Grail: Introduction to Grammar Learning

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Outline

- Overview
- 2 Grooving with Grail
- 3 Short Introduction to Formal Grammars

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Background

- Common reverse engineering problems
 - Specify a Network Protocol used by a communicating service
 - Specify an input File Format for a target application
- File formats and network protocols are examples of formal grammars
- For example: what is the file format that "Atril Document Viewer" v1.14.2 expects its file inputs to comply with?
 - Note: the specific <u>target application</u> defines the expected grammar **not** external standards etc...
- Why do I want the grammar?
 - Because fuzzing is much more effective and efficient when the input structure, type information and semantics are known

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Problem

Basic Problem

- Can you automatically learn the grammar a parser is expecting by observing the parser process inputs?
 - **Note**: You are not likely to have the source code, debug symbols or other supporting information. Just the target binary.

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Collecting Data

- Parser operation is observable through dynamic program analysis techniques
 - Intel PIN is a binary instrumentation tool that can produce an assembly instruction trace
 - Another approach is API Call tracing
 - A higher level of abstraction
 - Nice if you can get access to the API...
- A large corpus of sample parser inputs can be collected
 - maximise code coverage of the parser tracing

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Grammar Learning

Refined Problem

Can you automatically learn the grammar given the *multiple traces* collected?

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Prior Art

- Microsoft Research: "Tupni: Automatic Reverse Engineering of Input Formats", 2008 ACM CCS
 - This research is considered best-practice/state of the art
 - Essential reading
 - Benchmark can we do duplicate the results? Can we do better?

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TUPNI Critiques

- Critiques:
- Formalise the parser tracing format into using a data description language (JSON based).
 - separate the grammar learning process from the data collection process
 - Both are difficult problems of very different natures
- Design a series of benchmark parsers and sample inputs of varying complexity
 - Series of "Challenge Problems" (also known as Unit Tests :-)
 - Allows explicit control of what grammar features you are testing the GL on
 - Transparent scoring of a GL's capabilities
 - Competition! Grand Challenge! Man Versus Data!

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Grail: The Grammar Gravy Train :-)

- Architecture breaks up the system design to avoid TUPNI's apparent monolithic approach.
- Focus is on making the relationships between the system components "observable" and subject to "standardised format"
 - Divide and conquer
 - Separation of concerns

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Grail Flowchain Synth Estimated Grammar PUT Grámmar Generator Exemplar Grammar Learner Spec Sensor Grope Grinder Grip Grit Gripe Grist Grail Compute a difference measure between two grammar specifications Gripe and Grail

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Grail

- Gripe and Grit:
 - "Gripe": synthetic test grammars
 - "Grit" files are samples of input for each test grammar
 - both "good" and "bad" samples
- At the moment, Gripe is just an idea.
 - We currently manually create grammars, parsers and Grit files...

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Grail

- Grope includes
 - "Parser Under Test" (PUT)
 - "test runner" specifies what to test, where the Grit files for each test is located, where to store test results....
- **Grinder** is the means by which we instrument the PUT in Grope to produce trace data.
 - Grinder provides parser API Call tracing
- Grist are the traces of the PUT
 - one for each Grit sample
 - a data description language for describing the trace data
 - JSON format

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Grail

- Groot is the "Grammar Learning" component
 - takes one or more Grist files as input
 - produces one Grail file
- Grail is the estimated grammar from the GL component
 - ideally, should be "identical" to the original Gripe specification
 - need a way of computing the actual difference between the two grammars

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Grail

- All code is in Python to make the research problem accessible to a wide range of people
 - Avoids dealing with binary instrumentation, dynamic tracing, PIN and assemble instructions ...
 - Future work to create a Grinder implementation for arbitrary binaries that produces trace files in Grist format

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What is a "Grammar"

Wikipedia:

"a grammar is a set of production rules for strings in a formal language. The rules describe how to form strings from the language's alphabet that are valid according to the language's syntax.

A grammar does not describe the meaning of the strings or what can be done with them in whatever context -only their form."

