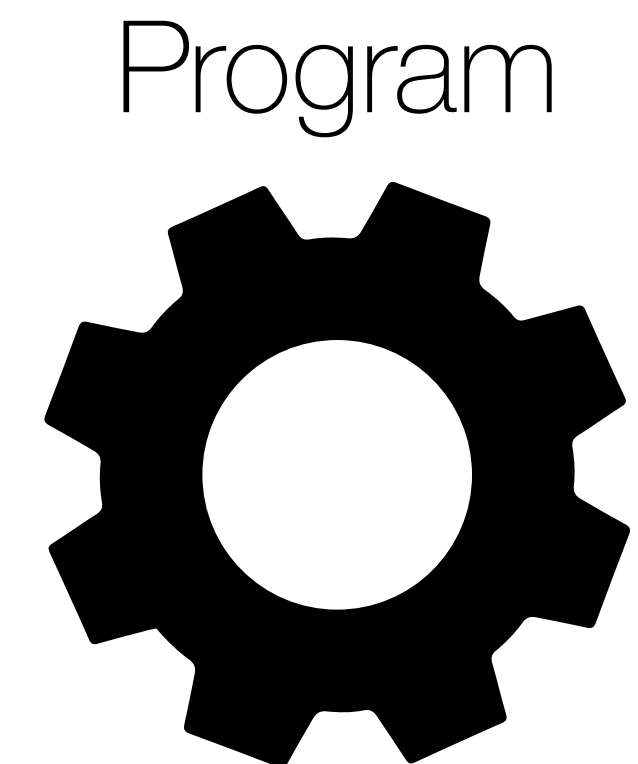
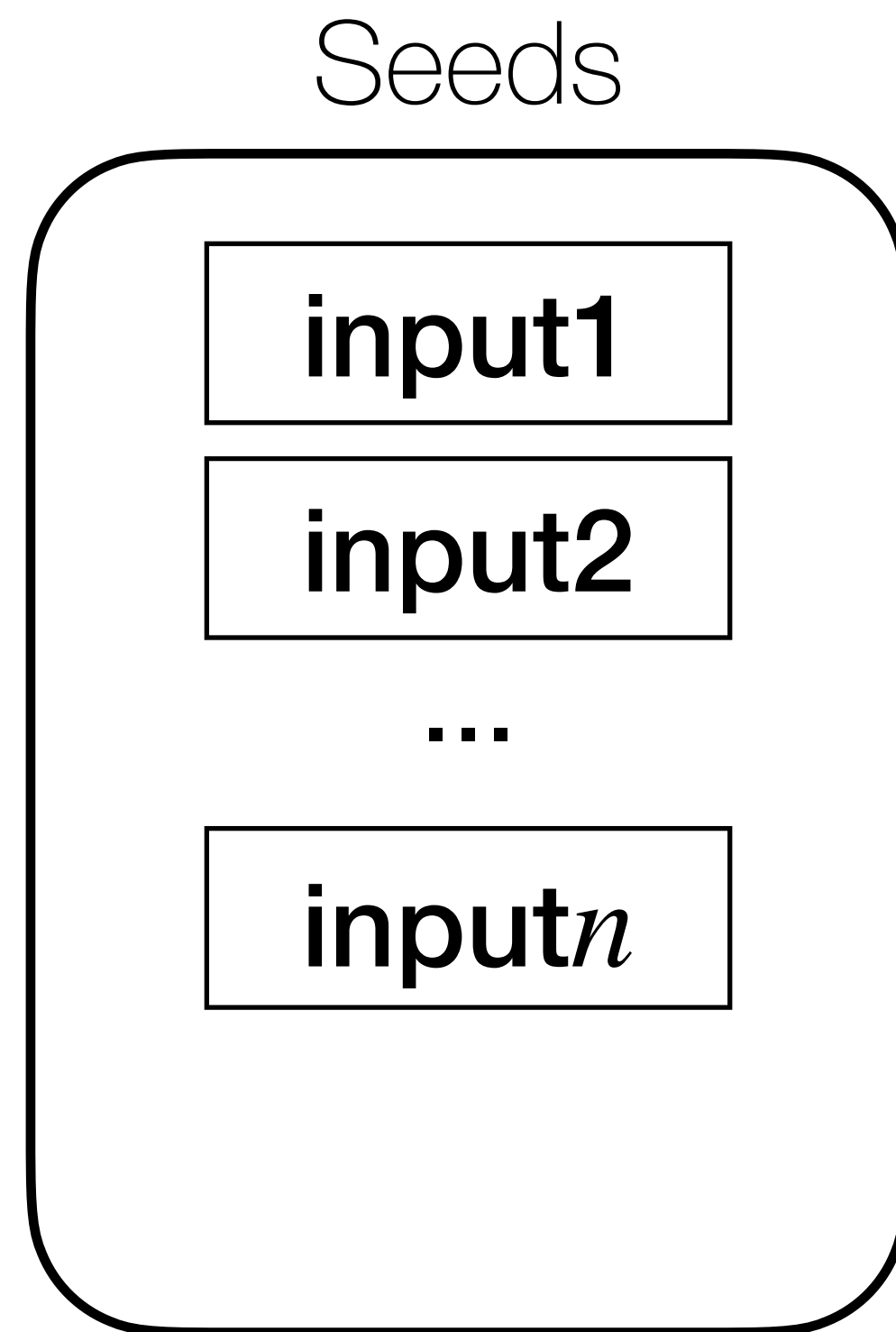


NEZHA:

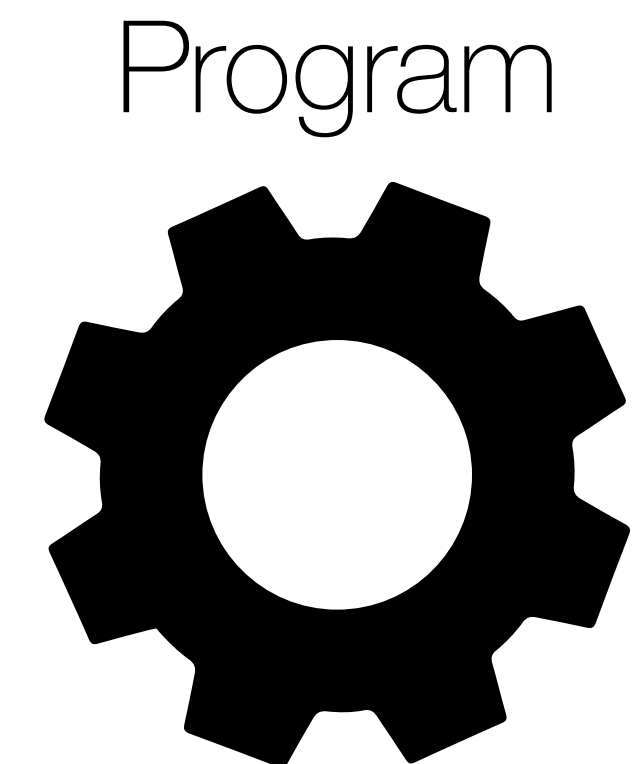
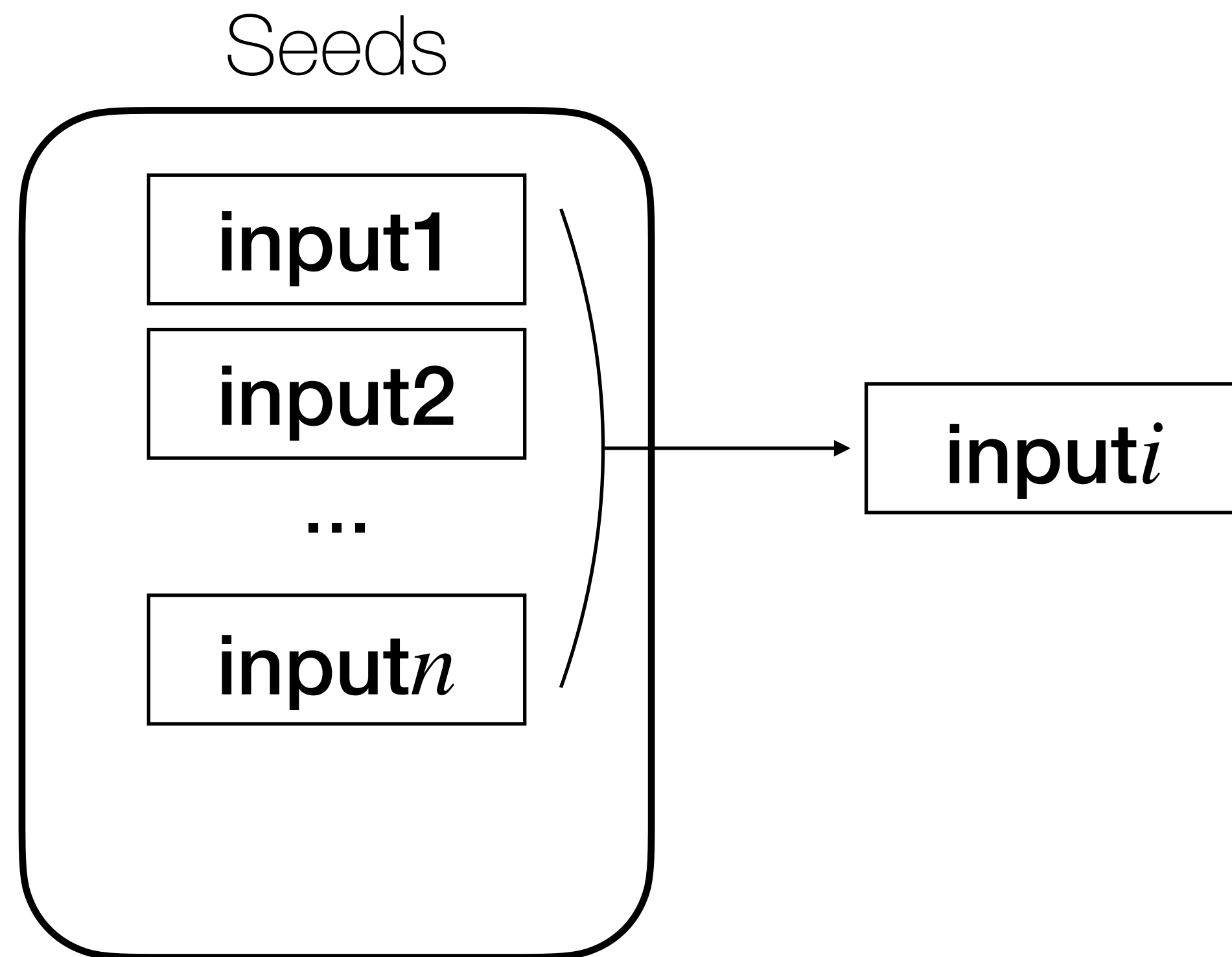
Efficient Domain-Independent Differential Testing

Theofilos Petsios, Adrian Tang, Salvatore Stolfo, Angelos D. Keromytis,
and Suman Jana (S&P '17)

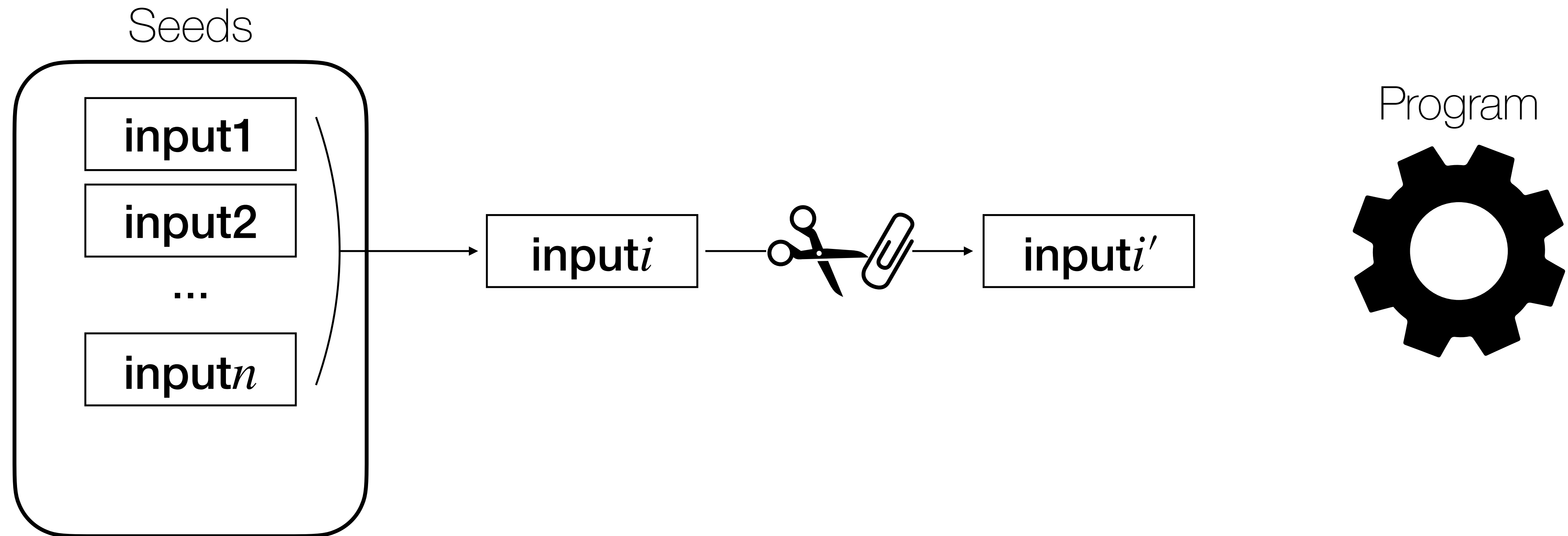
A fuzzer runs a program with random inputs.



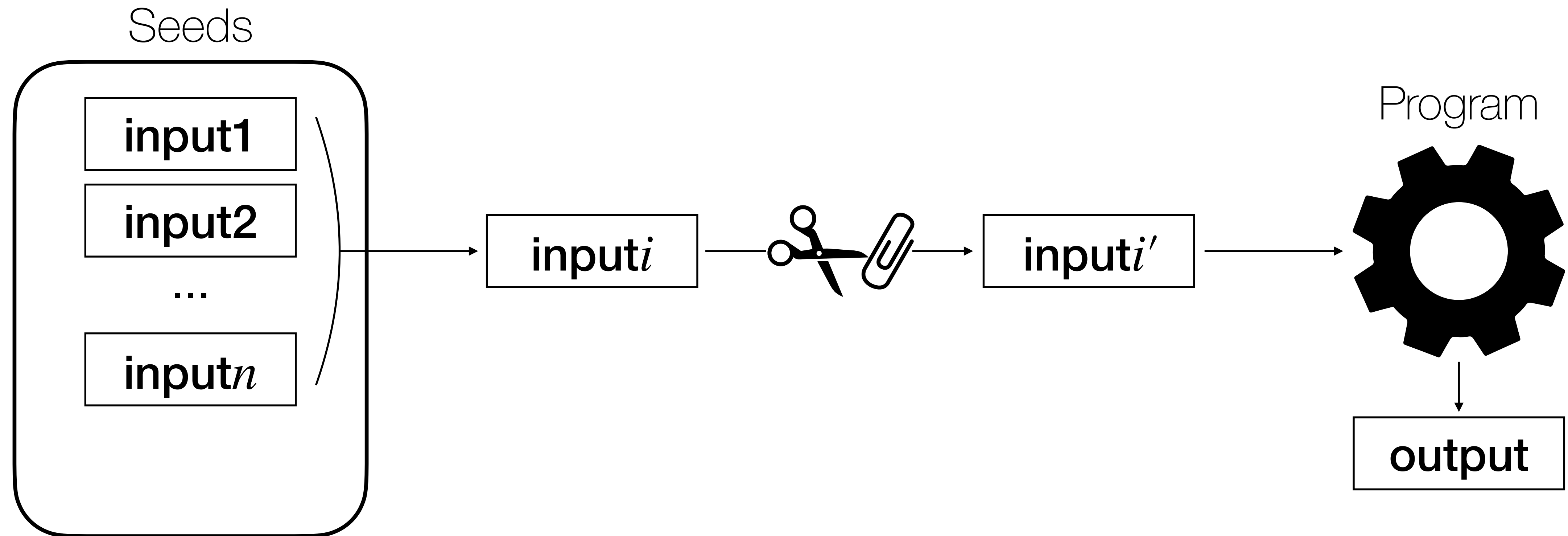
A fuzzer runs a program with random inputs.



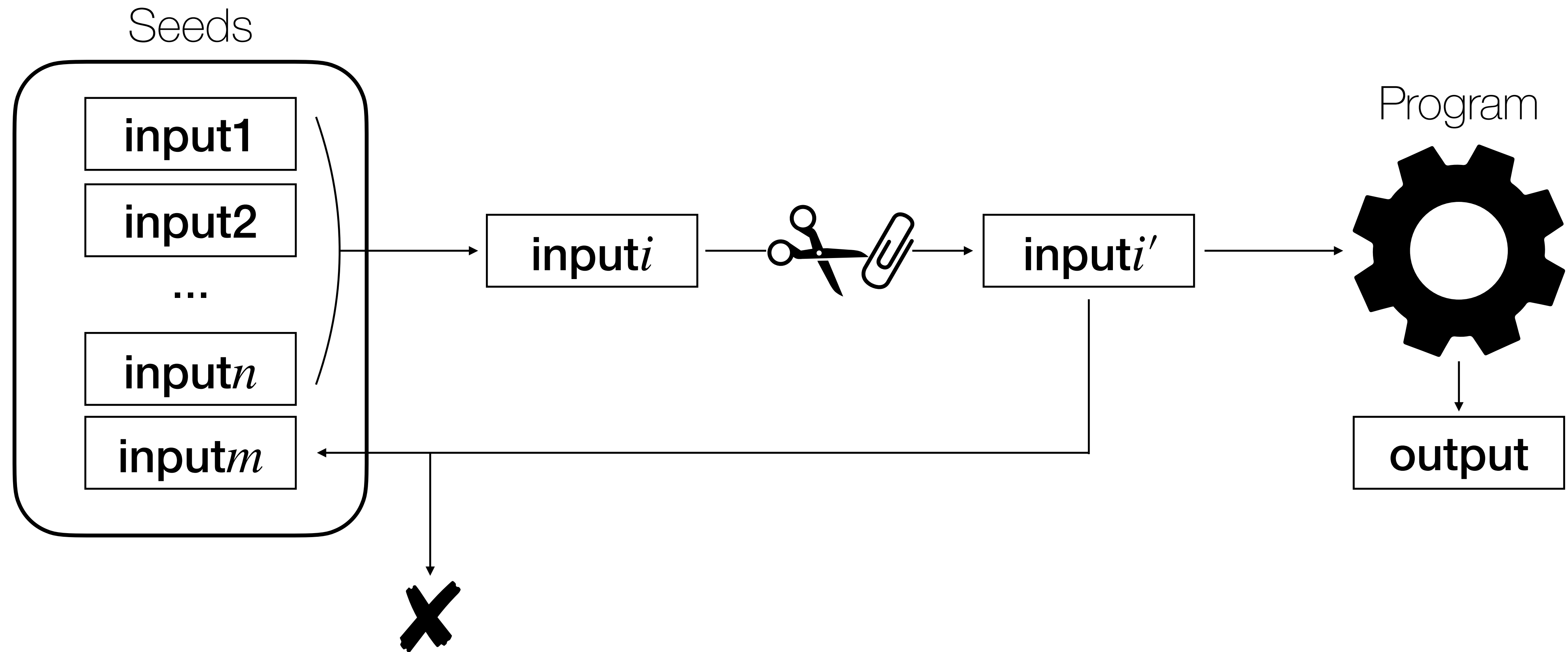
A fuzzer runs a program with random inputs.



