

Fully Automated Compiler Testing of a Reasoning Engine via Mutated Grammar Fuzzing

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Problem Overview

Main Problem

Develop a **fully-automated** (once started, requires no human intervention) testing tool that

- 1 **Generates,**
- 2 **Executes,** and
- 3 **Evaluates**

tests for a **reasoning engine**.

Reasoning Engine

A system that takes

⏪ **Axioms, observations,**

and returns

⏩ **Logical consequences** (diagnoses)

Our Reasoning Engine: ATMS

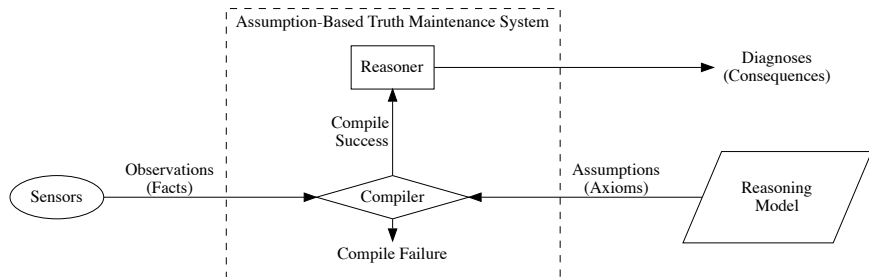


Figure: Assumption-based Truth Maintenance System (ATMS) Overview

Necessary Condition for Reasoning

Observations and axioms must be **correctly compiled**.

- **Compiler testing** is required.

Our Reasoning Engine: ATMS

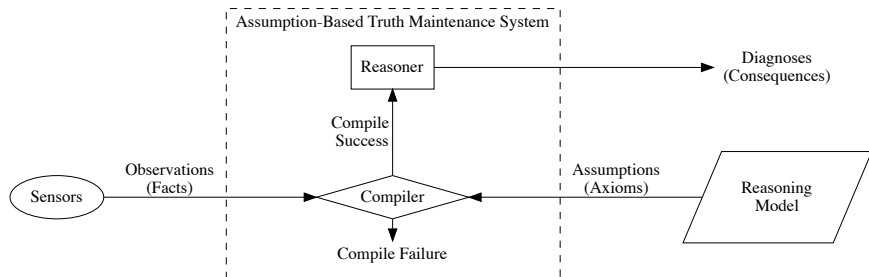


Figure: Assumption-based Truth Maintenance System (ATMS) Overview

Example (Reasoning Model)

- $\overbrace{hitGas}^{\text{observation}} \wedge \overbrace{Running}^{\text{assumption}} \rightarrow moving$
- $hitGas \wedge Broken \rightarrow notMoving$
- $moving \wedge notMoving \rightarrow \perp$

Example (Observation)

- $hitGas$
- $moving$

Our Reasoning Engine: ATMS

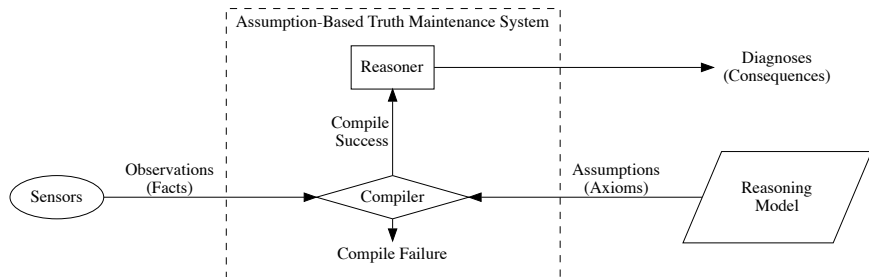


Figure: Assumption-based Truth Maintenance System (ATMS) Overview

Example (Diagnoses)

$$D = \{\{Running\}\}$$

Proceed to DEMO

Compiler Errors

Actual \ ATMS	Compile Failure	Consequence List
Reject	Test Passed	Type I Error
Accept	Type II Error	Test Passed

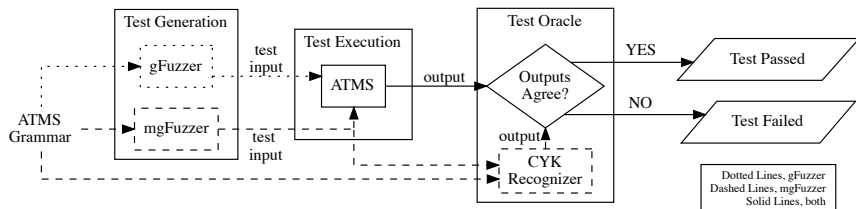
Type I Errors (False Positives)

Compiler **accepts** an **invalid input**.