• **Grammars** and **Types** are *specifications* which **Parsers** can implement to process *strings* in a *formal* language

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Grail Grammar

- Based on EBNF (Extended Backus-Naur Form)
- Extended to be able to specify Constraints
 - constraints mean that the grammars don't need to be "context-free"
- Only very simple types required

Definition

Types

- UINT8, INT8
- UINT16, INT16
- UINT32, INT32
- UINT64, INT64
- Boolean
- Floating Point (64 bit, 80 bit)
- String (null-term, fixed len)

Definition

Grammar Operators

- Production Rules
- Concatenation
- Repetition
- 4 Constant Constraints
- Alternation
- Containment / Composition
- Functional Relationship

Grail Grammar

Here is a simple but important example for an almost useful file format:

Example

```
File := Magic Record+ CRC32

Magic := UINT16 //value == 0x23 0x32

Record := Type Length Value

Type := UINT8

Length := UINT16

Value := BLOB //sizeof(Value) == Length.value

CRC32 := UINT32 //value == crc32(File.value)
```

- Notice the operators in use: concatenation, repetition, encapsulation, constant and functional constraints,...
- Also only simple *primitive types* used

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Grope Parsers

- Test Parsers are implemented in Python PyParsing
 - Grope and Grinder are implemented as Python *Decorators*
- Example:

```
@registry.set(test_files="grit")
@registry.set(enabled=runme)
@registry.set(test_dir=root_dir + "/test1")
@registry.set(result_dir=root_dir + "/test1/results")
@registry.set(name="test_1")
def test_1_factory():
  TermA = gt.trace(Word(nums, exact=1).setName("TermA"))
  TermB = gt.trace(Word(nums, exact=1).setName("TermB"))
  TermC = gt.trace(Word(alphas, exact=1).setName("TermC"))
  TermD = gt.trace(Word(alphas, exact=1).setName("TermD"))
  R1 = gt.trace(TermA + TermB + TermC + TermD + StringEnd())
  R1.setName("R1")
  return R1
```

Tracing: Grist Format

- Grist is simply a JSON encoding of the parser tracing data
- Schema is very simple
 - But I believe sufficient to describe the same data ontology as TUPNI requires
 - That is, an assembly instruction trace should be reducible to an API Call trace with some good thinking

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Grist Example: Partial Trace

```
{"timestamp": 1474250616.730216, "data": "52AW\n",
"trace": [
{"addr": 140344043851088,
     "rtype": "try",
     "segno": 0,
     "rule": "R1",
     "line": 1, "col": 1},
{"addr": 140344043850768.
     "rtype": "success",
     "seqno": 2,
     "rule": "TermA",
     "tokens": "['5']".
     "length": 1,
     "line": 1, "col": 1},...],}
```

Grist Example: Partial Trace

```
{"timestamp": 1474250616.730216. <-- Date Time
"data": "52AW\n", <-- Input string being Parsed
"trace": [ <-- An array/list of tracing operations
{"addr": 140344043851088, <-- Code address in Memory
     "rtype": "try", <-- Trace Operation: Start of Parsing
     "seqno": 0, <-- Index in the trace array/list
     "rule": "R1", <-- Not likely to get function names/rules in practice
     "line": 1, "col": 1}, <-- Start of Parsing Input
{"addr": 140344043850768, <-- Code address in Memory
     "rtype": "success", <-- Trace Operation: Parsing Success
     "segno": 2, <-- Trace sequence number
     "rule": "TermA", <-- Function Name/ Parsing Rule Matched
     "tokens": "['5']", <-- Terminal Accepted
     "length": 1, <-- Length of parsing input matched
     "line": 1."col": 1}. <-- Start of Parsing Input
     ...],}
```

What Now?

- Grail Project is on our GitLab server
- Half a dozen test parsers available
 - complete with sample Grit inputs and Grist trace data
- More Work Required
 - Groot implementation(s)
 - the fun bit!
 - Metric/Loss Function: We need a difference measure for two grammars
 - Tool: Assembly instruction tracing that produces data in Grist format

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