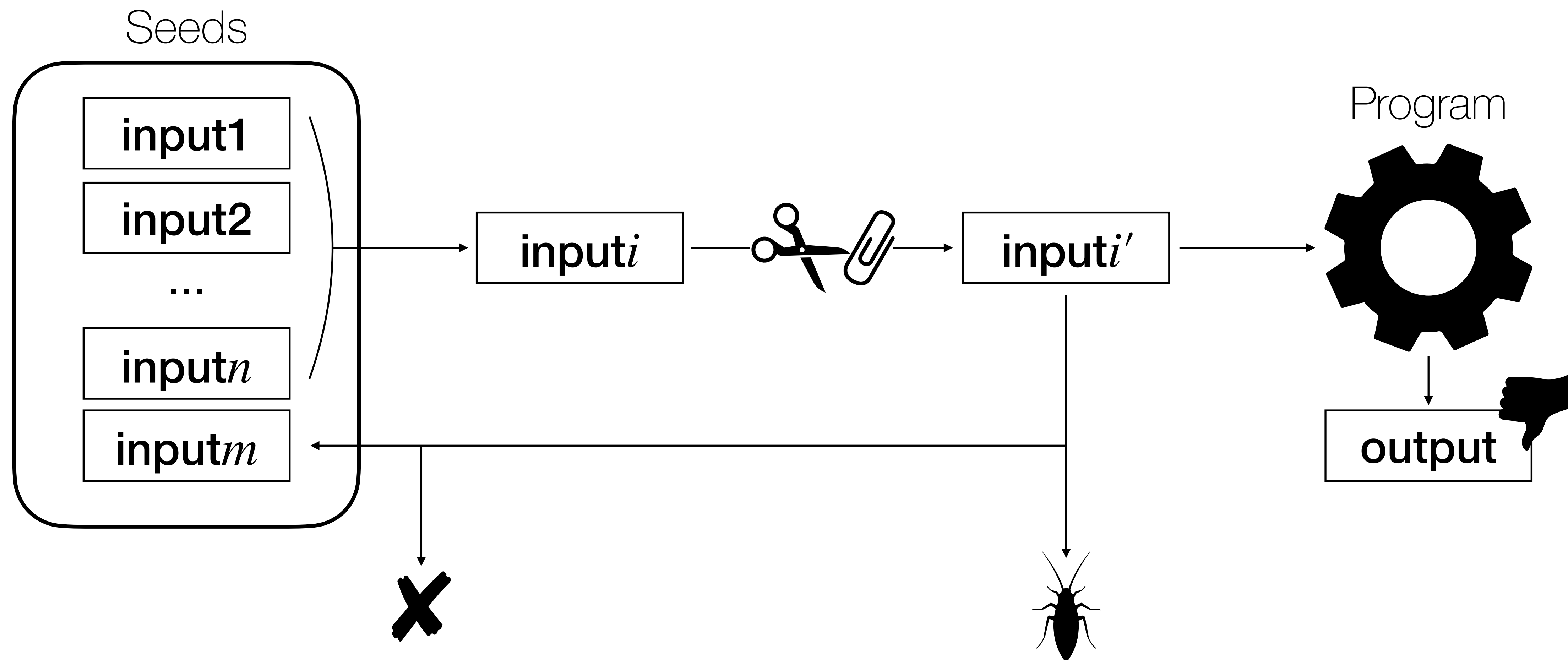
A fuzzer runs a program with random inputs.



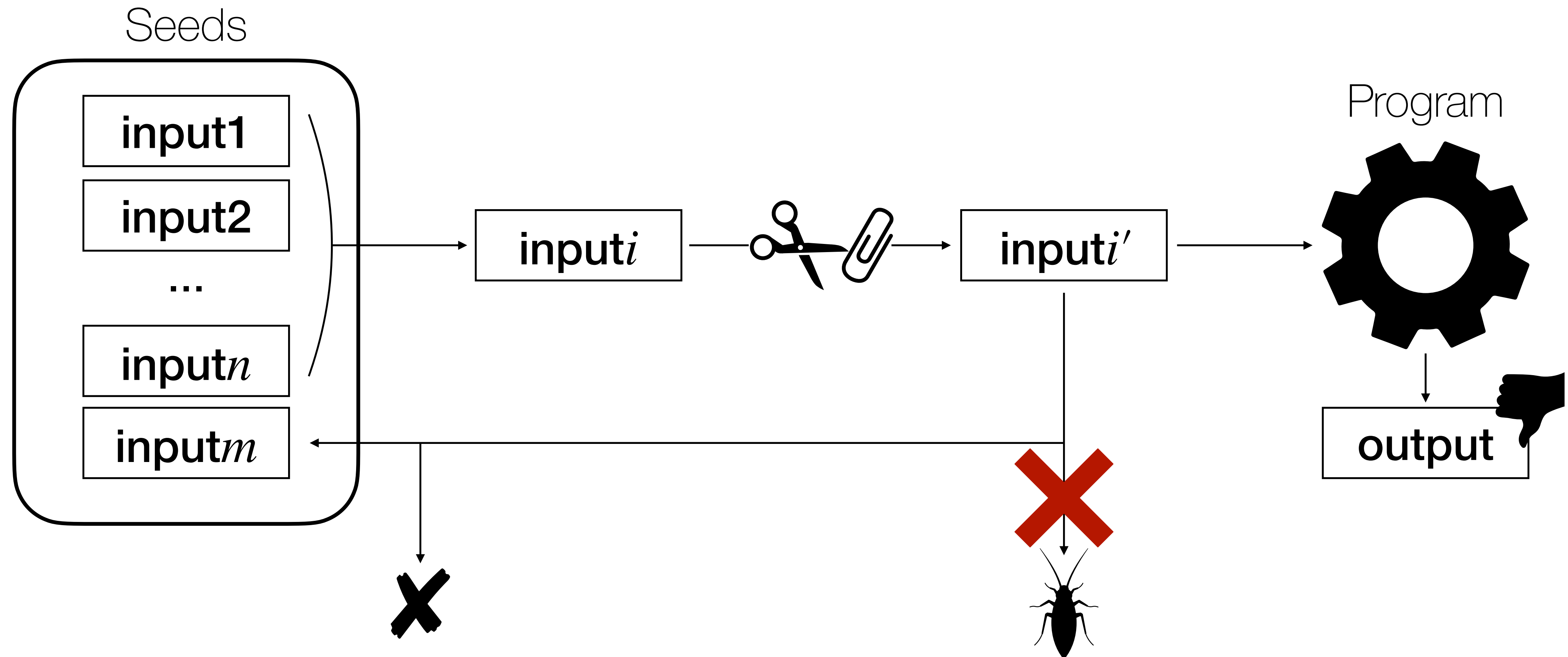
A fuzzer runs a program with random inputs.



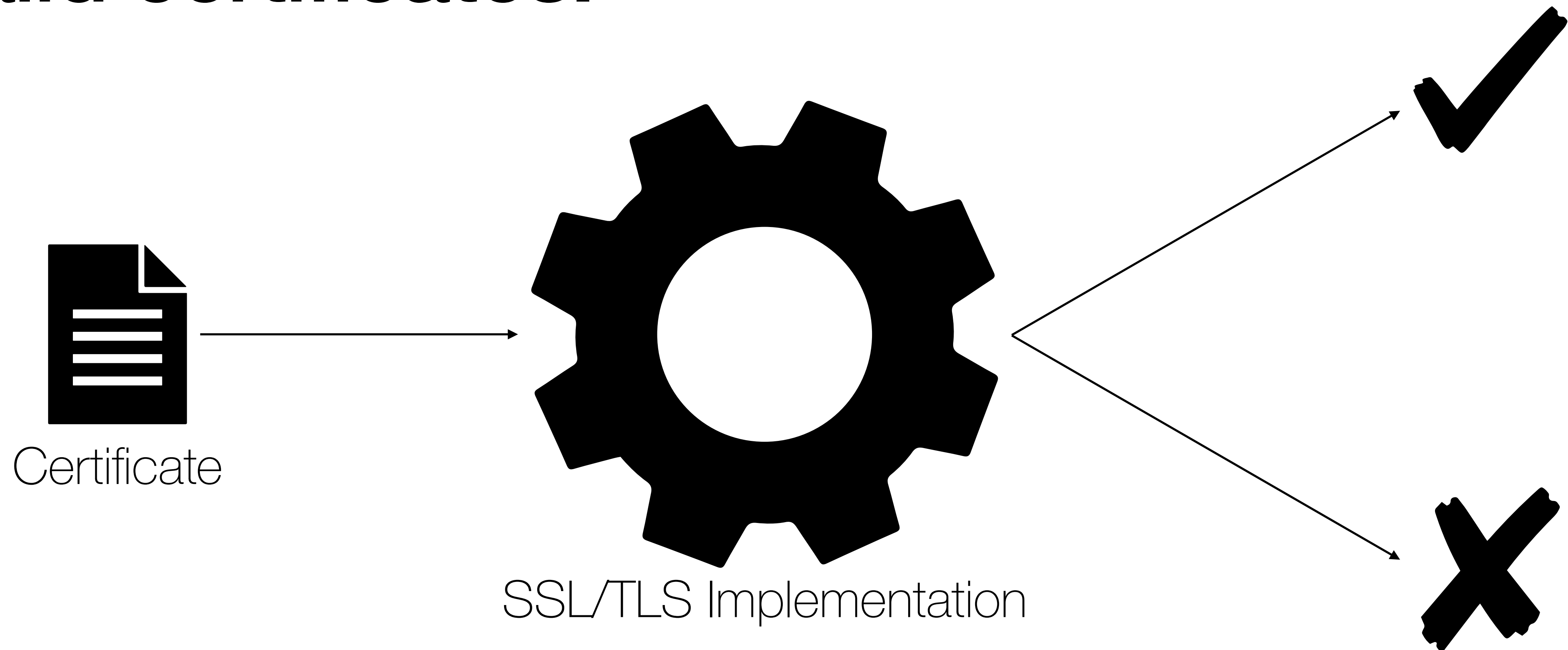
A fuzzer runs a program with random inputs.



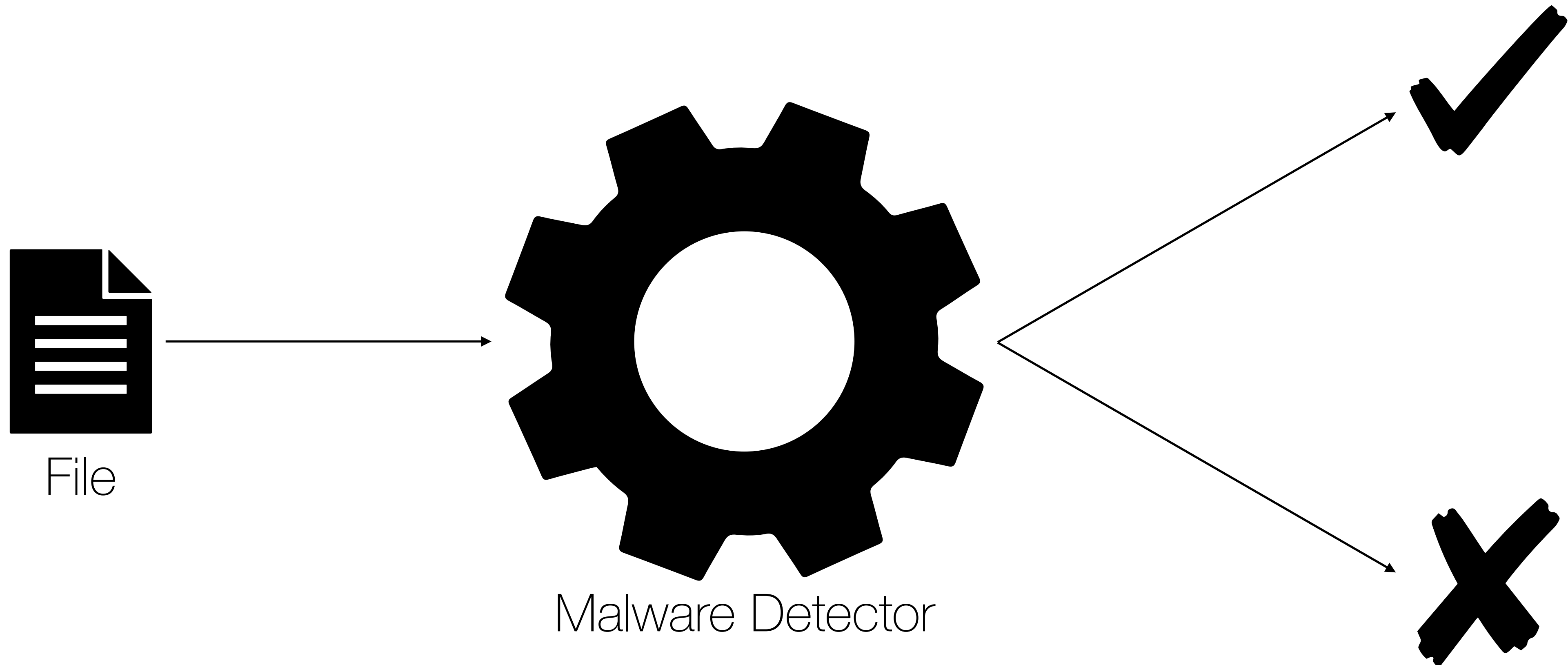
Most semantic bugs are silent.



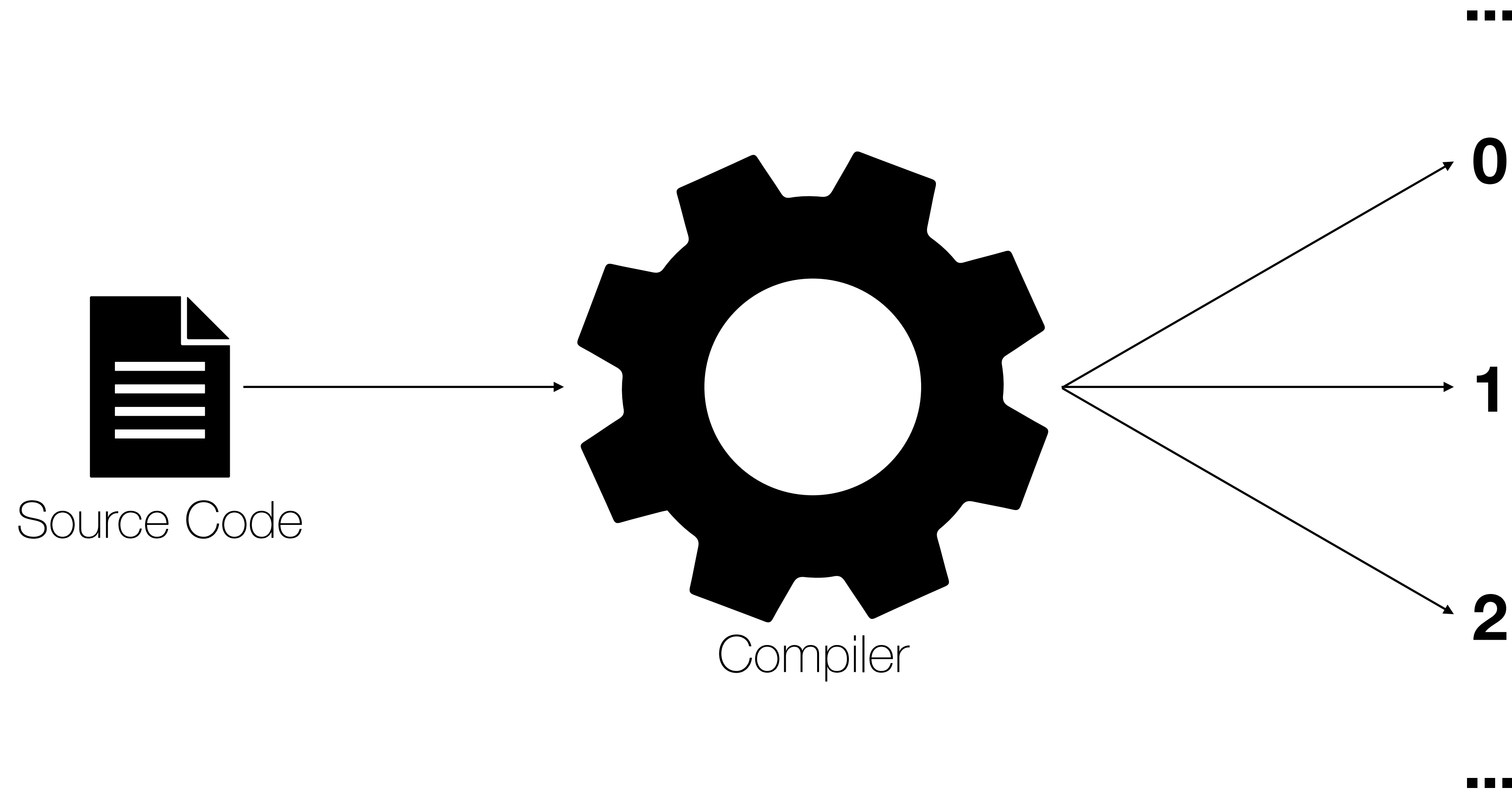
SSL/TLS implementations may accept invalid certificates.



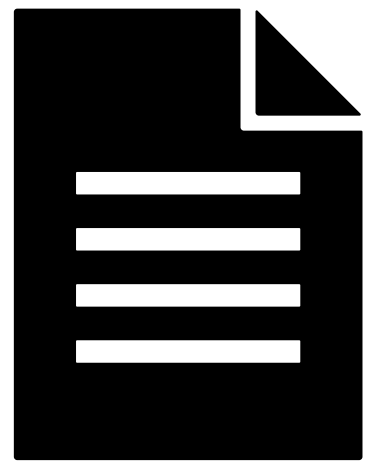
Malware detectors may miss malicious files.



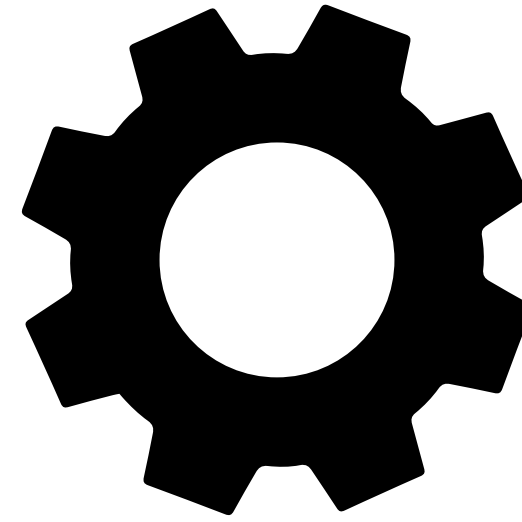
Compilers may produce wrong binaries.



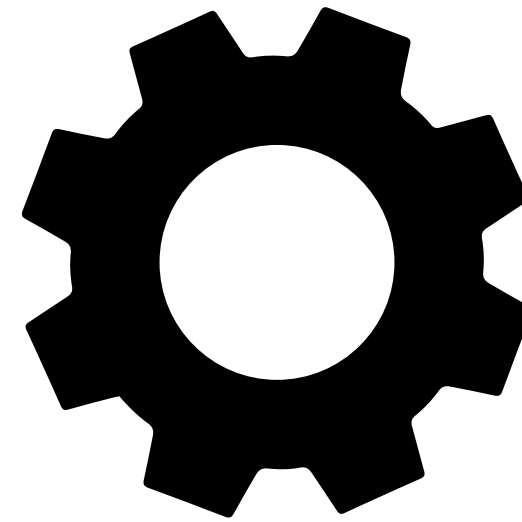
Various SSL/TLS implementations exist.



