



Machine Automated General Performance Improvement via Evolution of Software

Aymeric Blot

Université du Littoral Côte d'Opale

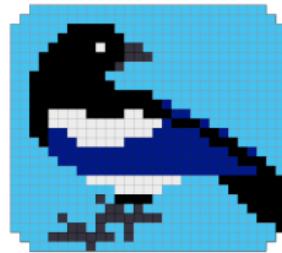
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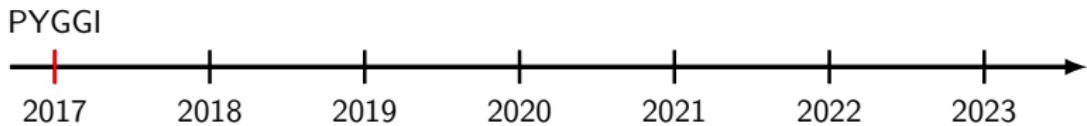
Magpie

In a nutshell

- ▶ Python framework
- ▶ Purposely very small ($\sim 3\text{kloc}$)
- ▶ Enable GI *and more*
- ▶ Free on GitHub 
- ▶ *User-friendly and research-friendly*



A Brief History



2017: PYGGI (KSC)

- ▶ Lines of code (deletion, insertion, replacement)
- ▶ Local search
- ▶ Program repair, execution time



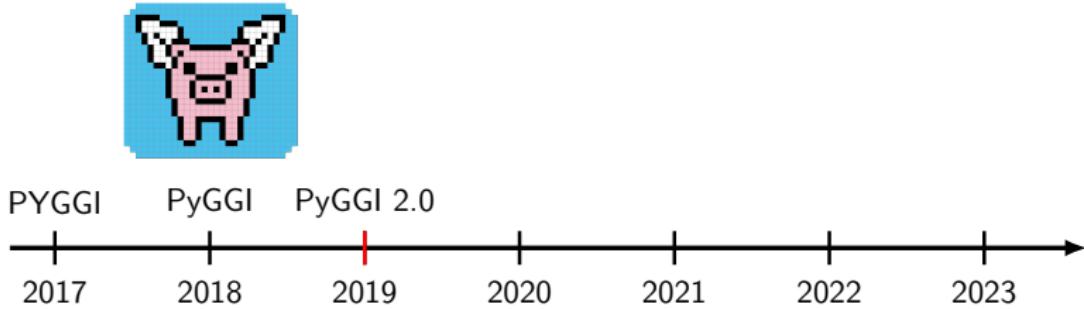
A Brief History



2018: ⚡ PyGGI (GI@ICSE)

- ▶ Python statement AST (deletion, insertion, replacement)

A Brief History

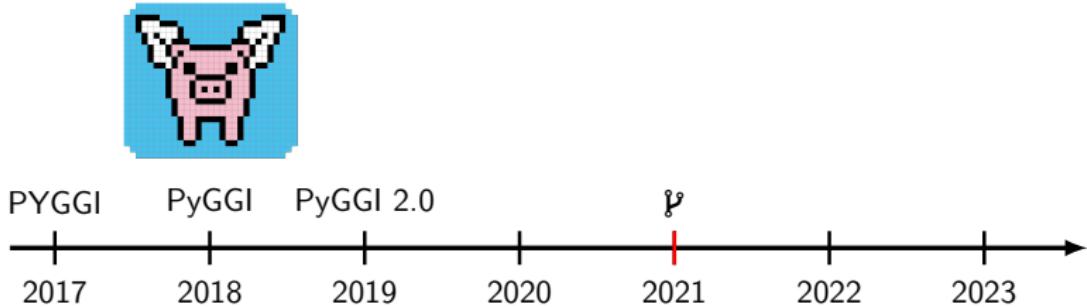


2019: PyGGI 2.0 (ESEC/FSE)

- ▶ XML/SrcML files (deletion, insertion, replacement)



A Brief History

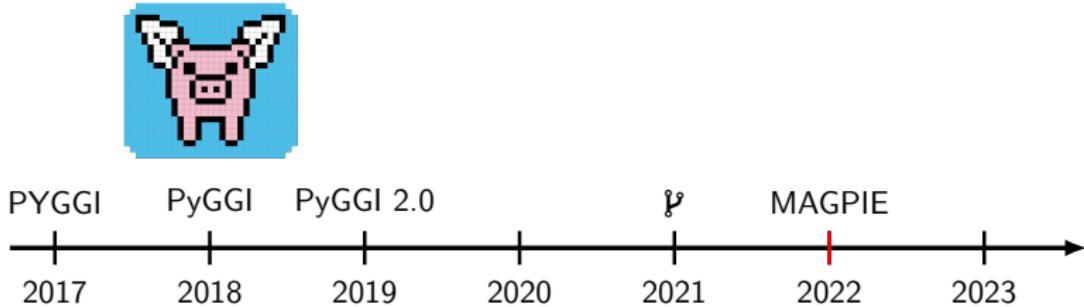


2021: \mathcal{P} fork (IEEE TEVC)