Type II Errors (False Negatives)

Compiler **rejects** a **valid input**.

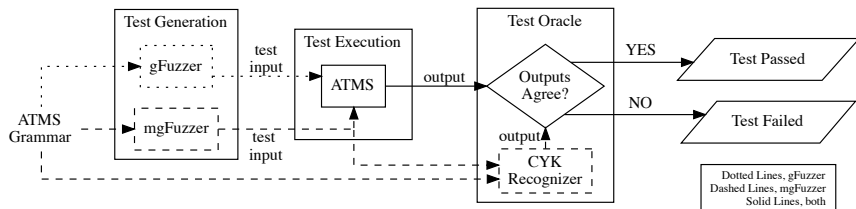
gFuzzer Overview



gFuzzer: Grammar Fuzzer

- Takes a **context-free grammar** (ATMS Grammar in this case).
- **Generates** random sentences (Valid test inputs).
- **Executes** generated tests.
- ATMS must **always accept** (Checks only Type II Errors).

gFuzzer Overview



mgFuzzer: Mutated Grammar Fuzzer

- **Mutates** the original grammar.
- **Generates** random sentences (could be valid or invalid).
- **Executes** generated tests.
- Compares ATMS output with a **CYK recognizer**.
- Checks for both **Type I and Type II Errors**.

Small Example: bc

bc

bc is a UNIX tool that evaluates arithmetic expressions.

What can we do with gFuzzer?

- Exact grammar is NOT known,
 - **Design** a reasonable grammar and
 - **Discover** functionalities.
- Manual generation of grammars?
 - **Infer** a grammar from example test inputs.
 - **Fuzz** the inferred grammar.

Proceed to DEMO

Mutation Operators I

Terminal Replacement (TR)

Swaps two non-equal terminals.

$$(\langle A \rangle ::= a, \langle B \rangle ::= b) \Rightarrow (\langle A \rangle ::= b, \langle B \rangle ::= a)$$

Example

$$(\langle \text{Digit} \rangle ::= 1, \langle \text{Op} \rangle ::= \rightarrow) \Rightarrow (\langle \text{Digit} \rangle ::= \rightarrow, \langle \text{Op} \rangle ::= 1)$$

Note

For simplicity, we assume **Chomsky Reduced Form (CRF)**. In CRF, there are only two types of rules:

- 1 $\langle R \rangle ::= \langle Q \rangle \langle S \rangle$ and
- 2 $\langle R \rangle ::= t$

Mutation Operators II

DEletion (DE)

Replaces all expansions of a rule with empty string.

$$\langle A \rangle \in G \Rightarrow \langle A \rangle ::= \epsilon$$

Example

$$(\langle \text{NonEmptyList} \rangle ::= \langle \text{Element} \rangle \langle \text{Rest} \rangle) \Rightarrow \langle \text{NonEmptyList} \rangle ::= \epsilon$$

Note

For simplicity, we assume **Chomsky Reduced Form (CRF)**. In CRF, there are only two types of rules:

- 1 $\langle R \rangle ::= \langle Q \rangle \langle S \rangle$ and
- 2 $\langle R \rangle ::= t$

Mutation Operators III

DUplication (DU)

Duplicates a rule.

$$\langle A \rangle ::= \langle B \rangle \langle C \rangle \Rightarrow (\langle A \rangle ::= \langle A' \rangle \langle A' \rangle, \langle A' \rangle ::= \langle B \rangle \langle C \rangle)$$

Example

$$(\langle \text{Add} \rangle ::= \langle \text{Term} \rangle \langle \text{PlusTerm} \rangle) \Rightarrow (\langle \text{Add} \rangle ::= \langle \text{Add}' \rangle \langle \text{Add}' \rangle)$$