Certificate

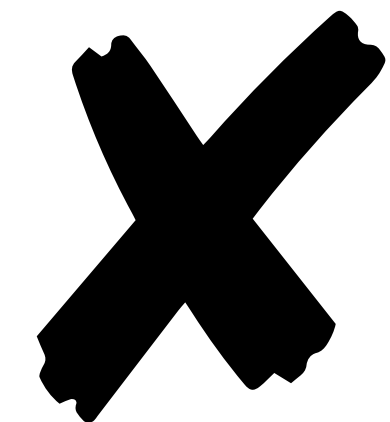
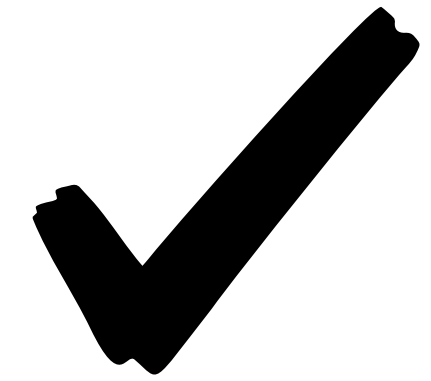


LibreSSL

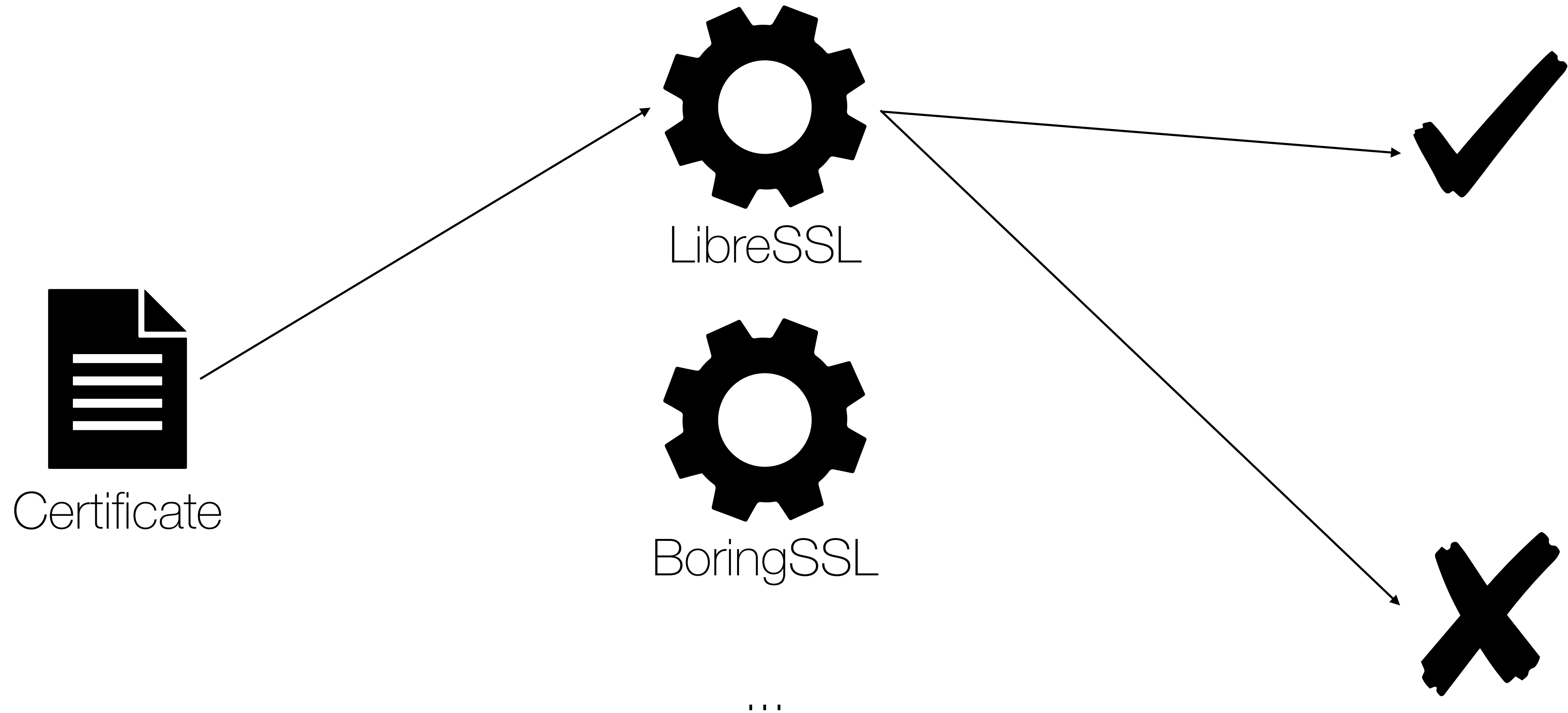


BoringSSL

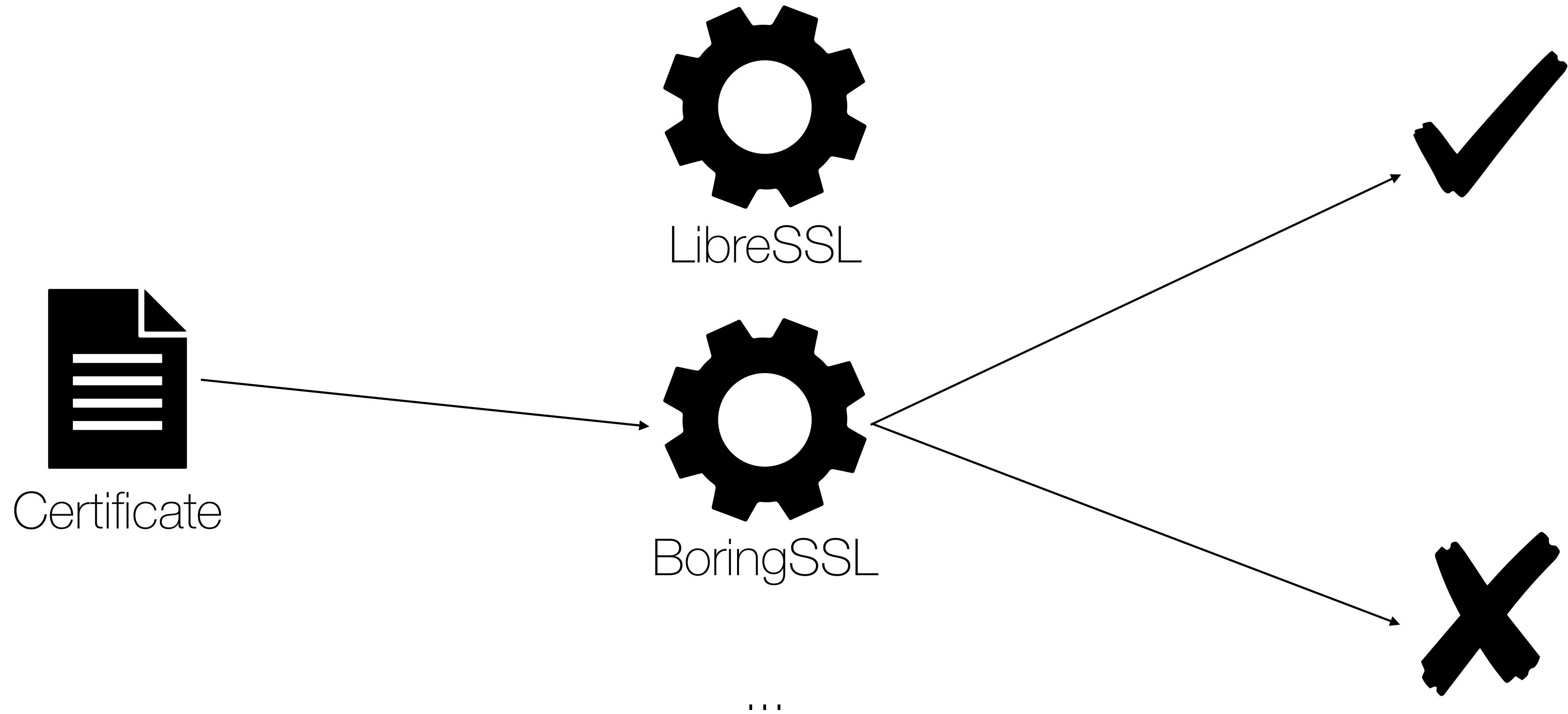
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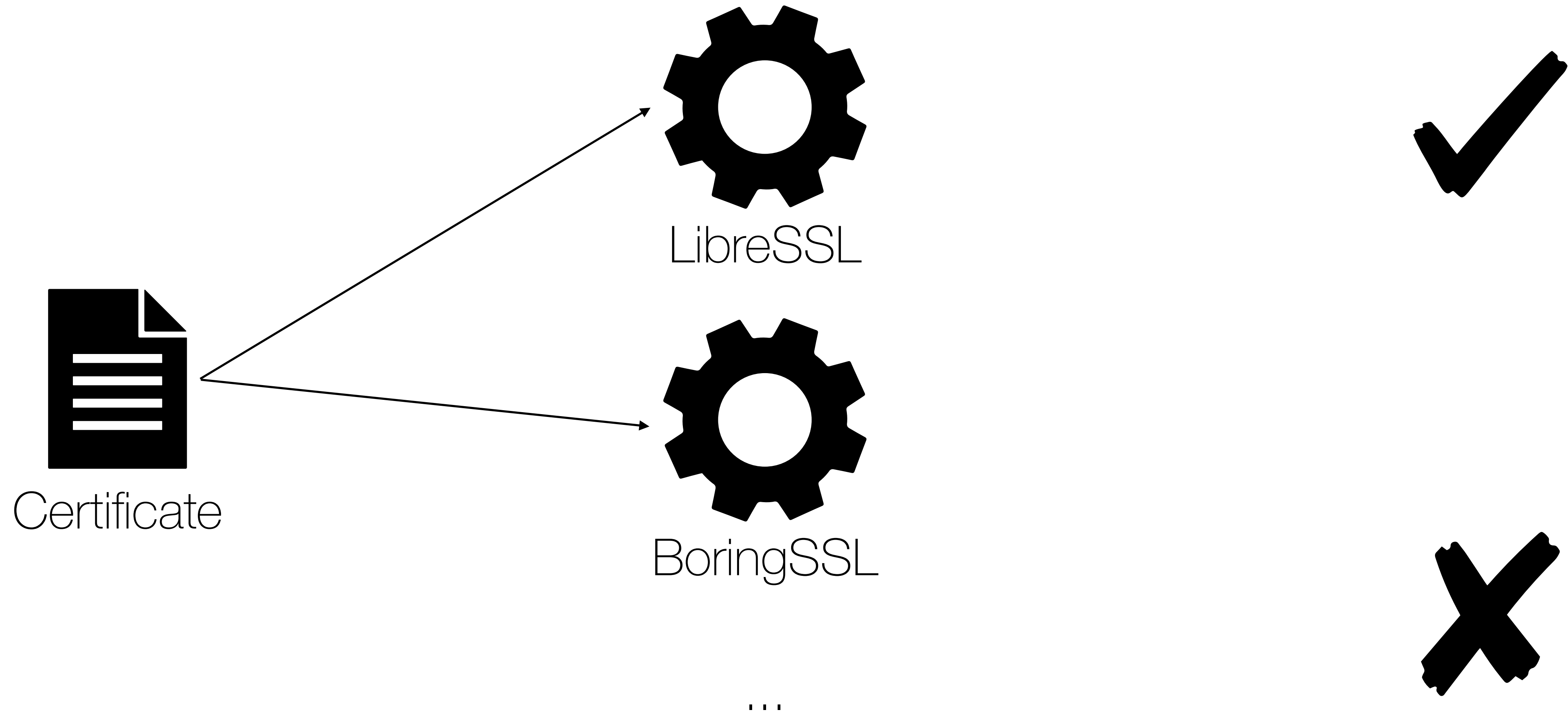
Various SSL/TLS implementations exist.



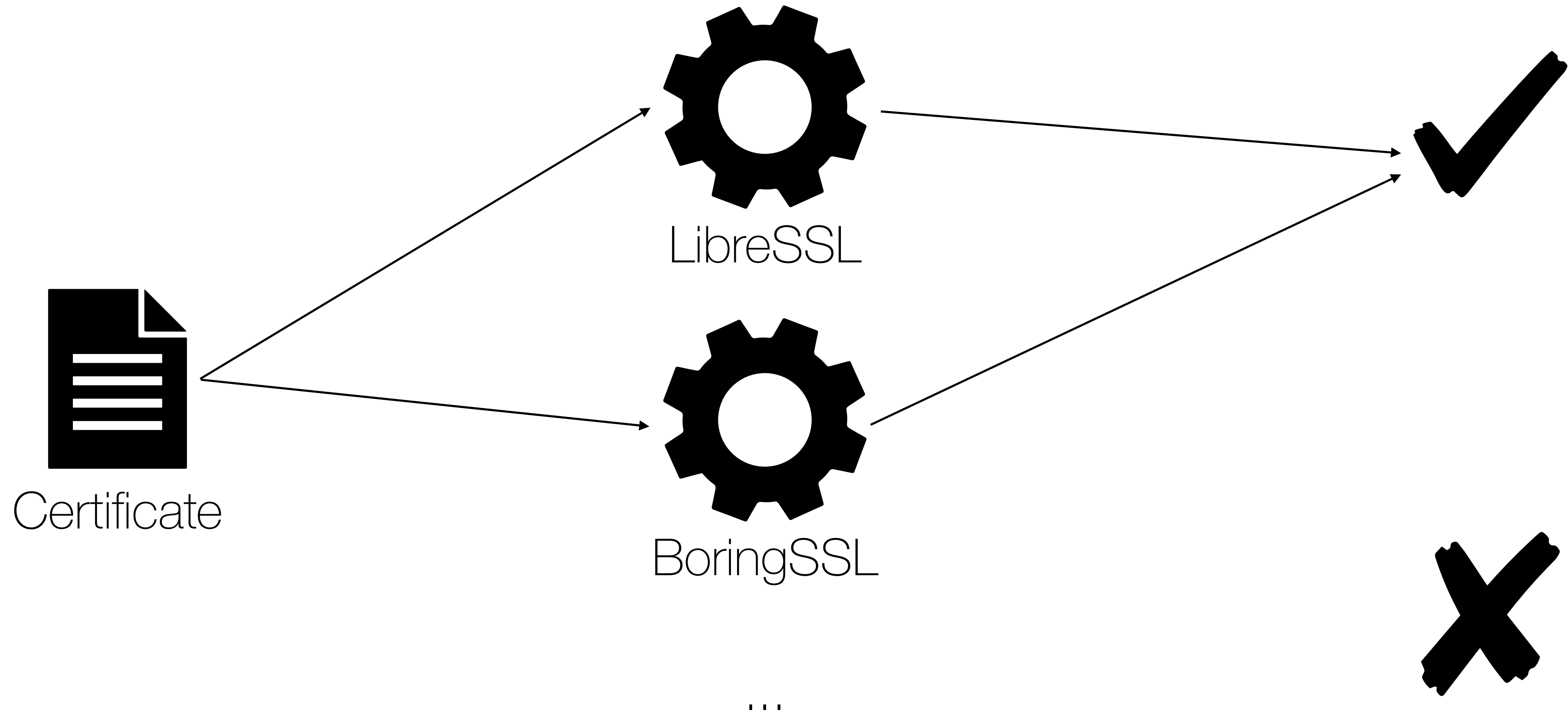
Various SSL/TLS implementations exist.



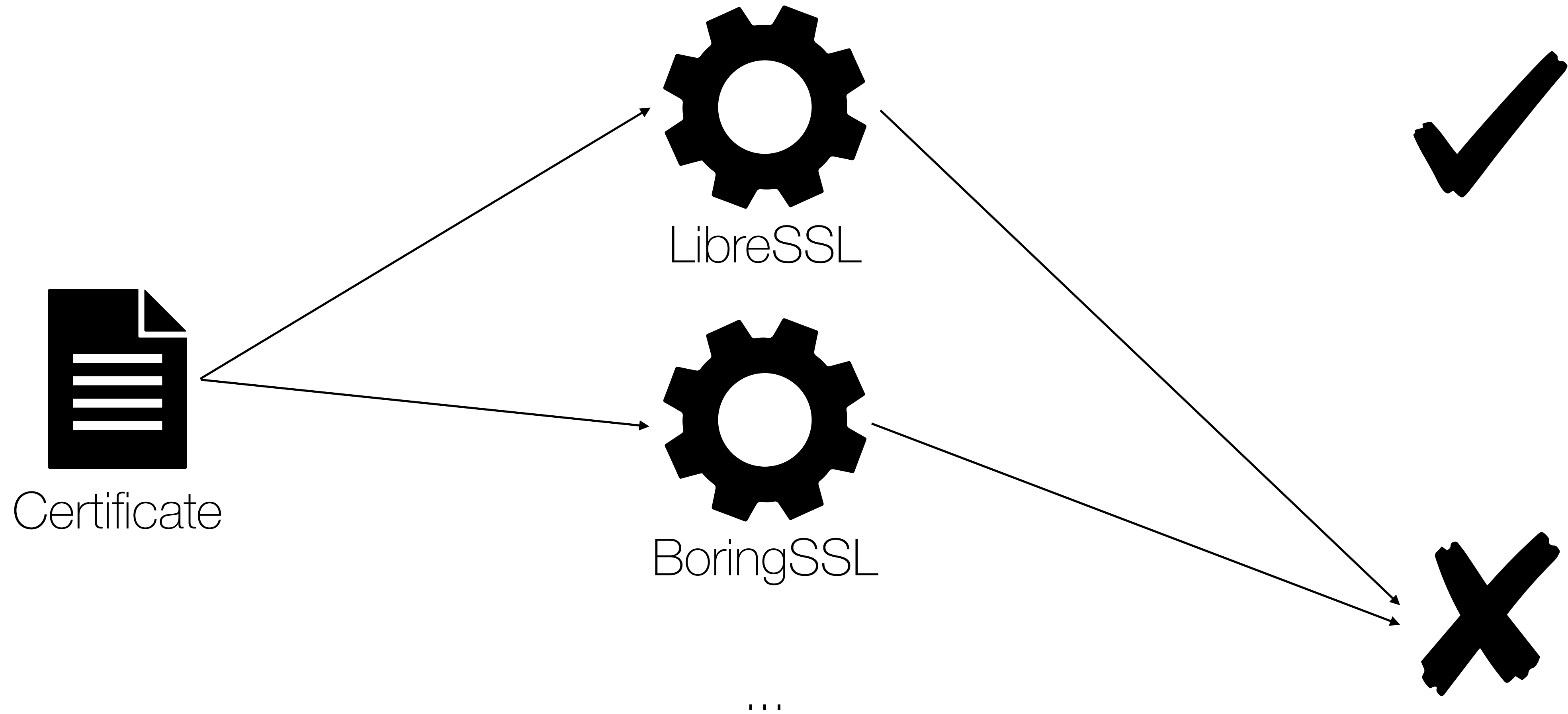
Various SSL/TLS implementations exist.



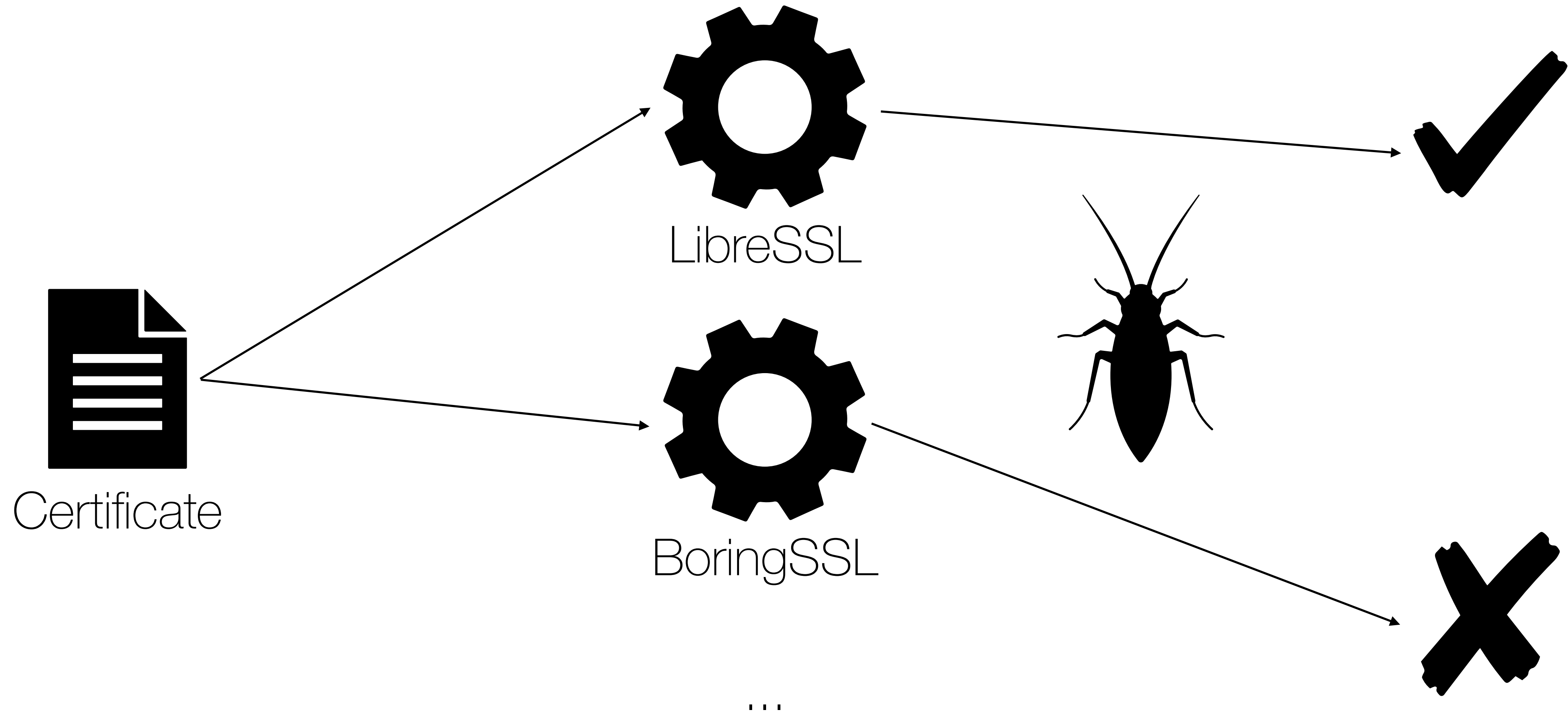
Various SSL/TLS implementations exist.