- ▶ Local search (new)
- ▶ Genetic Programming
- ▶ Validation algorithms



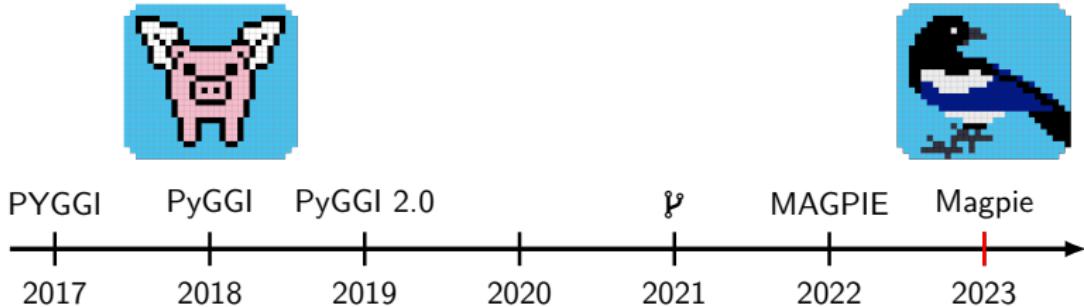
A Brief History



2022: MAGPIE (arXiv)

- ▶ Parameter configuration (compiler/interpreter/software)
- ▶ Mutation-testing mutations (numerical, operators)

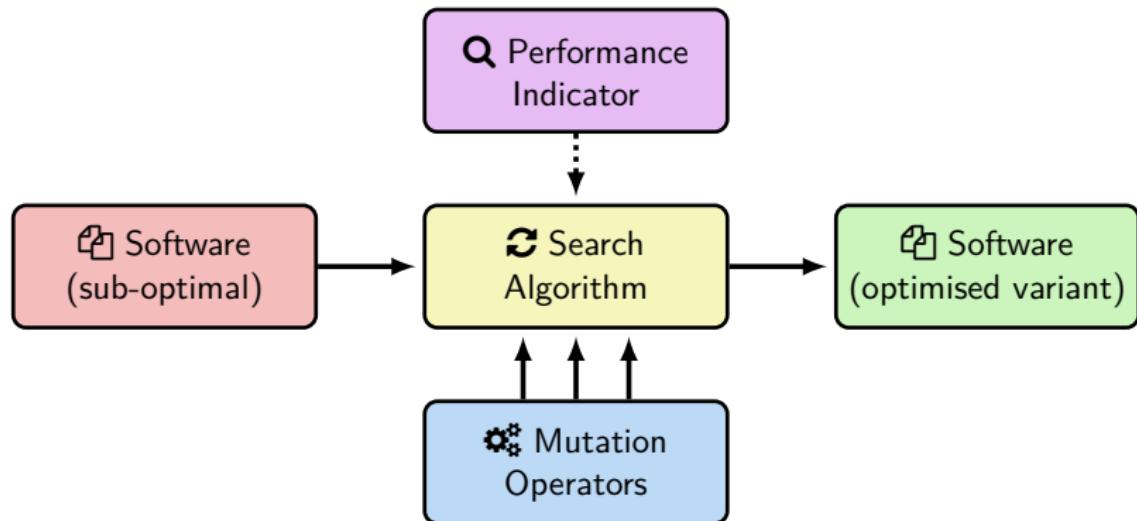
A Brief History



2023: Magpie

- ▶ Almost complete rewrite
- ▶ Syntactic “no-code” sugar

Evolving Software using Magpie



```
> python3 magpie.py local_search --scenario foo.txt  
> ./magpie.py minify_patch --scenario foo.txt --patch patch.txt
```

Magpie Structure

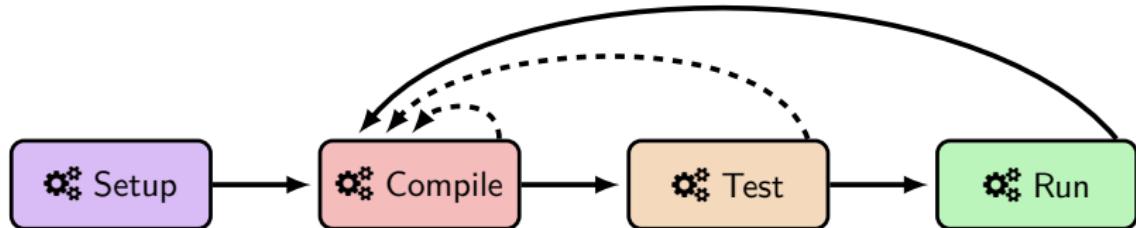
```
/  
├── magpie.py  
├── magpie/  
├── bin/  
│   └── local_search.py  
├── your_software/  
├── scenario.txt  
├── magpie_work/  
│   └── your_software_167874800/  
└── magpie_logs/  
    ├── your_software_167874800.log  
    ├── your_software_167874800.patch  
    └── your_software_167874800.diff
```

Not included for clarity: documentation, tests, etc.

