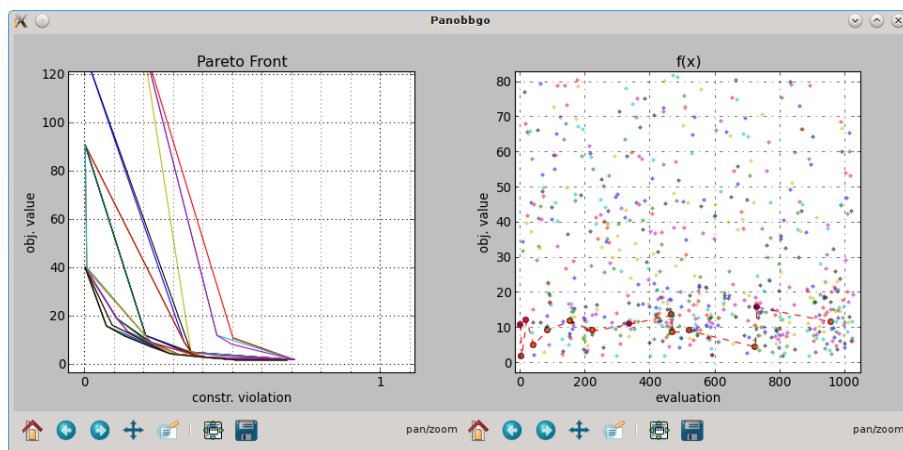
    debug

    get_logger (name, loglevel=None)

panobbgo.config.get_config()
```

2.5 User Interface

This draws a window and plots graphs.



```
class panobbgo.ui.UI
    Bases: panobbgo.core.Module, gtk.Window, threading.Thread

    UI

    add_notebook_page (label_text, frame)

    destroy (win)

    finish ()
        called by base strategy in _cleanup for shutdown

    static mk_canvas ()
        Creates a FigureCanvas, ready to be added to a gtk layout element

    redraw_canvas (c)
        If your canvas needs to be redrawn, pass it into this function.

    run ()

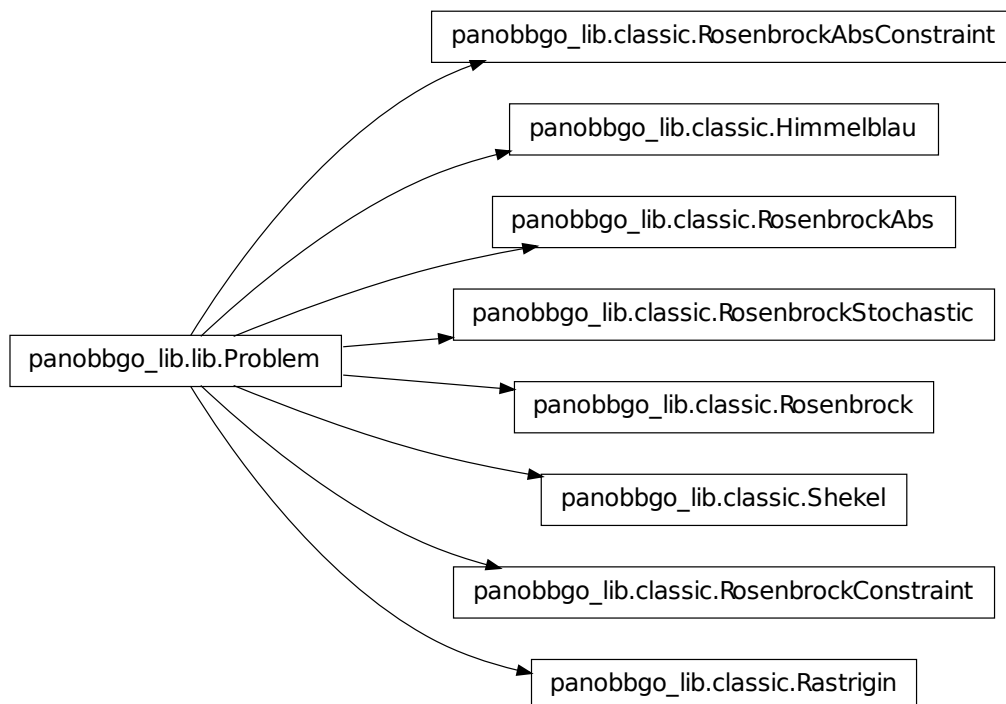
    show ()
```


LIBRARY

This is the *library* of Panobbgo, used by the main part and the library. For example, the basic `Problem` class is defined here.

3.1 Classic Problems

This file contains the basic objects to build a problem and to do a single evaluation.