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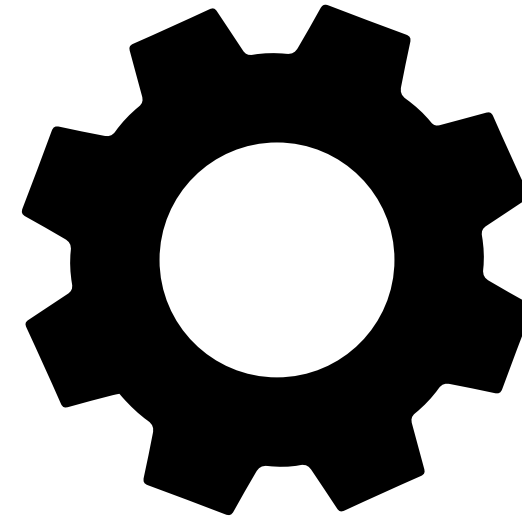
Various SSL/TLS implementations exist.



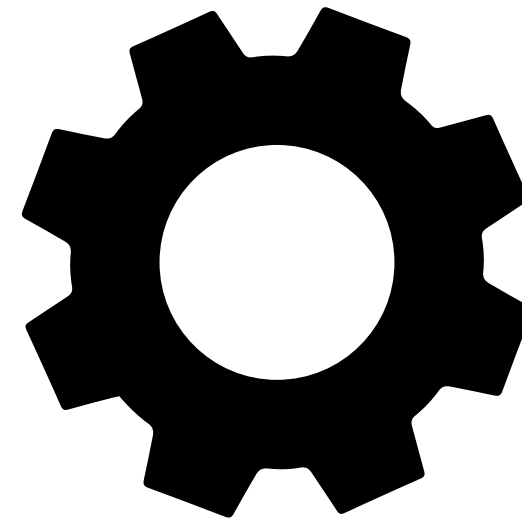
Various C compilers exist.



C Source Code



GCC



Clang

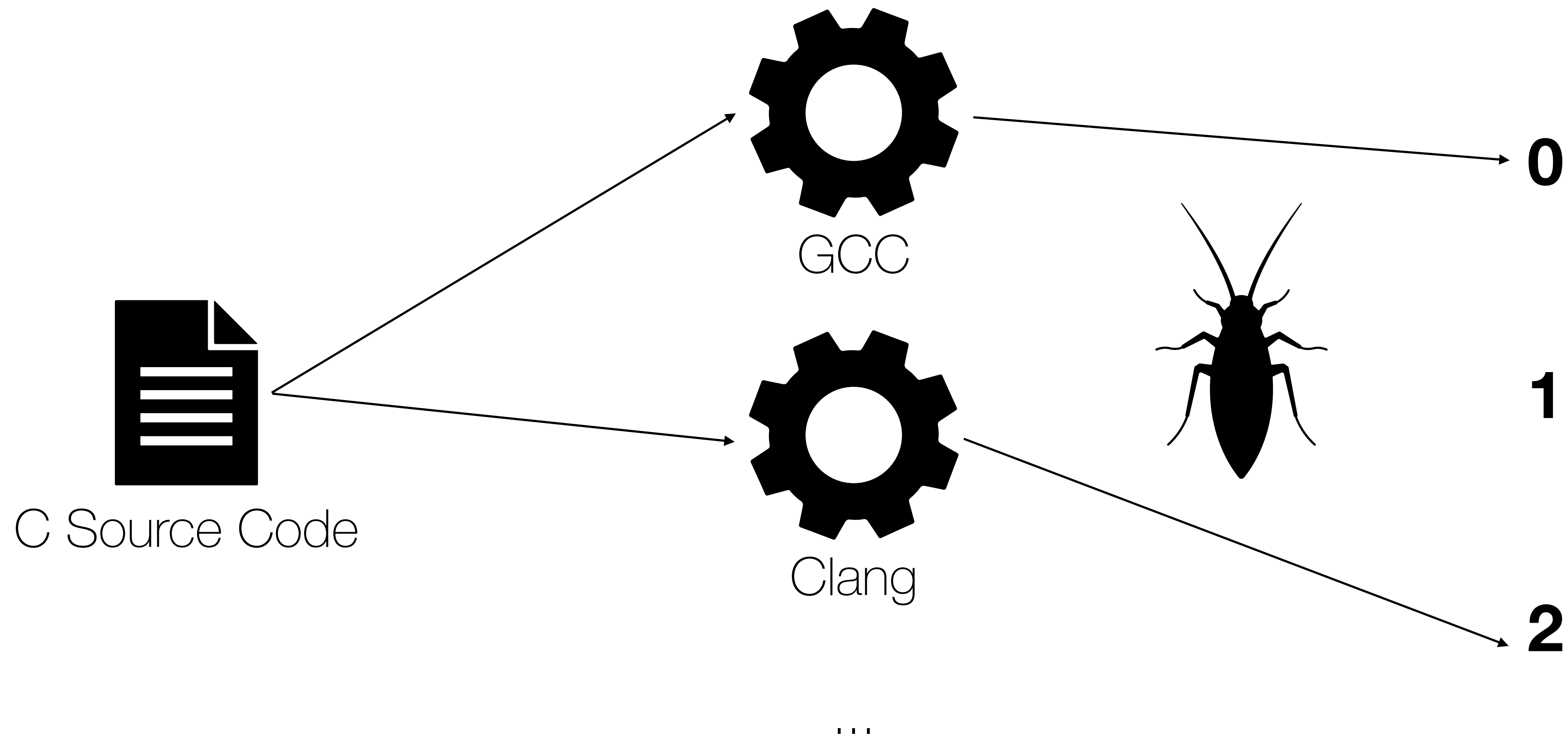
...

0

1

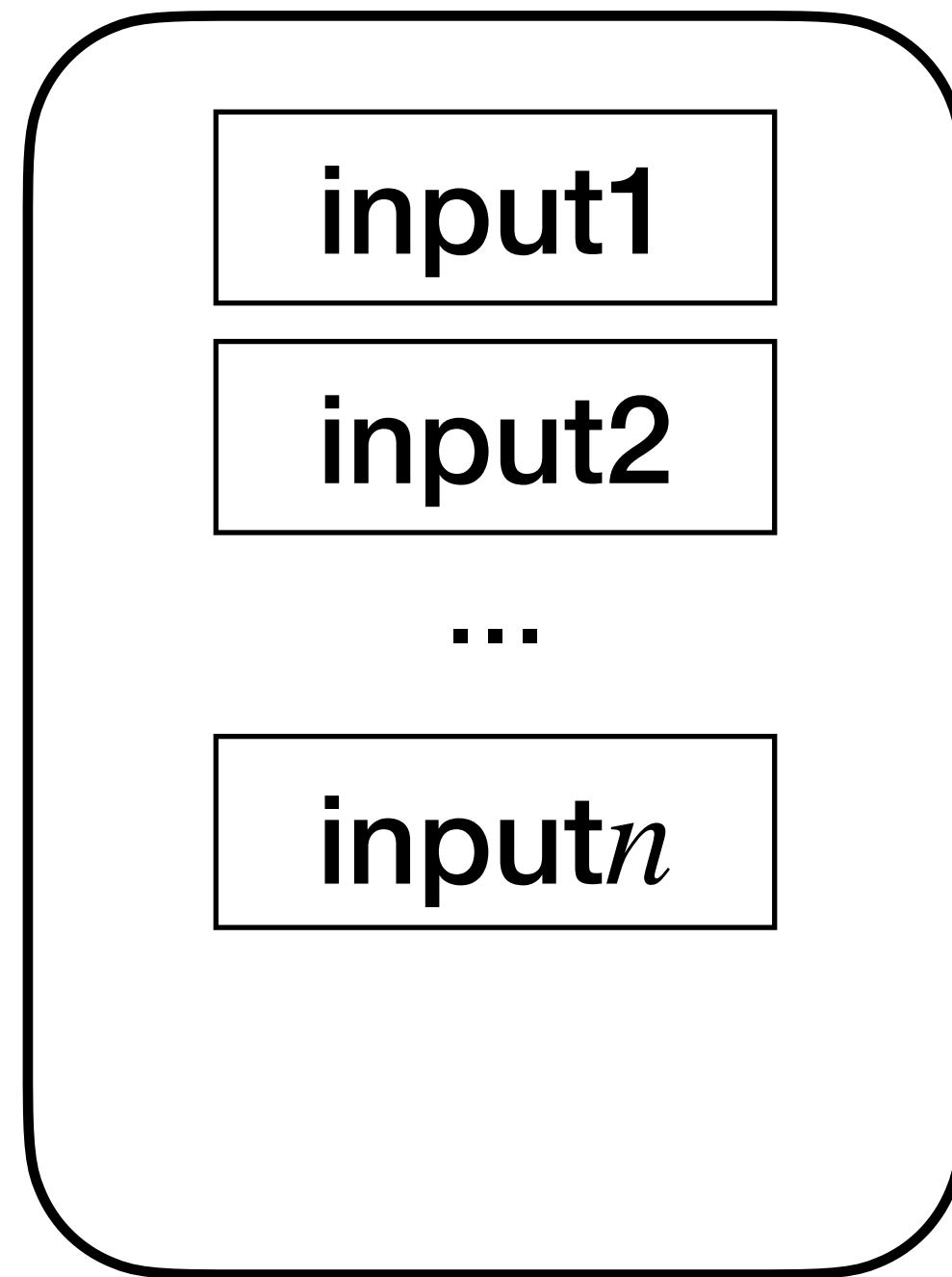
2

Various C compilers exist.

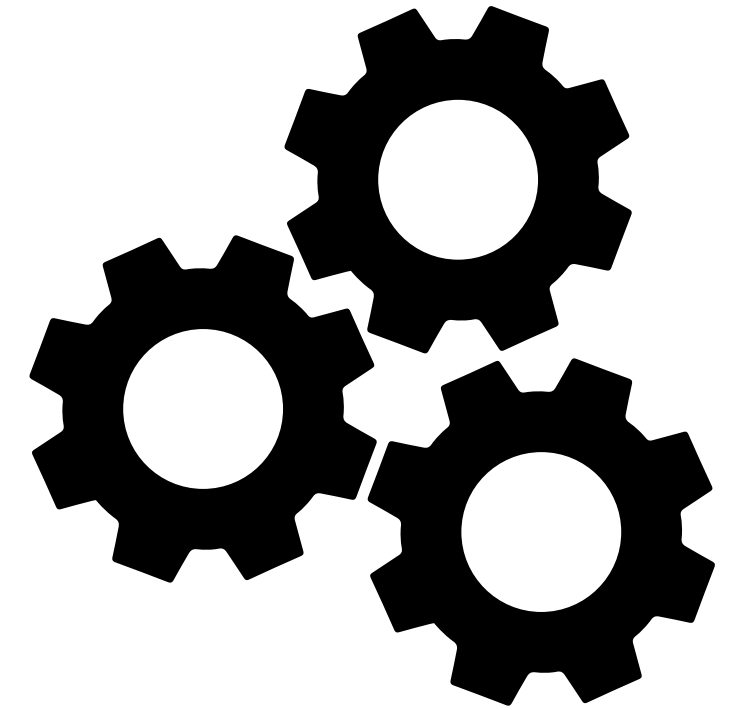


Differential testing runs multiple programs.

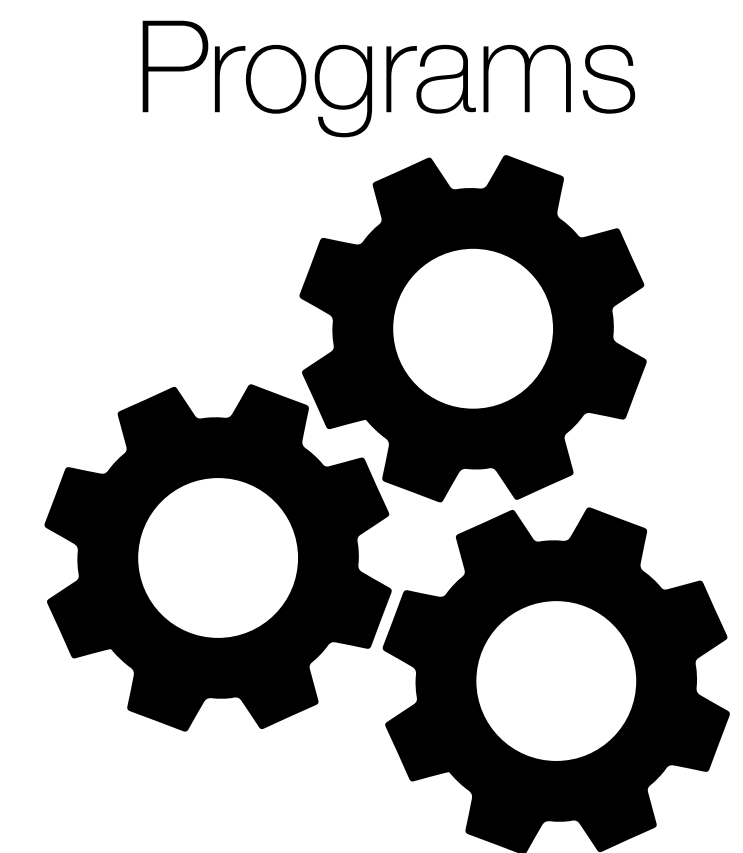
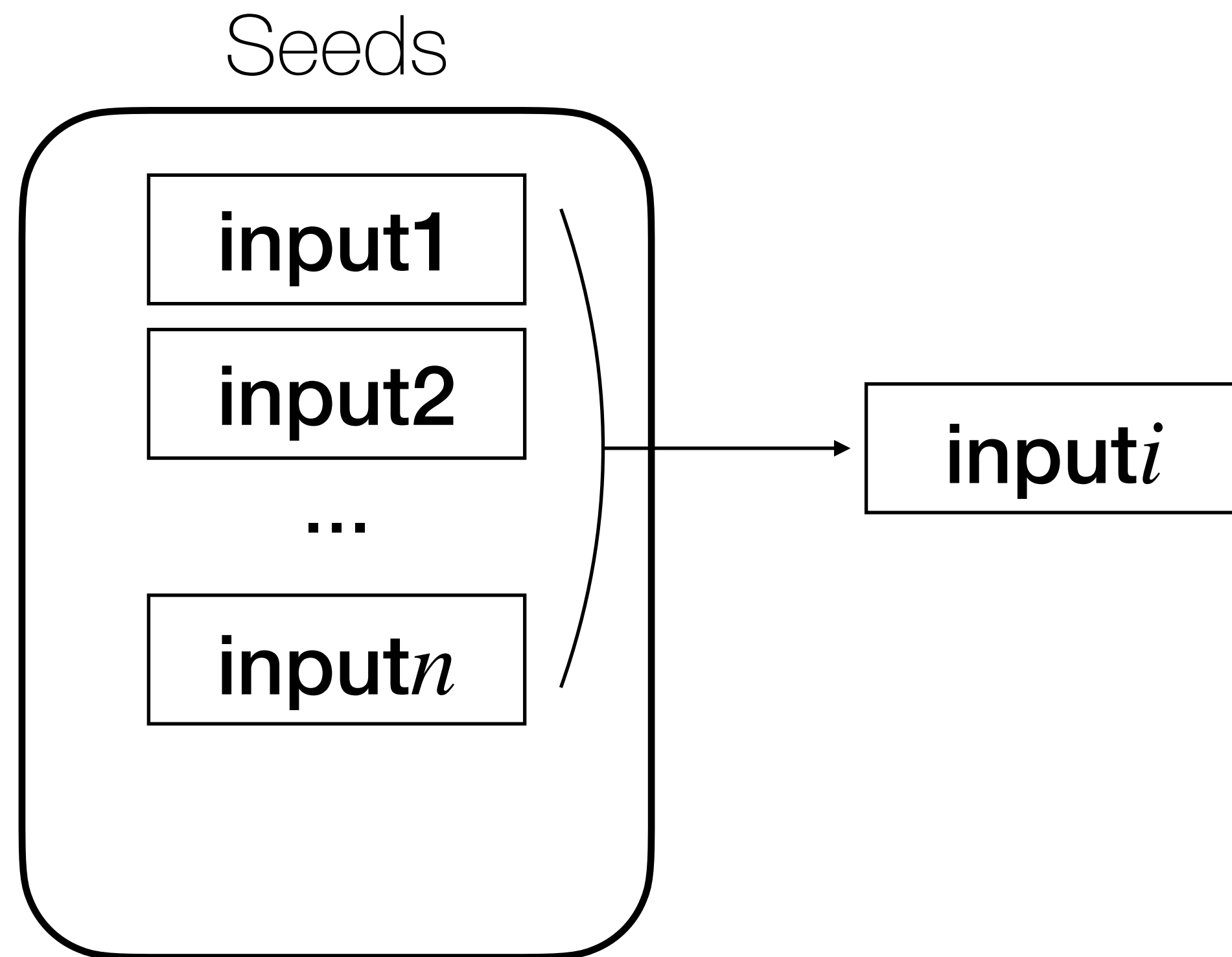
Seeds