Note

For simplicity, we assume **Chomsky Reduced Form (CRF)**. In CRF, there are only two types of rules:

- 1 $\langle R \rangle ::= \langle Q \rangle \langle S \rangle$ and
- 2 $\langle R \rangle ::= t$

Mutation Operators IV

EXchange (EX)

Swaps the order of non-terminals.

$$(\langle A \rangle ::= \langle B \rangle \langle C \rangle) \Rightarrow (\langle A \rangle ::= \langle C \rangle \langle B \rangle)$$

Example

$$(\langle \text{Add} \rangle ::= \langle \text{Term} \rangle \langle \text{PlusTerm} \rangle) \Rightarrow (\langle \text{Add} \rangle ::= \langle \text{PlusTerm} \rangle \langle \text{Term} \rangle)$$

Note

For simplicity, we assume **Chomsky Reduced Form (CRF)**. In CRF, there are only two types of rules:

- 1 $\langle R \rangle ::= \langle Q \rangle \langle S \rangle$ and
- 2 $\langle R \rangle ::= t$

Mutation Operators V

Recursion Insertion (RI)

Enables infinite recursion on a random rule.

$$(\langle A \rangle \in G) \Rightarrow (\langle A \rangle ::= \langle A \rangle \mid \langle A \rangle \langle A \rangle)$$

Example

$$(\langle \text{False} \rangle ::= \perp) \Rightarrow (\langle \text{False} \rangle ::= \perp \mid \langle \text{False} \rangle \langle \text{False} \rangle)$$

Note

For simplicity, we assume **Chomsky Reduced Form (CRF)**. In CRF, there are only two types of rules:

- 1 $\langle R \rangle ::= \langle Q \rangle \langle S \rangle$ and
- 2 $\langle R \rangle ::= t$

Mutation Operators VI

Terminal Insertion (TI)

Inserts a random terminal to a random rule.

$$(\langle A \rangle \in G) \Rightarrow (\langle A \rangle ::= \langle A \rangle x) \text{ or } (\langle A \rangle ::= x \langle A \rangle)$$

Example

$$(\langle \text{False} \rangle ::= \perp) \Rightarrow (\langle \text{False} \rangle ::= \neg \perp)$$

Note

For simplicity, we assume **Chomsky Reduced Form (CRF)**. In CRF, there are only two types of rules:

- 1 $\langle R \rangle ::= \langle Q \rangle \langle S \rangle$ and
- 2 $\langle R \rangle ::= t$

Evaluation

Method

- Execute both *gFuzzer* and *mgFuzzer*, each **one week**.
- Measure **rule coverage**.
- Measure **code coverage**.
- Collect **failed tests**.

Rule (Production) Coverage Criterion

- **Each rule** in the grammar must be **expanded** at least once.
- **Expansion:** Replacing a rule in the grammar with its terms.
- Common in compiler testing.

Test Generation Results

	Failed	Passed	Total	Rule (%)	Code (%)
<i>gFuzzer</i>	0	1,490,388	1,490,388	100	67.6
<i>mgFuzzer</i>	2	1,024	1,026	100	75.9
Both	2	1,491,412	1,491,414	100	75.9

Failed Tests

Test #1	x1,falsex2()x3->x2. Assumption1.
Test #2	Assumption1,x2(false,x3>false. Assumption3. Assumption2. x1.

- *mgFuzzer* is considerably **slower** than *gFuzzer*.
- *mgFuzzer* clearly **outperforms** *gFuzzer* in code coverage.
- *mgFuzzer* finds an interesting error with **fewer tests**.

Proceed to DEMO

Test the Reasoner

1 Property-Based Testing

- Assume **generic properties** for reasoning models (e.g. For every observation there must be at least one diagnosis)
- Generate tests by perturbing observations.

2 Coverage-Directed Testing

- Design **novel coverage criteria** (e.g. Every diagnosis must be generated at least once)
- Generate tests by perturbing observations.

3 SAT-Based Testing

- **Verify** every diagnosis by using a SAT-solver.

Miscellaneous Information

- **Tool:** <https://github.com/yavuzkoroglu/gfuzzer-release>
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Thank You