```
class panobbgo_lib.classic.Himmelblau
```

```
    Bases: panobbgo_lib.lib.Problem
```

```
    Himmelblau [HB] testproblem.
```

$$f(x, y) = (x^2 + y - 11)^2 + (x + y^2 - 7)^2$$

eval (x)

class panobbgo_lib.classic.**Rastrigin** ($dims, par1=10, offset=0$)

Bases: panobbgo_lib.lib.Problem

Rastrigin

$$f(x) = par_1 \cdot n + \sum_i (x_i^2 - 10 \cos(2\pi x_i))$$

eval (x)

class panobbgo_lib.classic.**Rosenbrock** ($dims, par1=100$)

Bases: panobbgo_lib.lib.Problem

Rosenbrock function with parameter par1.

$$f(x) = \sum_i (par_1(x_{i+1} - x_i^2)^2 + (1 - x_i)^2)$$

eval (x)

class panobbgo_lib.classic.**RosenbrockAbs** ($dims, par1=100$)

Bases: panobbgo_lib.lib.Problem

Absolute Rosenbrock function.

$$f(x) = \sum_i par_1 \left(\|x_{i+1} - \|x_i\|\| + \|1 - x_i\| \right)$$

eval (x)

class panobbgo_lib.classic.**RosenbrockAbsConstraint** ($dims, par1=100, par2=0.1$)

Bases: panobbgo_lib.lib.Problem

Absolute Rosenbrock function.

$$\begin{aligned} \min f(x) &= \sum_i par_1 \left(\|x_{i+1} - \|x_i\|\| + \|1 - x_i\| \right) \\ s.t. \quad &\|x_{i+1} - x_i\| \geq par_2 \quad \forall i \in \{0, \dots, dim - 1\} \\ &x_i \geq 0 \quad \forall i \end{aligned}$$

eval (x)

eval_constraints (x)

class panobbgo_lib.classic.**RosenbrockConstraint** ($dims, par1=100, par2=0.25$)

Bases: panobbgo_lib.lib.Problem

Constraint Rosenbrock function with parameter par1 and par2.

$$\begin{aligned} \min f(x) &= \sum_i par_1 (x_{i+1} - x_i^2)^2 + (1 - x_i)^2 \\ s.t. \quad &(x_{i+1} - x_i)^2 \geq par_2 \quad \forall i \in \{0, \dots, dim - 1\} \\ &x_i \geq 0 \quad \forall i \end{aligned}$$

eval (x)

eval_constraints (x)

class `panobbgo_lib.classic.RosenbrockStochastic` (*dims*, *par1=100*, *jitter=0.1*)

Bases: `panobbgo_lib.lib.Problem`

Stochastic variant of Rosenbrock function.

$$f(x) = \sum_i (par_1 eps_i (x_{i+1} - x_i^2)^2 + (1 - x_i)^2)$$

where eps_i is a uniformly random (n-1)-dimensional vector in $[0, 1)^{n-1}$.

eval (*x*)

class `panobbgo_lib.classic.Shekel` (*dims*, *m=10*, *a=None*, *c=None*)

Bases: `panobbgo_lib.lib.Problem`

Shekel Function [SH].

For m minima in n dimensions:

$$f($$

$$ec\{x\} = \sum_{i=1}^m \frac{1}{c_i} + \sum_{j=1}^n (x_j - a_{ji})^2$$

eval (*x*)

3.2 Library Classes

This file contains the basic objects to build a problem and to do a single evaluation.

panobbgo_lib.lib.Point

panobbgo_lib.lib.Result

panobbgo_lib.lib.Problem

Note: This is used by `panobbgo` and `panobbgo_lib`.

class `panobbgo_lib.lib.Point` (*x*, *who*)

Bases: `object`

This contains the *x* vector for a new point and a reference to *who* has generated it.

who

A string, which is the *name* of a heuristic.

To get the actual heuristic, use the *strategie's* `heuristic` method.

x

The vector *x*, a `numpy.ndarray`

class `panobbgo_lib.lib.Problem(box)`

Bases: `object`

this is used to store the objective function, information about the problem, etc.

`box` must be a list of tuples, which specify the range of each variable.

example: `[(-1, 1), (-100, 0), (0, 0.01)]`.

box

The bounding box for this problem, a `(dim, 2)-array`.

Note: This might change to a more sophisticated `Box` object.

dim

The number of dimensions.

eval(`x`)

This is called to evaluate the given black-box function. The problem should be called directly (`__call__` special function wraps this) and the given problem should subclass this `eval` method.

eval_constraints(`x`)