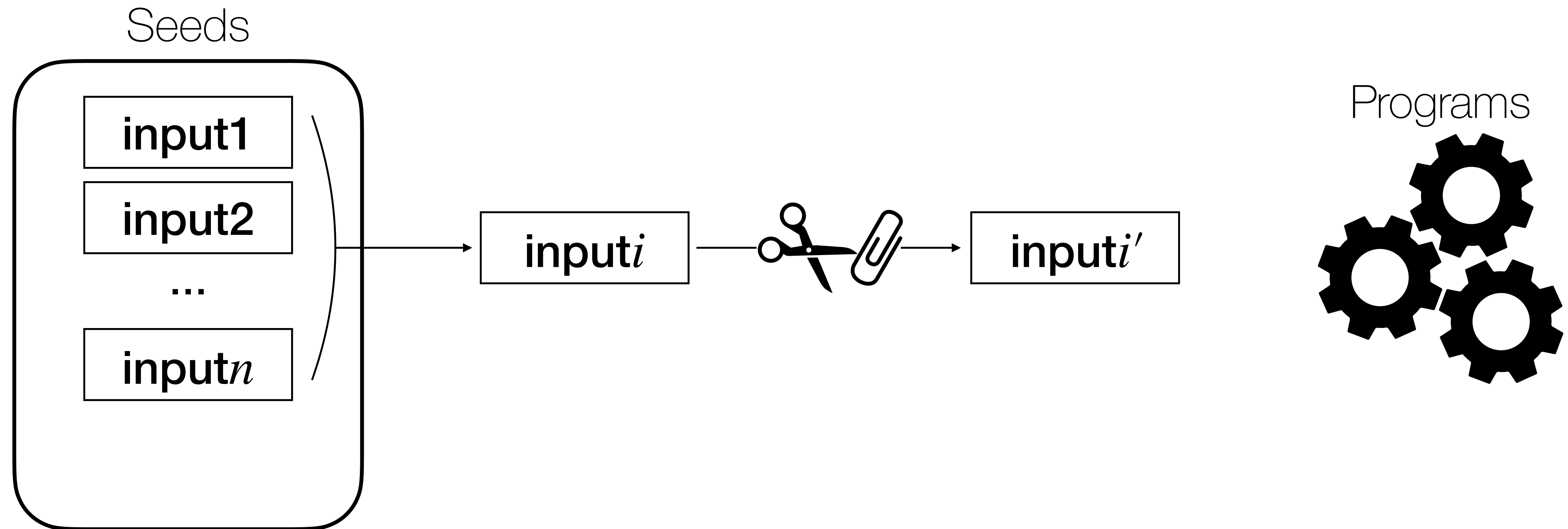
Programs



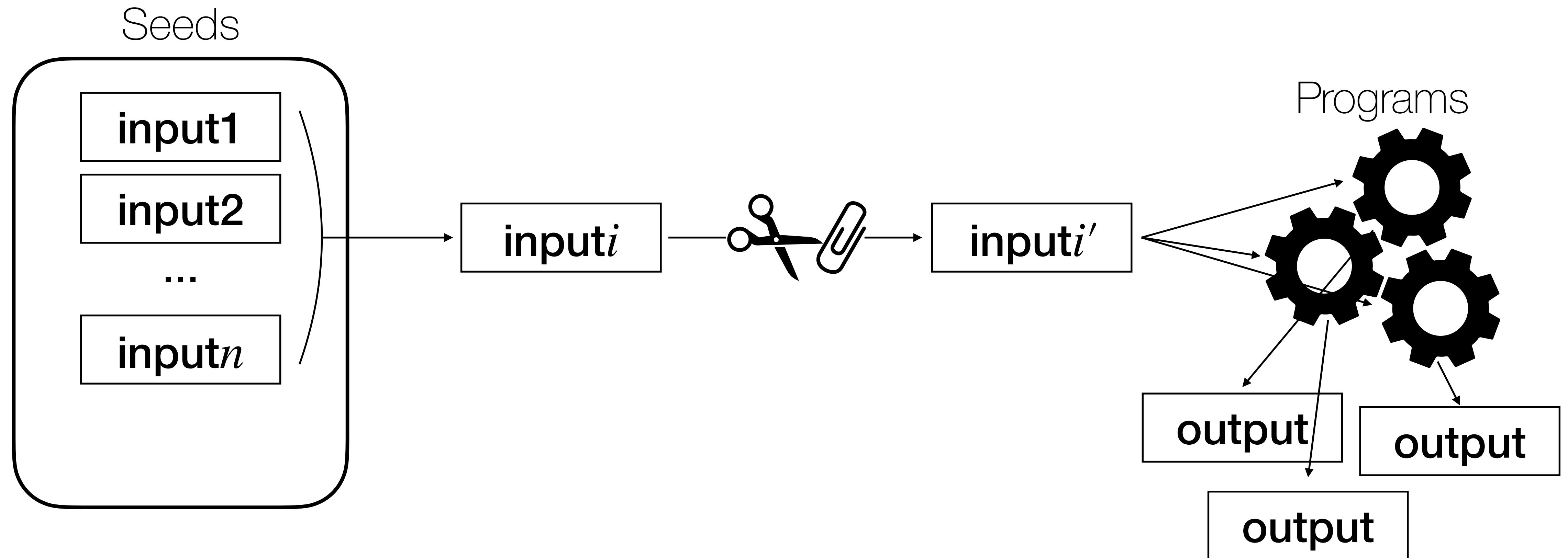
Differential testing runs multiple programs.



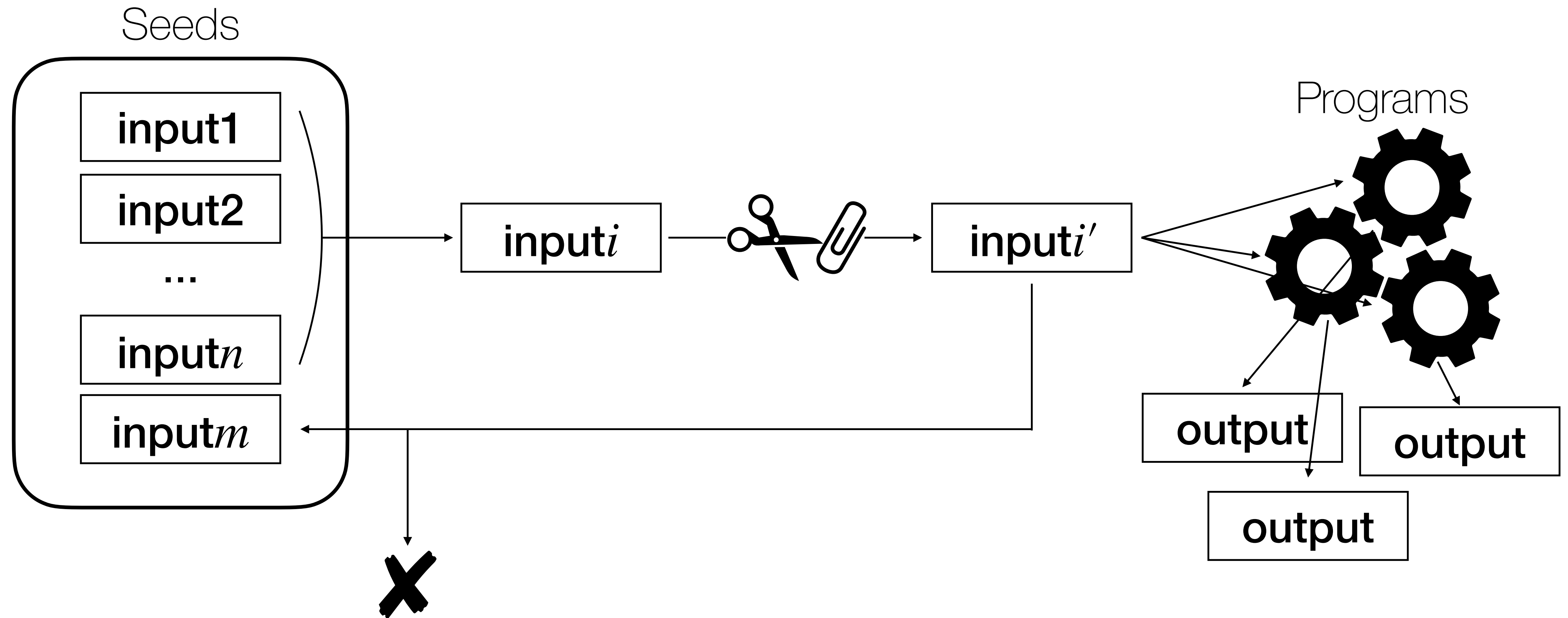
Differential testing runs multiple programs.



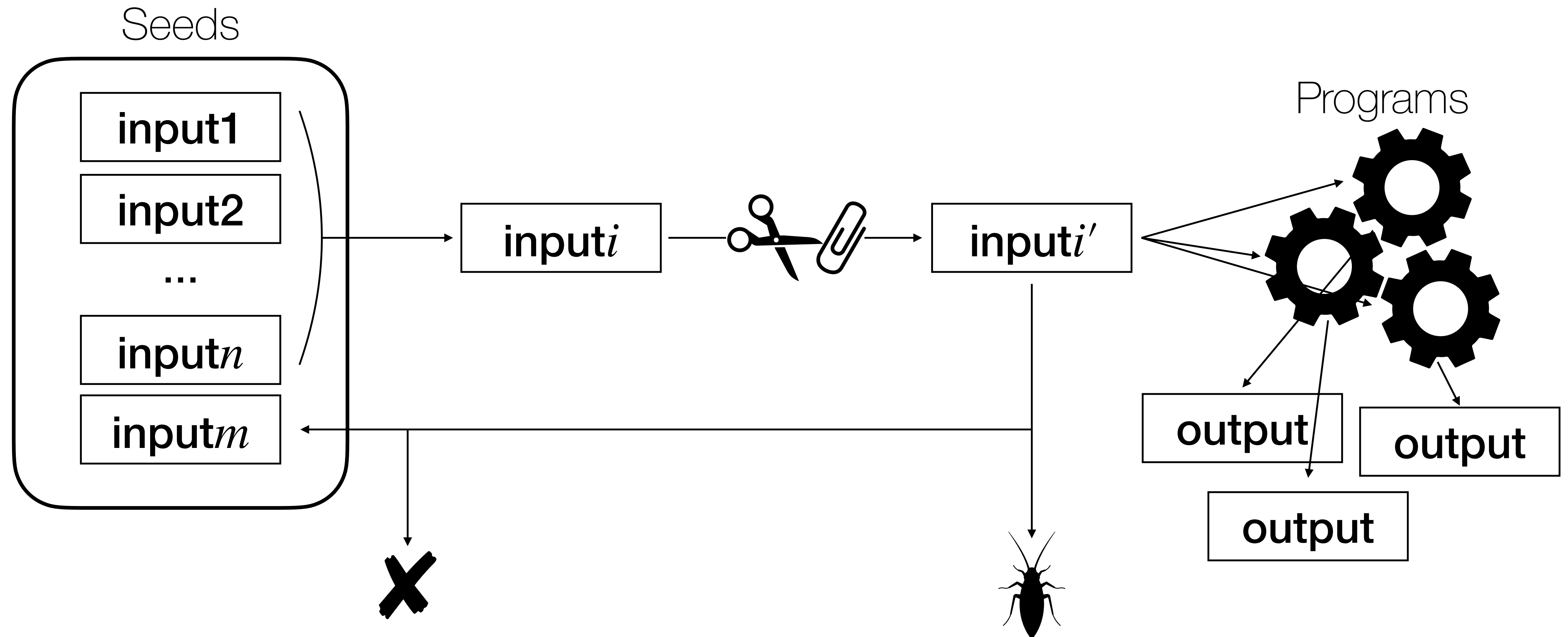
Differential testing runs multiple programs.



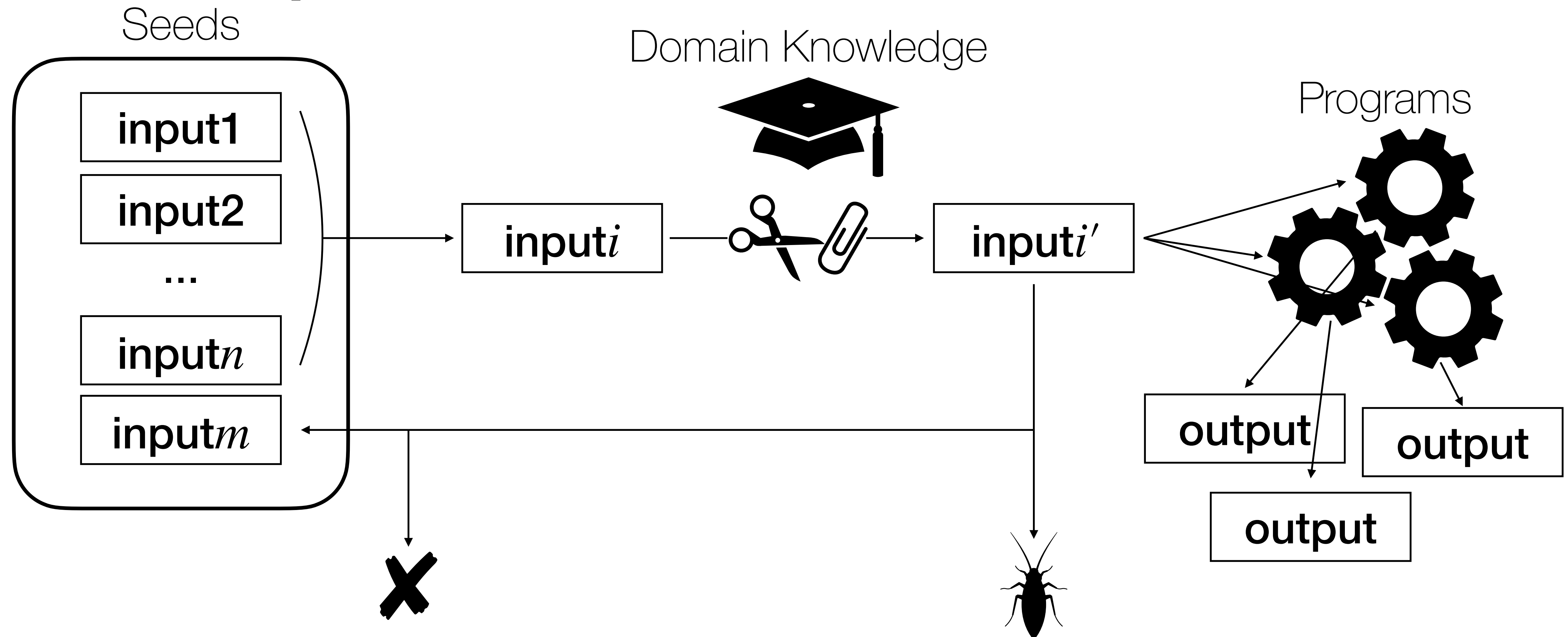
Differential testing runs multiple programs.



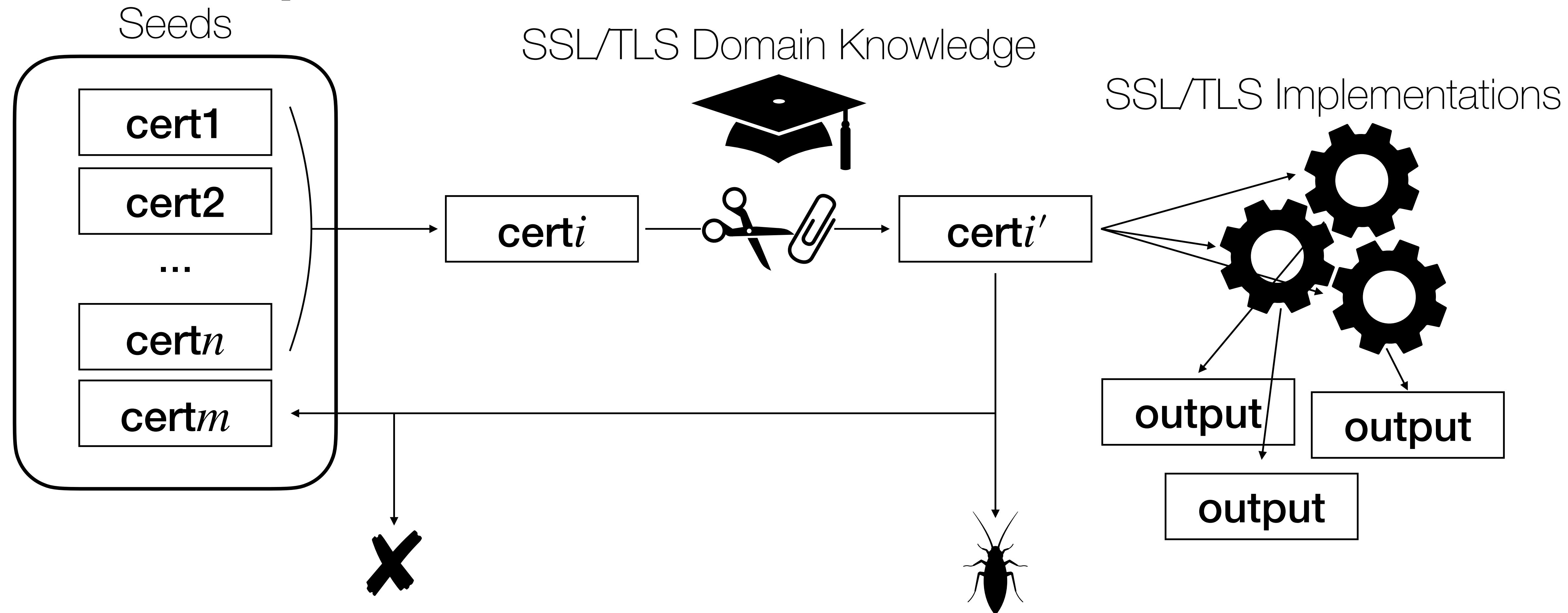
Differential testing runs multiple programs.



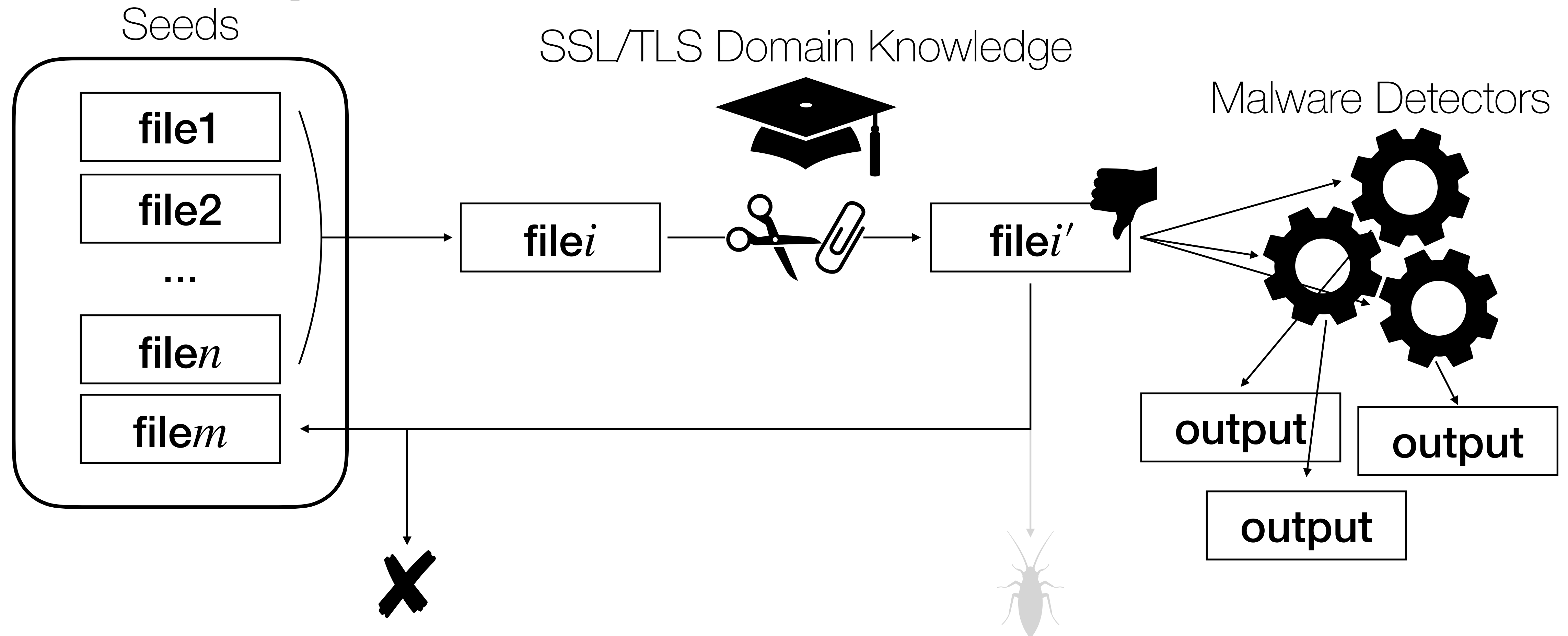
Existing differential testing frameworks are domain-specific.