Scenario File

```
1 [software]
2 path = examples/code/triangle-py_slow
3 target_files =
4     triangle.py
5
6 test_cmd = pytest
7 run_cmd = python run_triangle.py
8 run_timeout = 1
9
10 fitness = time
11
12 [search]
13 max_steps = 100
14 max_time = 60
15 possible_edits =
16     LineReplacement
17     LineInsertion
18     LineDeletion
```

Software Multi-Step Evaluation



Configured in scenario file

- ▶ {step}_cmd
- ▶ {step}_timeout
- ▶ {step}_lengthout

Step-specific logging

- ▶ {step}_CLI_ERROR
- ▶ {step}_CODE_ERROR
- ▶ {step}_TIMEOUT
- ▶ {step}_LENGTHOUT
- ▶ {step}_PARSE_ERROR
- ▶ SUCCESS

Performance Indicator

Out-of-the-box:

- ▶ `time`
- ▶ `bloat_{lines,words,chars}`

Output-specific:

- ▶ `repair: /(\d+) (?:error|fail)/` ∈ test.stdout
- ▶ `posix_time: /real (\S+)/` ∈ run.stderr
- ▶ `perf_instructions: /(\S+) instructions/` ∈ run.stderr
- ▶ `perf_time: /(\S+) seconds time elapsed/` ∈ run.stderr
- ▶ `output: /MAGPIE_OUTPUT: (\S+)/` ∈ run.stdout
- ▶ “*easy to extend*”

Software Representation

LineEngine

- ▶ LineDeletion
- ▶ LineInsertion
- ▶ LineReplacement
- ▶ LineMoving

SrcmlEngine

- ▶ {...}Deletion
- ▶ {...}Insertion
- ▶ {...}Replacement
- ▶ {...}Moving
- ▶ {...}Setting

ConfigFileParamsEngine

- ▶ ParamSetting

AstorEngine

- ▶ StmtDeletion
- ▶ StmtInsertion
- ▶ StmtReplacement
- ▶ StmtMoving

Advanced Scenario File

```
1 [software]
2 target_files = core/Solver.cc.xml
3                 minisat.params
4                 gcc.params
5 engine_config = *.xml : [srcml]
6                     minisat.params : [params.minisat]
7                     gcc.params : [params.gcc]
8
9 [srcml]
10 rename = stmt: break continue decl_stmt do expr_stmt for go
11         number: literal_number
12 focus = block stmt number operator_comp operator_arith
13 internodes = block
14 process_pseudo_blocks = True
15 process_literals = True
16 process_operators = True
17
18 [params.minisat]
19 timing = test run
20 [params.gcc]
21 timing = compile
```

Custom Code

```
1 [magpie]
2 import = custom.py
3
4 [search]
5 possible_edits =
6     TypeReplacement
7     TypeSetting
```

```
1 class TypeReplacement(NodeReplacement):
2     NODE_TYPE = 'type'
3
4 class TypeSetting(TextSetting):
5     NODE_TYPE = 'type'
6     CHOICES = ['float', 'double', 'int']
7
8 magpie.xml.edits.append(TypeReplacement)
9 magpie.xml.exits.append(TypeSetting)
```

Parameter Configuration

```
1 CLI_PREFIX = "-"
2 CLI_GLUE = "="
3 CLI_BOOLEAN = "prefix"
4
5 luby {True, False}[True] # categorical
6 verb {0, 1, 2}[1]
7 phase-saving [0, 2][2] # integer
8 var-decay (0, 1)[0.95] # float
9 gc-frac e(0, 65535)[0.2] # exponential
10 rfirst g[1, 65535][100] # geometric
11 grow g[-65535, 65535][0]
12
13 @sub-lim$flag {True, False}[False] # @hidden
14 sub-lim$unbounded {-1}[-1] # $ignored
15 sub-lim$bounded g[0, 65535][1000]
16
17 sub-lim$unbounded | @sub-lim$flag == True # conditional
18 sub-lim$bounded | @sub-lim$flag == False
```

Entry Points

Search

- ▶ local_search.py
- ▶ genetic_programming.py

Validation

- ▶ show_patch.py
- ▶ revalidate_patch.py
- ▶ minify_patch.py
- ▶ ablation_analysis.py

Misc.

- ▶ show_locations.py
- ▶ line_xml.py

What Now?

More content

- ▶ Batch-size support
- ▶ Multi-objective support
- ▶ New representations/transformations

Documentation

- ▶ Tutorials
- ▶ More tests
- ▶ More comments

Take-away Message

Magpie

- ▶ Tiny but full of functionalities!
- ▶ No knowledge of Python required!
- ▶  github.com/bloa/magpie



Try it now!

```
> git clone https://github.com/bloa/magpie.git  
> python3 magpie.py local_search --scenario  
    examples/scenario/triangle-cpp_runtime.txt
```

Selected References

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IEEE Trans. Evol. Comput., 25(5):1001–1011, 2021.
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