This method is optionally overwritten by the problem to calculate the constraint violations. It has to return a `numpy.ndarray` of floats.

project(`point`)

projects given point into the search box. e.g. `[-1.1, 1]` with box `[(-1, 1), (-1, 1)]` gives `[-1, 1]`

random_point()

generates a random point inside the given search box (ranges).

ranges

The ranges along each dimension, a `numpy.ndarray`.

class `panobbgo_lib.lib.Result(point, fx, cv_vec=None, cv_norm=None, error=0.0)`

Bases: `object`

This represents one result, which is a mapping of a `Point` $x \rightarrow f(x)$.

Additionally, there is also

- error**: estimated or calculated $\Delta f(x)$.
- cv_vec**: a possibly empty vector listing the constraint violation for each constraint.
- cnt**: An integer counter, starting at 0.

Args:

- cv**: the constraint violation vector
- cv_norm**: the norm used to calculate **cv**. (see `numpy.linalg.norm()`, default `None` means 2-norm)

cnt

Integer ID for this result.

cv

The chosen norm of **cv_vec**; see **cv_norm** in constructor.

Note: Only the positive entries are used to calculate the norm!

cv_vec

Vector of constraint violations for each constraint, or `None`.

Note: Be aware, that entries could be negative. This is useful if you want to know how well a point is satisfied. The `.cv` property just looks at the positive entries, though.

error

Error margin of function evaluation, usually 0.0.

fx

The function value $f(x)$ after `evaluating` it.

point

Returns the actual `Point` object.

pp

pareto point, i.e. `array([cv, fx])`

who

The `name` of the heuristic, who did generate this point (String).

x

Point x where this result has been evaluated.

EXAMPLES

- ex1
- ex2

LINKS

- [source repository](#)
- [short introduction talk](#)
- Indices and Tables
 - *genindex*
 - *modindex*
 - *search*

BIBLIOGRAPHY

[HB] http://en.wikipedia.org/wiki/Himmelblau%27s_function

[SH] http://en.wikipedia.org/wiki/Shekel_function

[IP] <http://www.ipython.org>

PYTHON MODULE INDEX

p

- `panobbgo`, 3
- `panobbgo.config`, 6
- `panobbgo.core`, 3
- `panobbgo.heuristics`, 6
- `panobbgo.strategies`, 6
- `panobbgo.ui`, 7
- `panobbgo_lib`, 9
- `panobbgo_lib.classic`, 9
- `panobbgo_lib.lib`, 11

INDEX

A

active (panobbgo.core.Heuristic attribute), 5
add_analyzer() (panobbgo.core.StrategyBase method), 6
add_heuristic() (panobbgo.core.StrategyBase method), 6
add_notebook_page() (panobbgo.ui.UI method), 7
add_results() (panobbgo.core.Results method), 5
Analyzer (class in panobbgo.core), 3
analyzer() (panobbgo.core.StrategyBase method), 6
avg_time_per_task (panobbgo.core.StrategyBase attribute), 6

B

best (panobbgo.core.StrategyBase attribute), 6
box (panobbgo_lib.lib.Problem attribute), 12

C

clear_output() (panobbgo.core.Heuristic method), 5
cnt (panobbgo_lib.lib.Result attribute), 12
Config (class in panobbgo.config), 7
cv (panobbgo_lib.lib.Result attribute), 12
cv_vec (panobbgo_lib.lib.Result attribute), 12

D

debug (panobbgo.config.Config attribute), 7
destroy() (panobbgo.ui.UI method), 7
dim (panobbgo_lib.lib.Problem attribute), 12

E

emit() (panobbgo.core.Heuristic method), 5
error (panobbgo_lib.lib.Result attribute), 13
eval() (panobbgo_lib.classic.Himmelblau method), 9
eval() (panobbgo_lib.classic.Rastrigin method), 10
eval() (panobbgo_lib.classic.Rosenbrock method), 10
eval() (panobbgo_lib.classic.RosenbrockAbs method), 10
eval() (panobbgo_lib.classic.RosenbrockAbsConstraint method), 10
eval() (panobbgo_lib.classic.RosenbrockConstraint method), 10