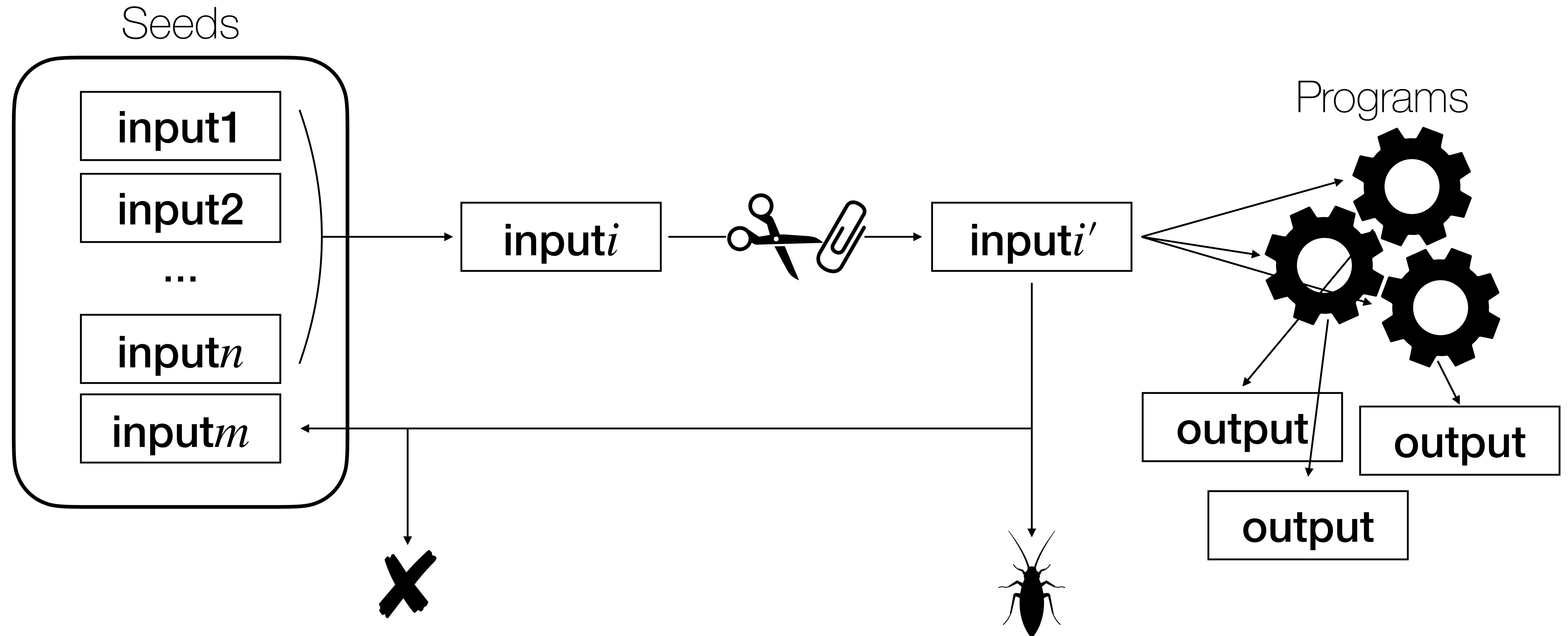
Existing differential testing frameworks are domain-specific.



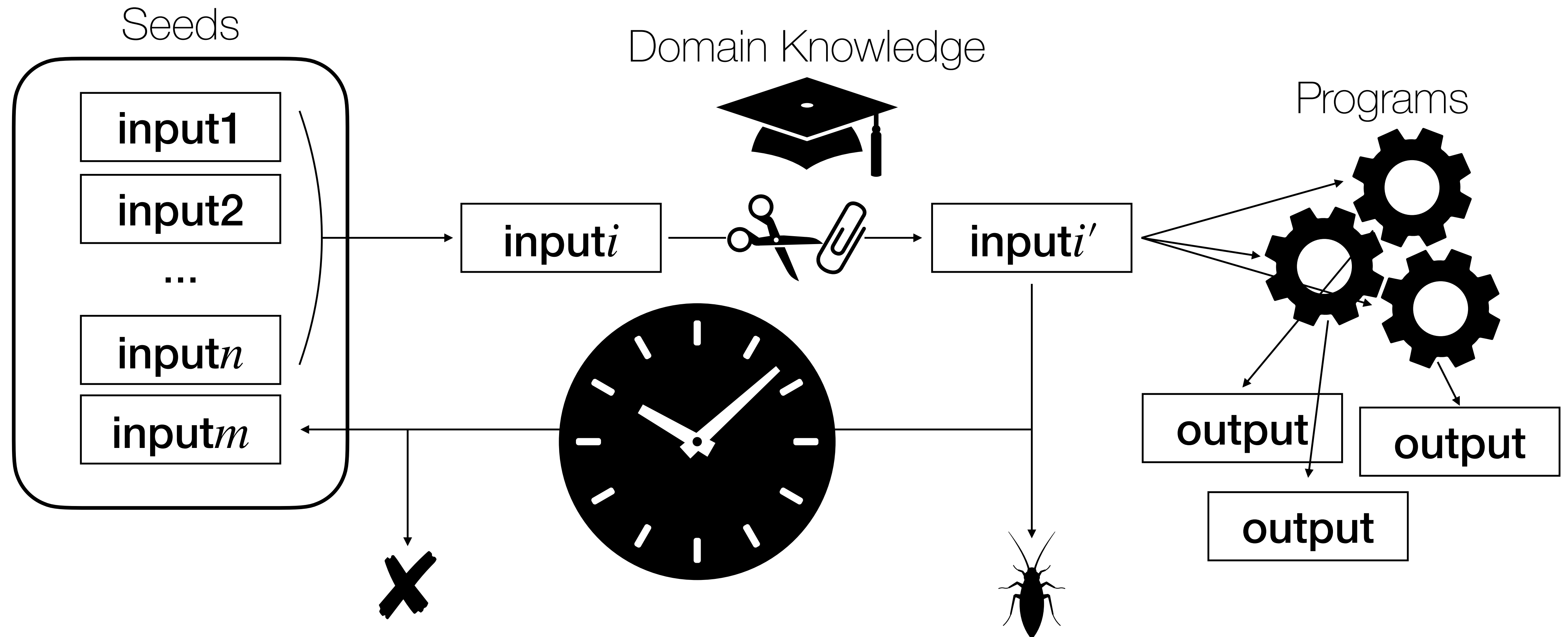
Existing differential testing frameworks are domain-specific.



A domain-independent differential testing framework is required.



Existing domain-specific differential testing frameworks are inefficient.



Existing domain-specific differential testing frameworks are inefficient.



Frankencerts

10,000,000 tests
for 10 discrepancies

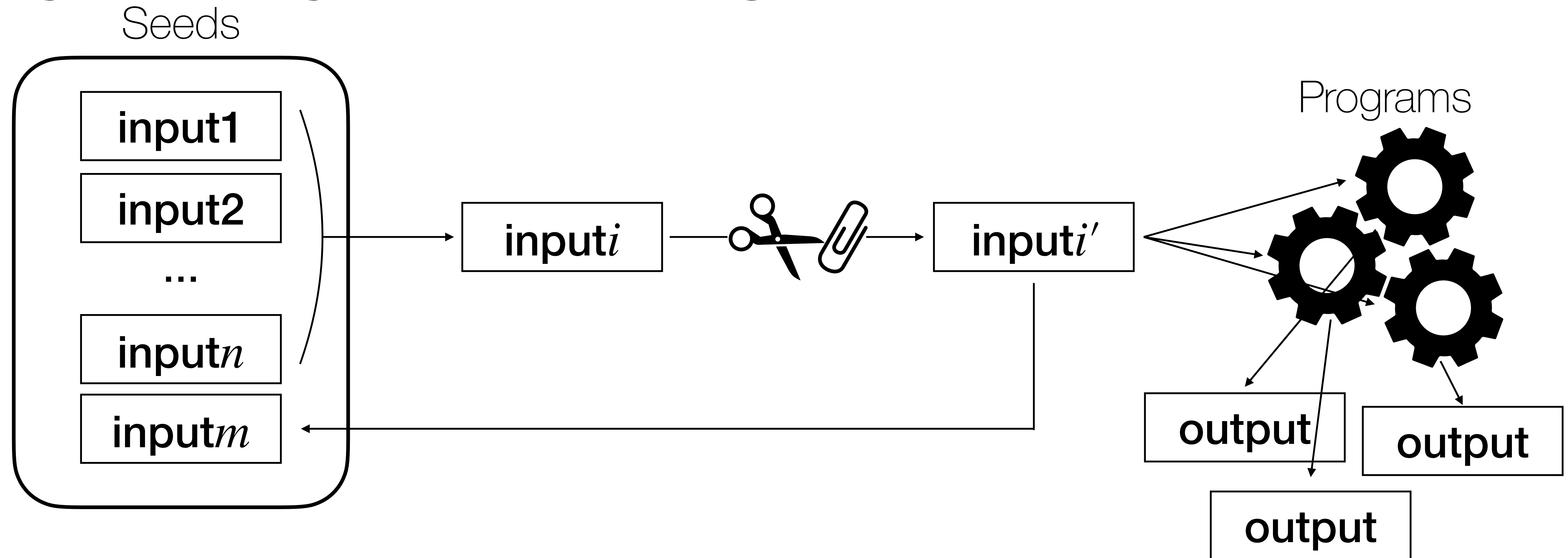
Mucerts

6 days
for 19 discrepancies

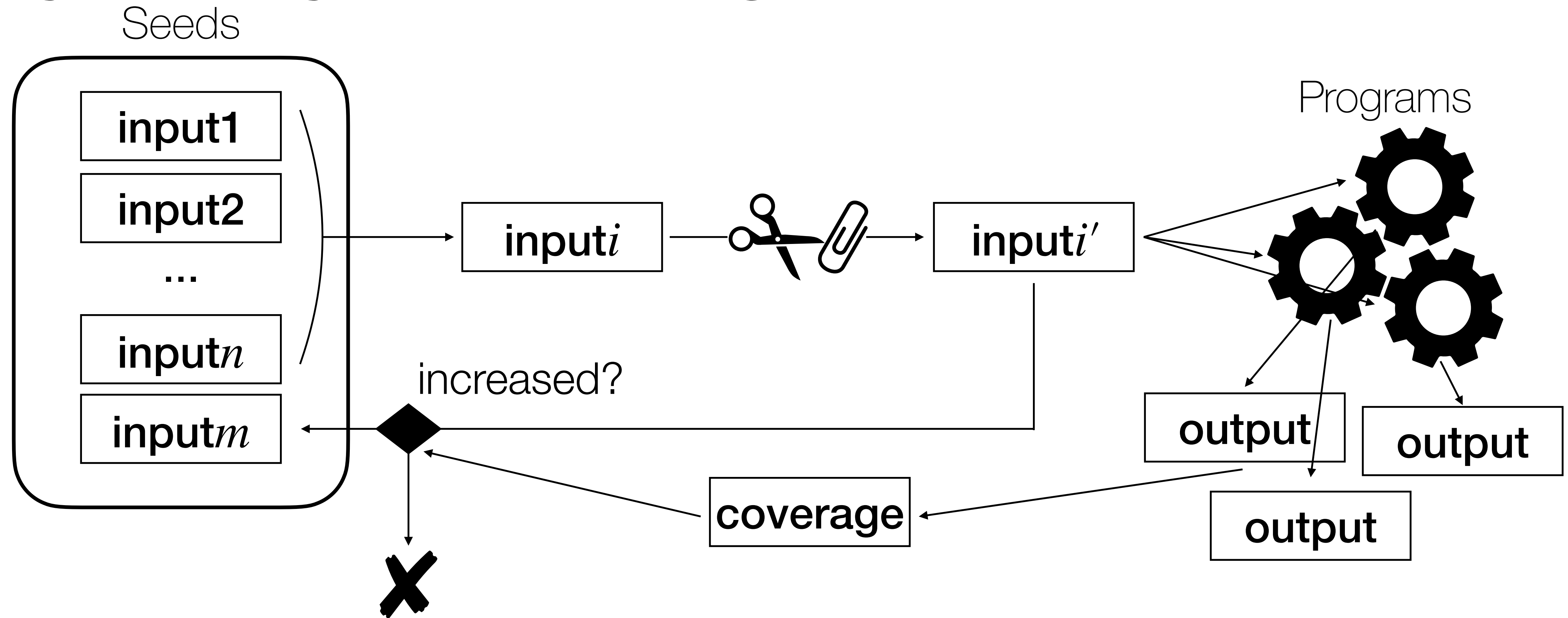
NEZHA

is a domain-independent differential testing framework outperforming existing frameworks.

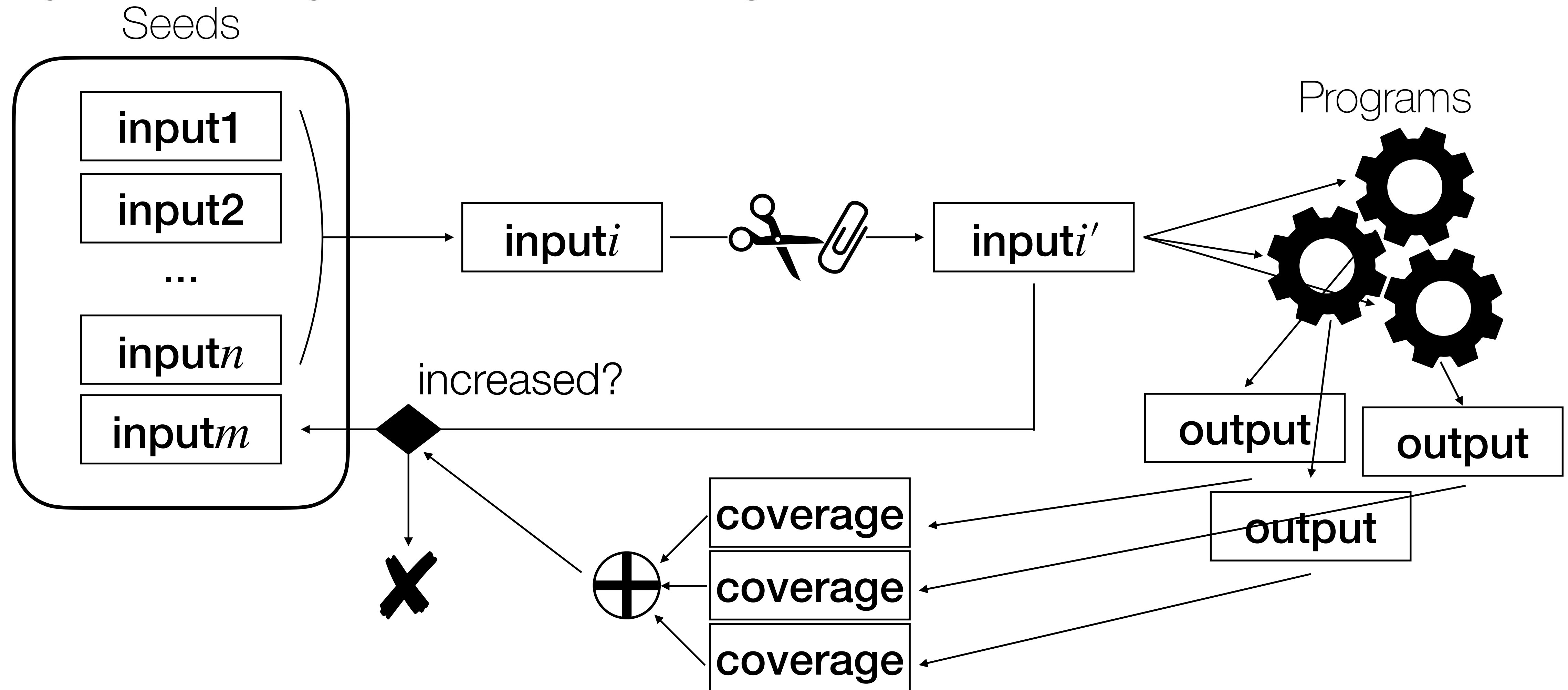
Existing differential testing frameworks ignore asymmetry across programs.



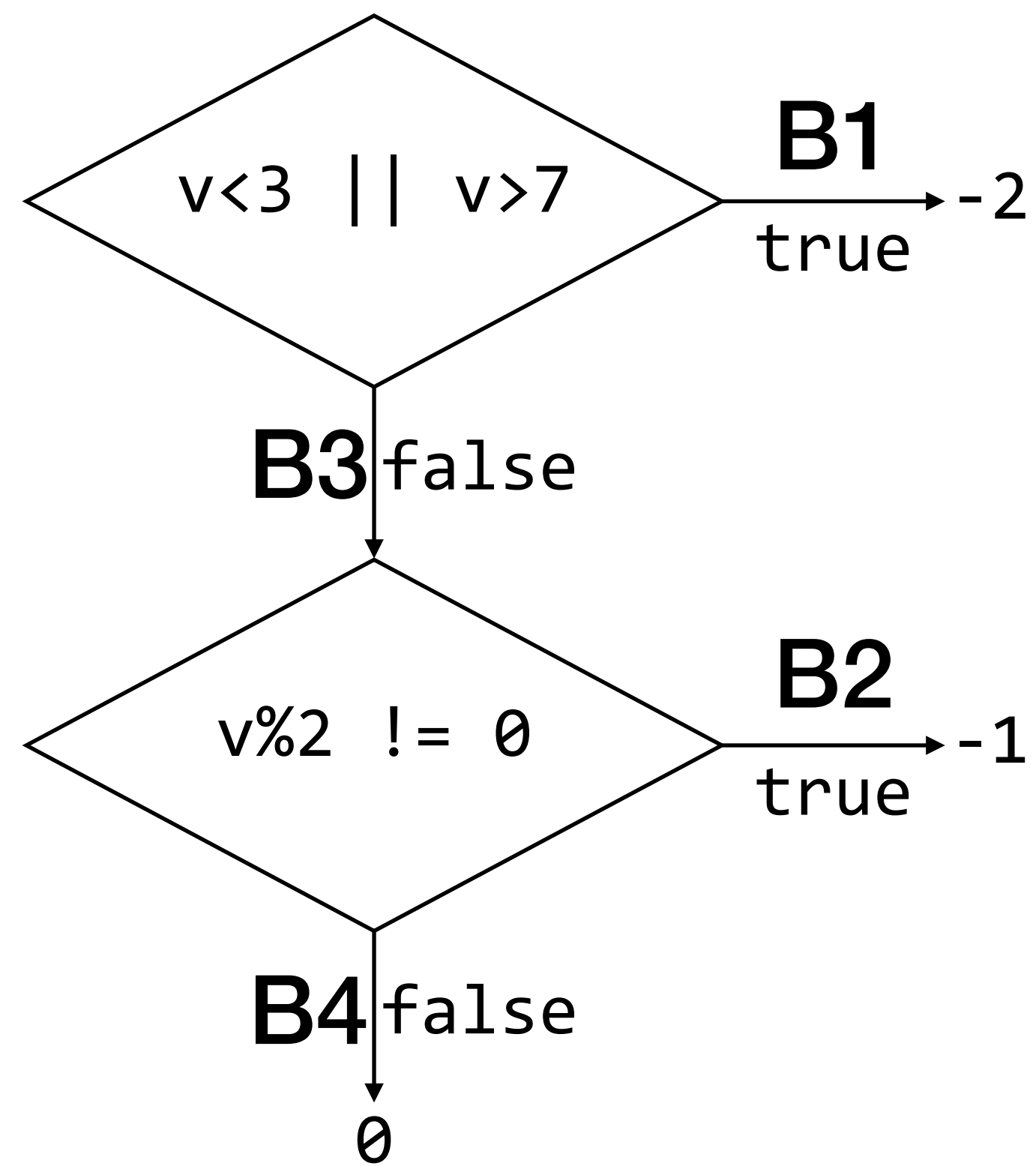
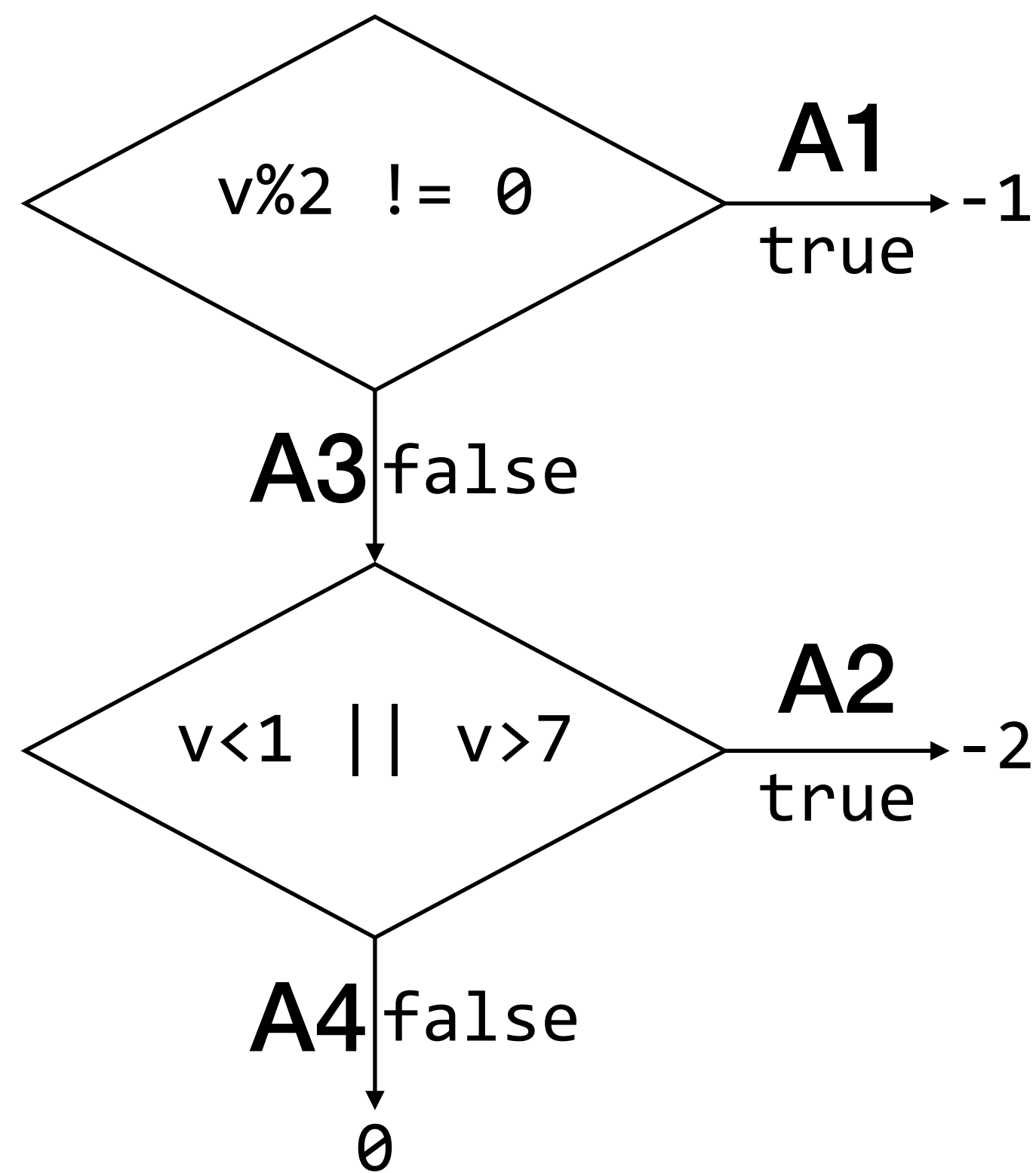
Existing differential testing frameworks ignore asymmetry across programs.



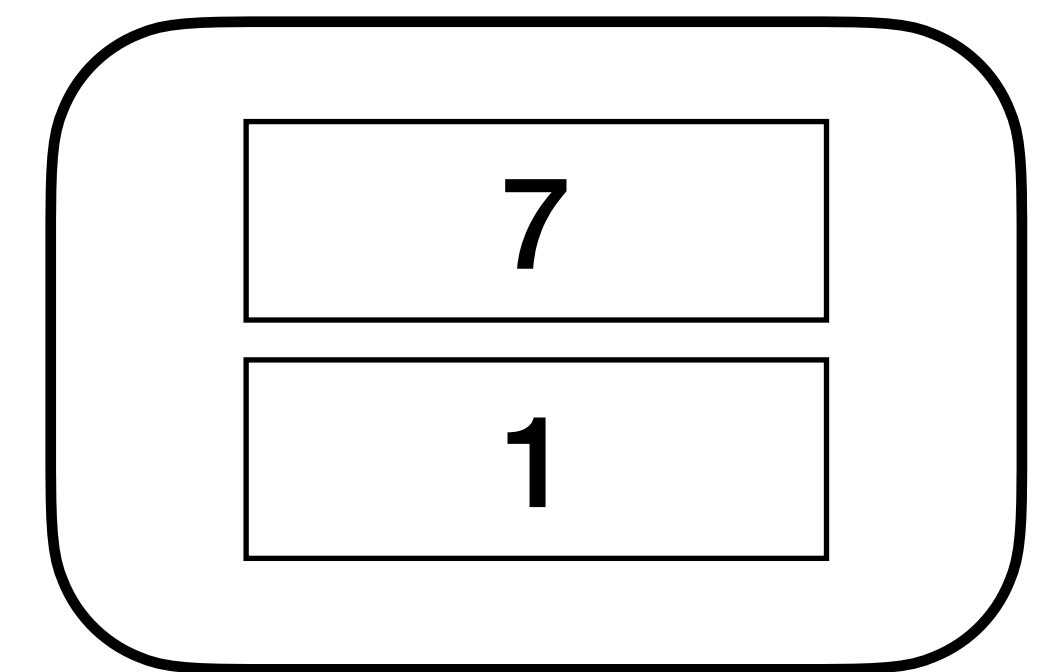
Existing differential testing frameworks ignore asymmetry across programs.



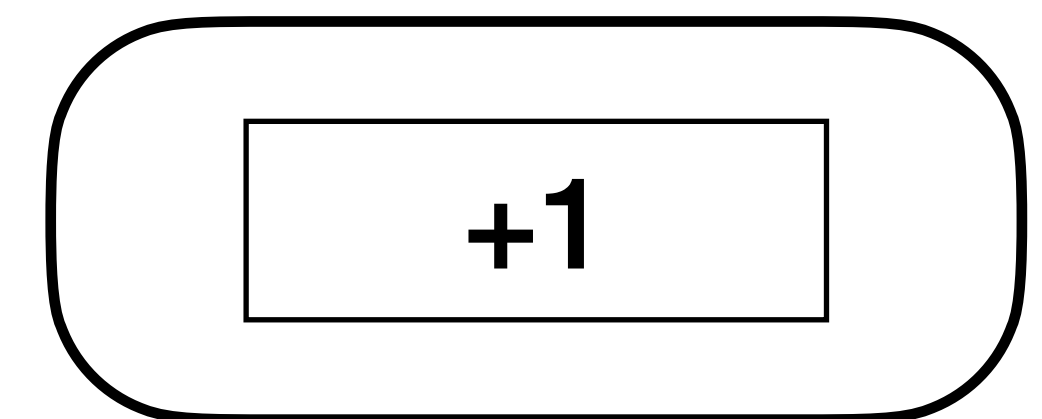
The strategy maximizing the global coverage often misses interesting inputs.



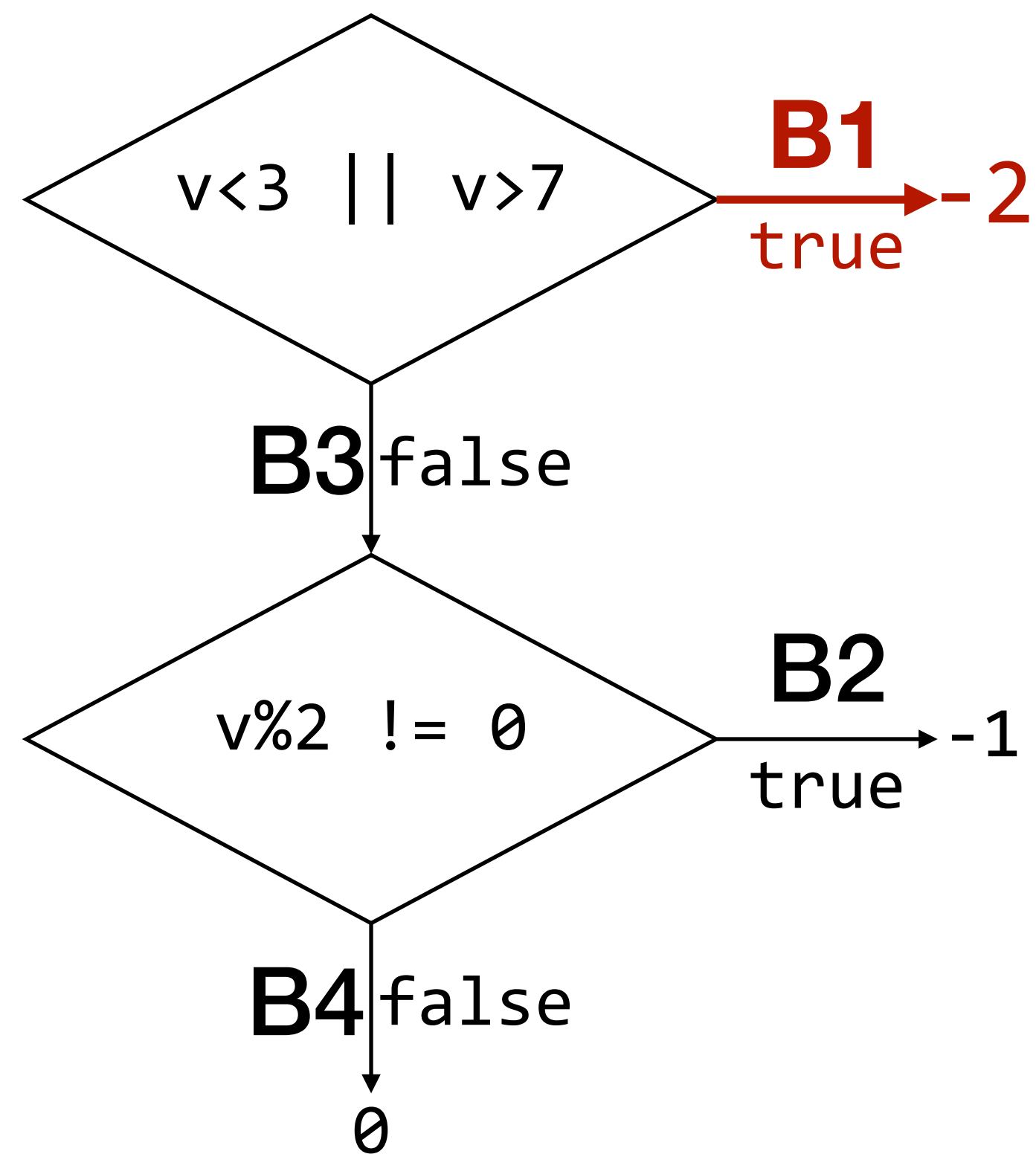
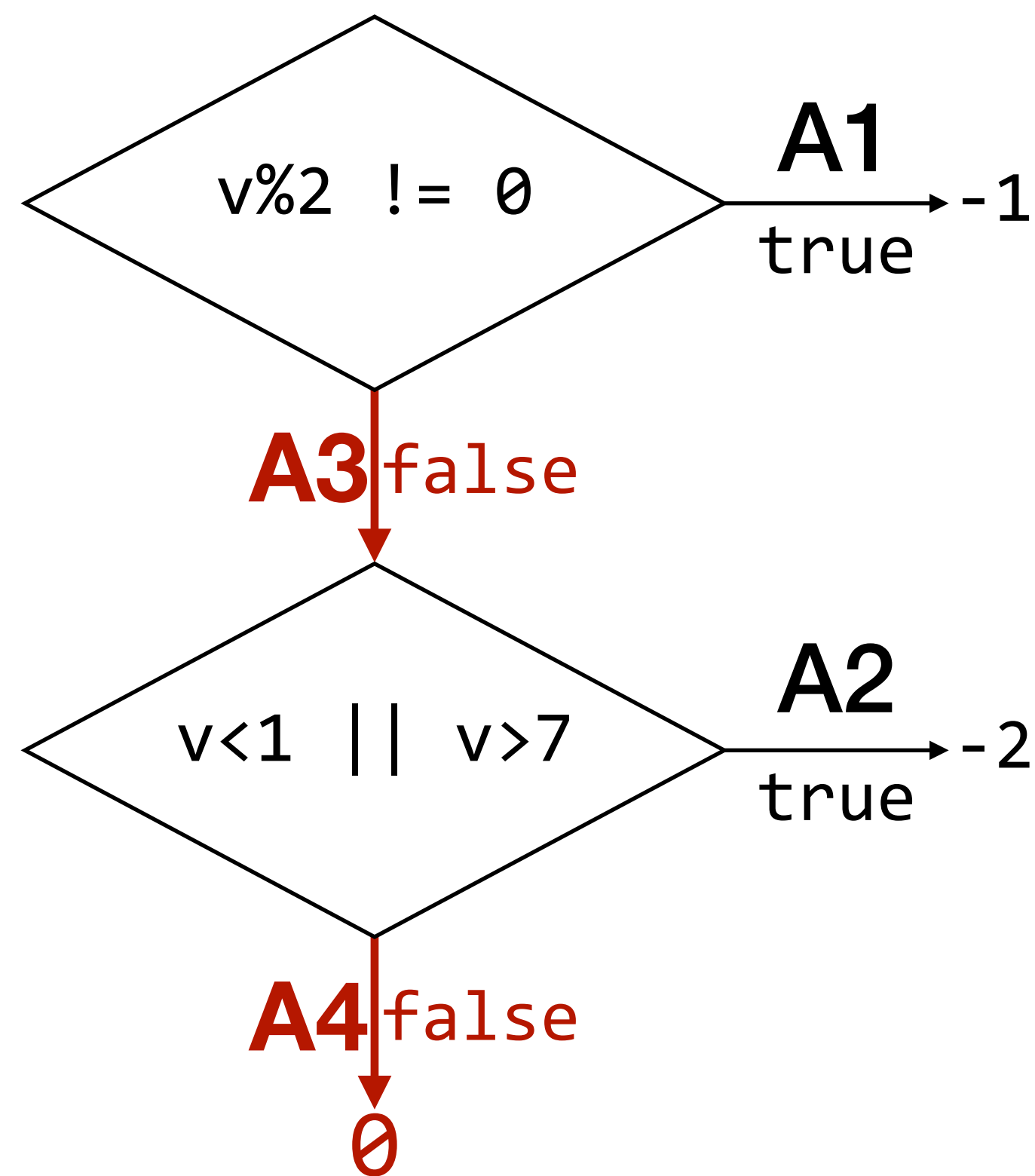
Seeds



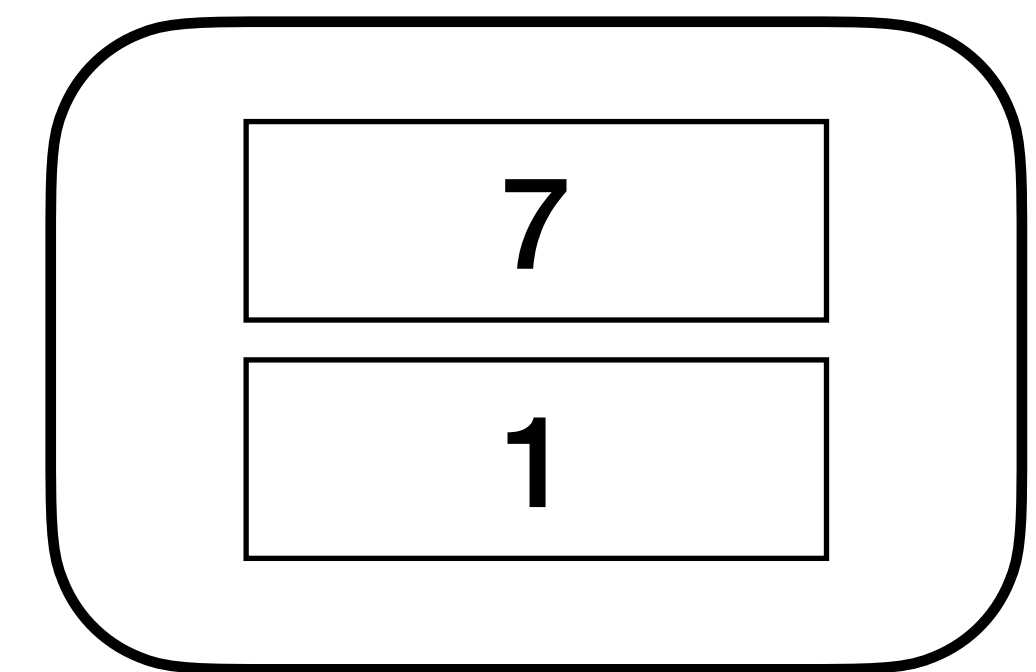
Mutations



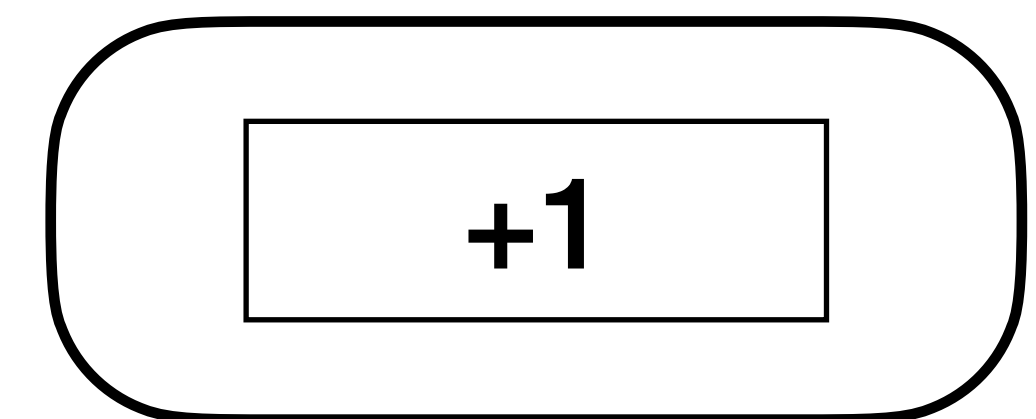
The strategy maximizing the global coverage often misses interesting inputs.