eval() (panobbgo_lib.classic.RosenbrockStochastic method), 11
eval() (panobbgo_lib.classic.Shekel method), 11
eval() (panobbgo_lib.lib.Problem method), 12

eval_constraints() (panobbgo_lib.classic.RosenbrockAbsConstraint method), 10
eval_constraints() (panobbgo_lib.classic.RosenbrockConstraint method), 10
eval_constraints() (panobbgo_lib.lib.Problem method), 12
Event (class in panobbgo.core), 4
EventBus (class in panobbgo.core), 4
eventbus (panobbgo.core.Module attribute), 5
execute() (panobbgo.core.StrategyBase method), 6

F

finish() (panobbgo.ui.UI method), 7
fx (panobbgo_lib.lib.Result attribute), 13

G

get_config() (in module panobbgo.config), 7
get_logger() (panobbgo.config.Config method), 7
get_points() (panobbgo.core.Heuristic method), 5

H

Heuristic (class in panobbgo.core), 4
heuristic() (panobbgo.core.StrategyBase method), 6
heuristics (panobbgo.core.StrategyBase attribute), 6
Himmelblau (class in panobbgo_lib.classic), 9

I

info() (panobbgo.core.Results method), 5
info() (panobbgo.core.StrategyBase method), 6
init_module() (panobbgo.core.StrategyBase method), 6

K

keys (panobbgo.core.EventBus attribute), 4

M

mk_canvas() (panobbgo.ui.UI static method), 7
Module (class in panobbgo.core), 5

N

n_best() (panobbgo.core.Results method), 5
name (panobbgo.core.Module attribute), 5
name (panobbgo.core.StrategyBase attribute), 6

P

panobbgo (module), 3
panobbgo.config (module), 6
panobbgo.core (module), 3
panobbgo.heuristics (module), 6
panobbgo.strategies (module), 6
panobbgo.ui (module), 7
panobbgo_lib (module), 9
panobbgo_lib.classic (module), 9
panobbgo_lib.lib (module), 11
Point (class in panobbgo_lib.lib), 11
point (panobbgo_lib.lib.Result attribute), 13
pp (panobbgo_lib.lib.Result attribute), 13
Problem (class in panobbgo_lib.lib), 11
problem (panobbgo.core.Module attribute), 5
PROBLEM_KEY (panobbgo.core.StrategyBase attribute), 6
project() (panobbgo_lib.lib.Problem method), 12
publish() (panobbgo.core.EventBus method), 4

R

random_point() (panobbgo_lib.lib.Problem method), 12
ranges (panobbgo_lib.lib.Problem attribute), 12
Rastrigin (class in panobbgo_lib.classic), 10
re (panobbgo.core.EventBus attribute), 4
redraw_canvas() (panobbgo.ui.UI method), 7
register() (panobbgo.core.EventBus method), 4
Result (class in panobbgo_lib.lib), 12
Results (class in panobbgo.core), 5
results (panobbgo.core.Module attribute), 5
Rosenbrock (class in panobbgo_lib.classic), 10
RosenbrockAbs (class in panobbgo_lib.classic), 10
RosenbrockAbsConstraint (class in panobbgo_lib.classic), 10
RosenbrockConstraint (class in panobbgo_lib.classic), 10
RosenbrockStochastic (class in panobbgo_lib.classic), 10
run() (panobbgo.core.StrategyBase method), 6
run() (panobbgo.ui.UI method), 7

S

Shekel (class in panobbgo_lib.classic), 11
show() (panobbgo.ui.UI method), 7
StopHeuristic, 5
strategy (panobbgo.core.Module attribute), 5
StrategyBase (class in panobbgo.core), 5
subscribe() (panobbgo.core.EventBus method), 4

T

time_cpu (panobbgo.core.StrategyBase attribute), 6
time_start_str (panobbgo.core.StrategyBase attribute), 6
time_wall (panobbgo.core.StrategyBase attribute), 6

U

UI (class in panobbgo.ui), 7

ui (panobbgo.core.Module attribute), 5
unsubscribe() (panobbgo.core.EventBus method), 4

W

who (panobbgo_lib.lib.Point attribute), 11
who (panobbgo_lib.lib.Result attribute), 13

X

x (panobbgo_lib.lib.Point attribute), 11
x (panobbgo_lib.lib.Result attribute), 13