Seeds

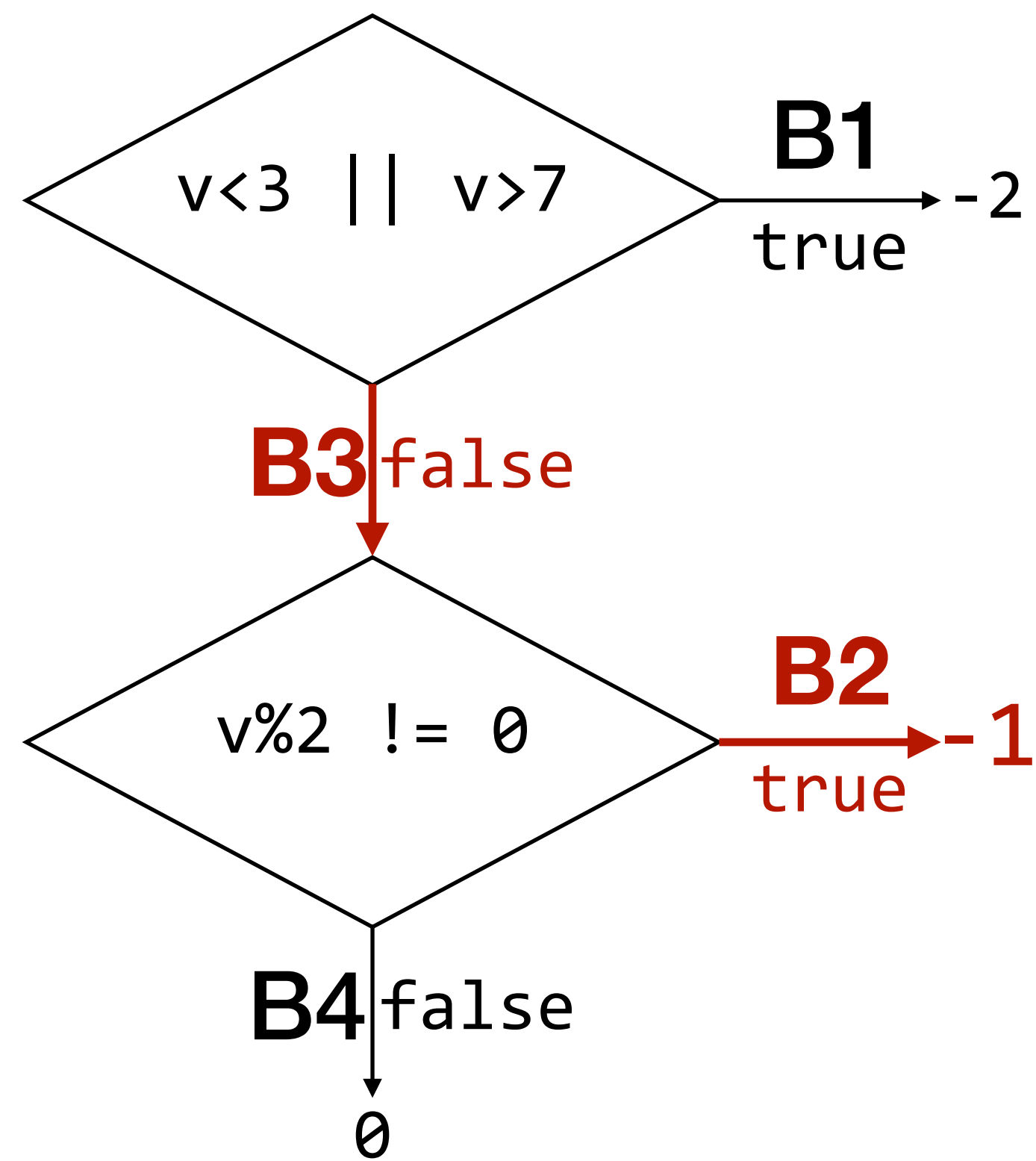
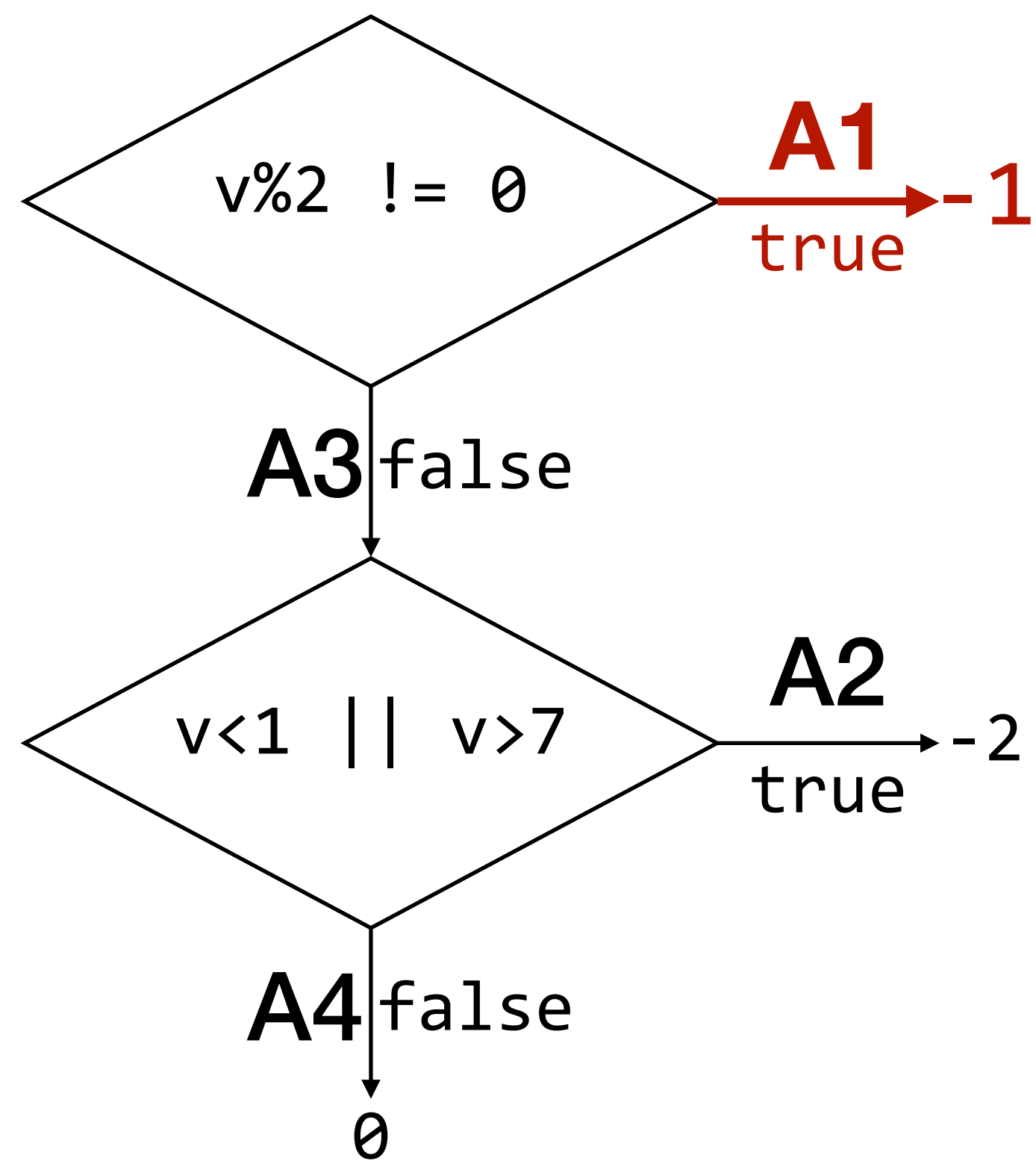


Mutations

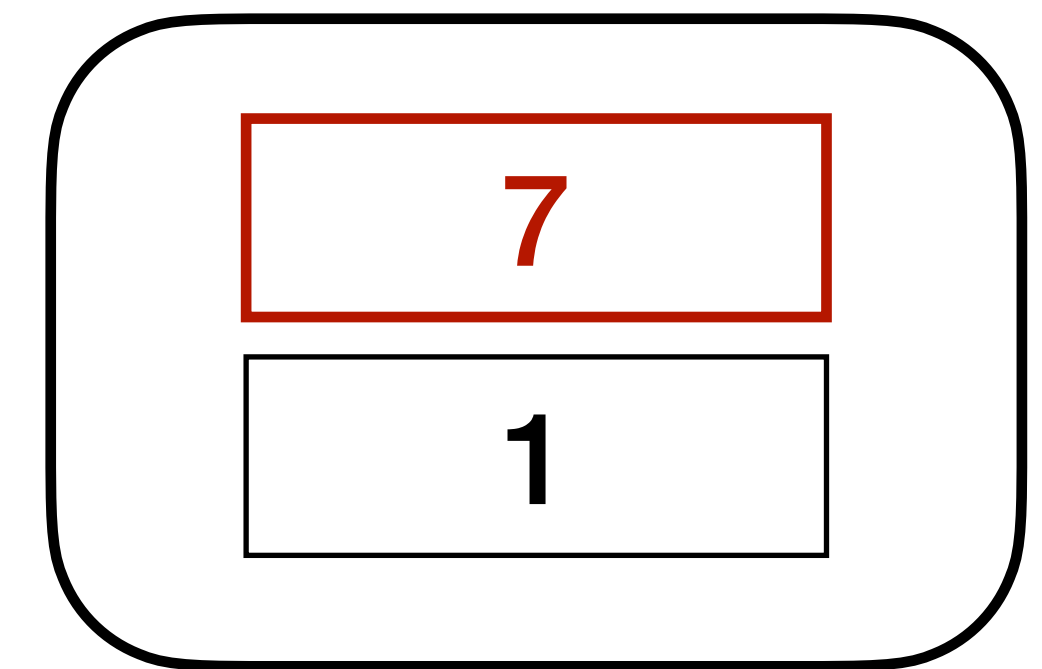


Differs on input 2

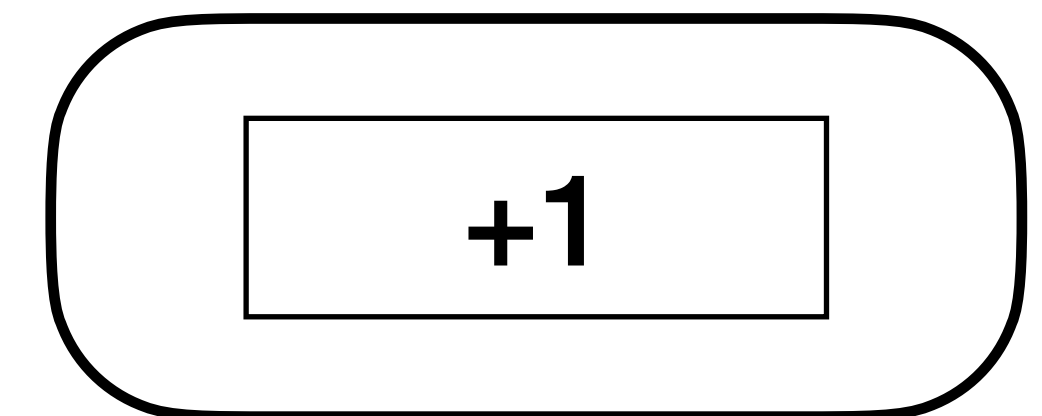
The strategy maximizing the global coverage often misses interesting inputs.



Seeds

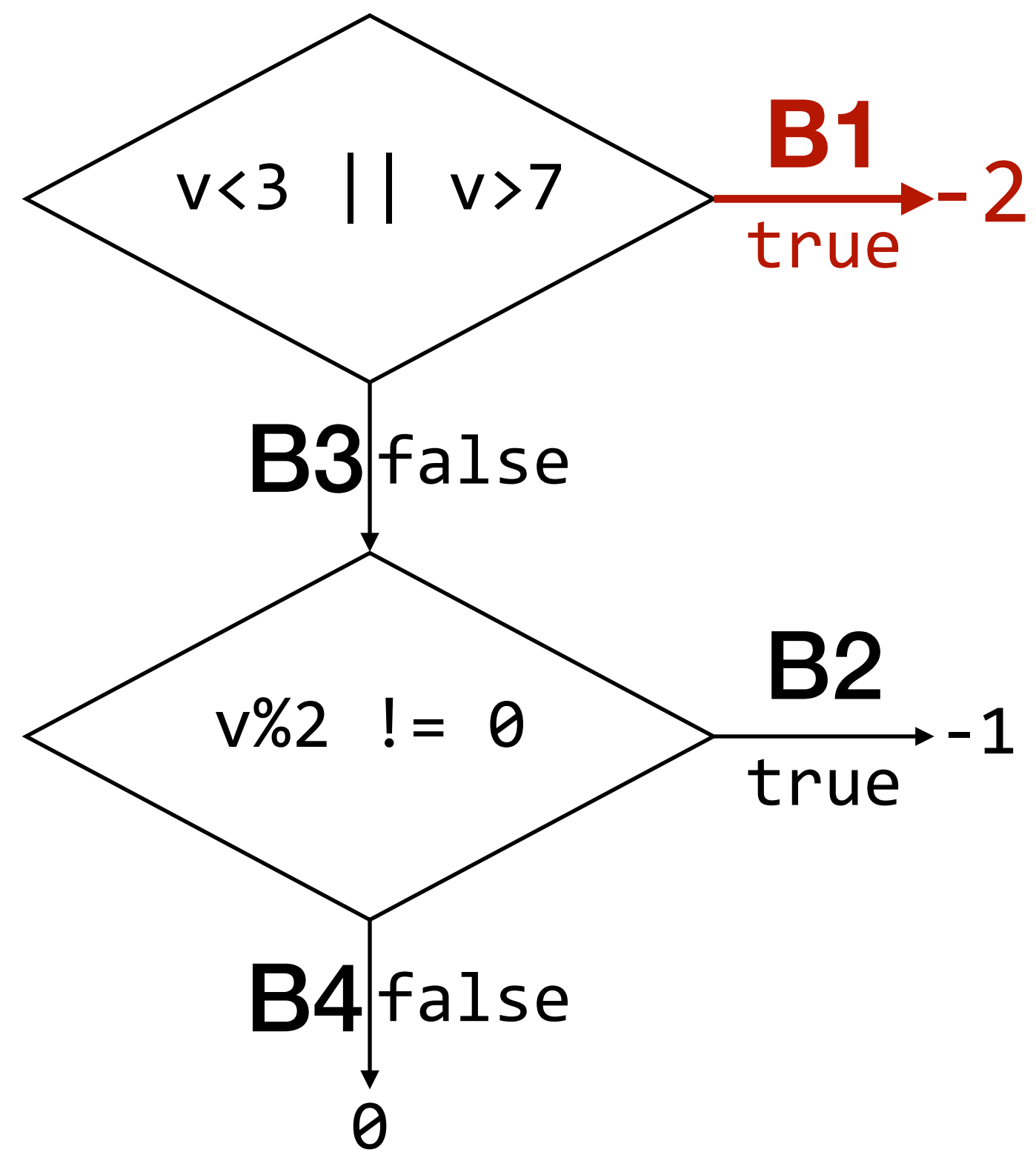
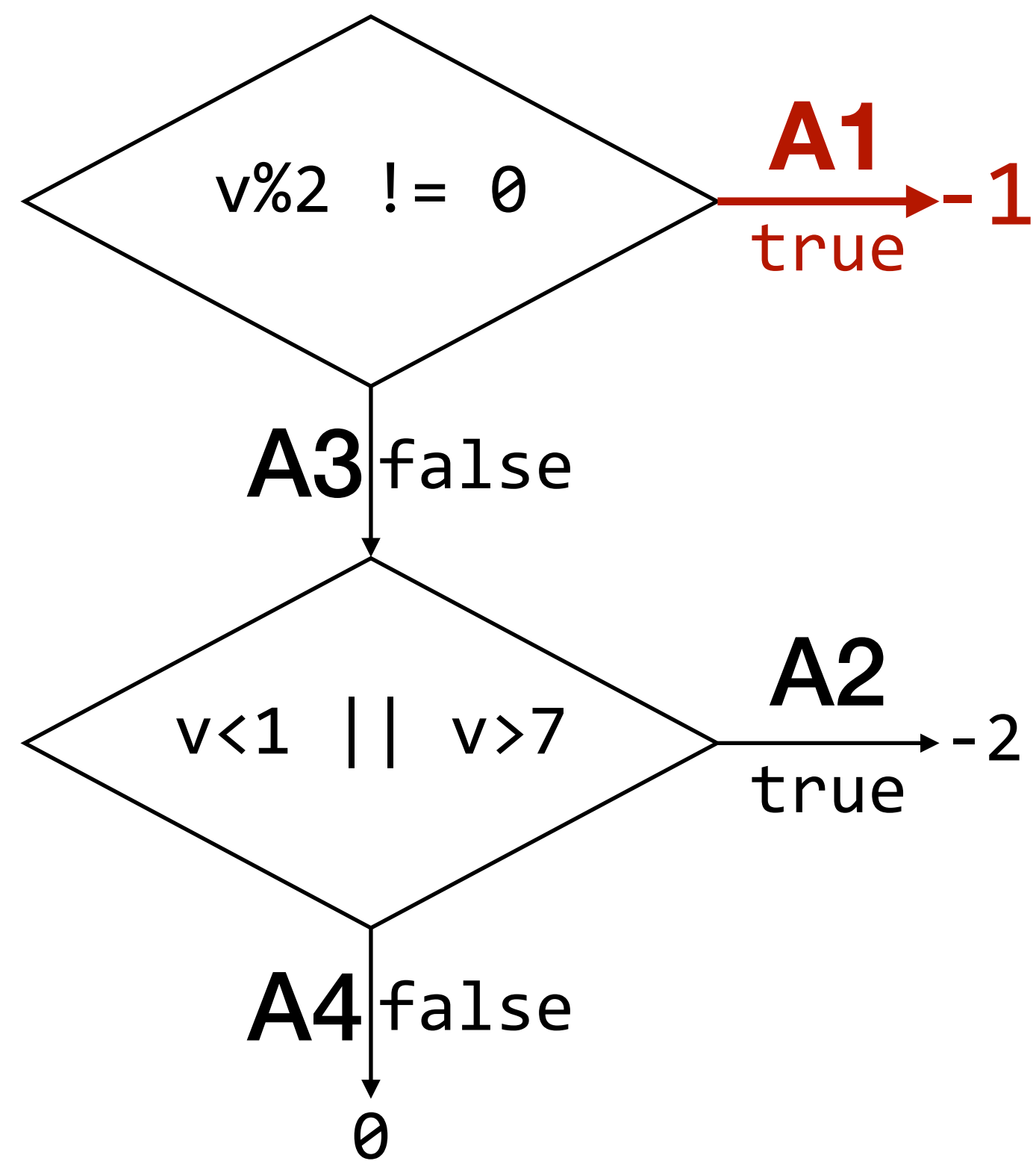


Mutations

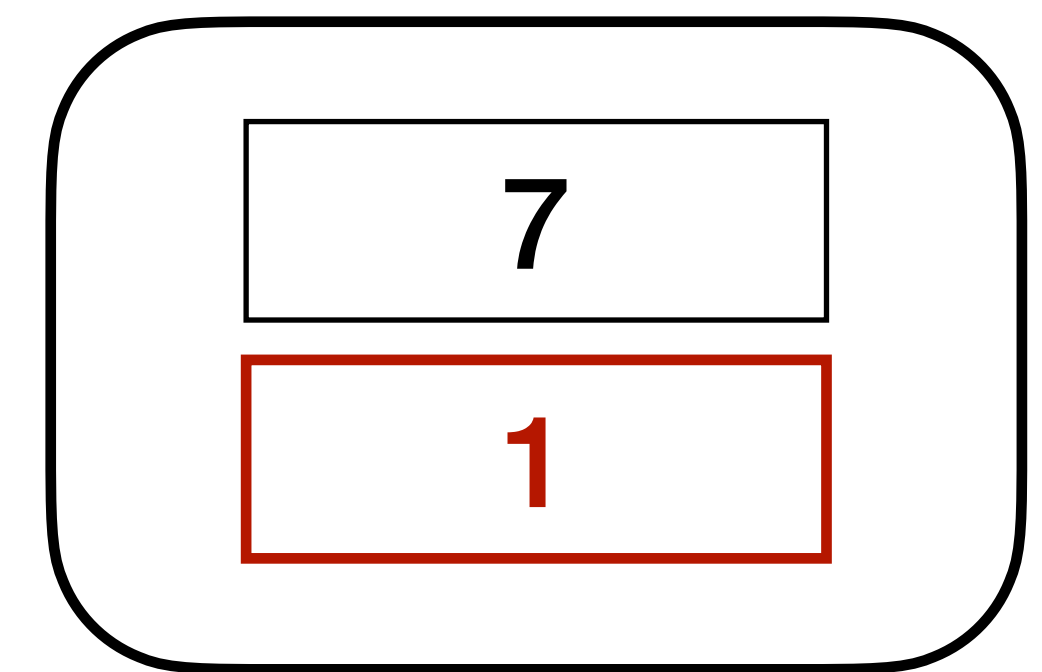


coverage = 3

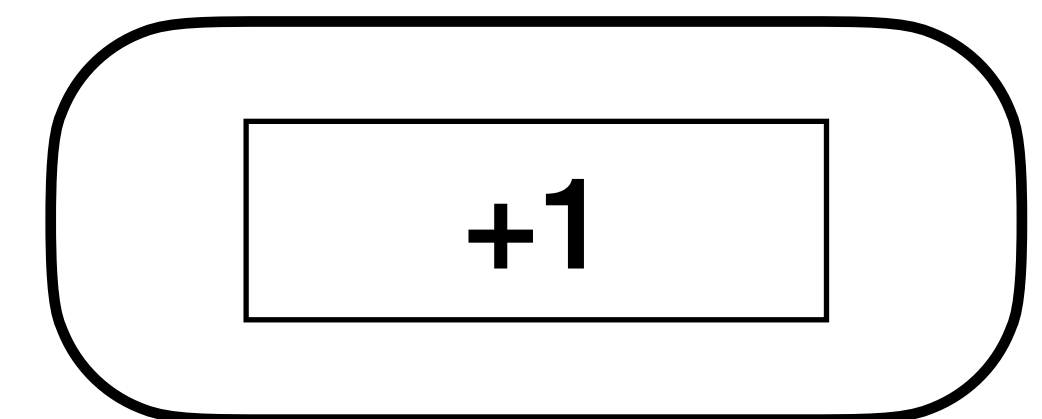
The strategy maximizing the global coverage often misses interesting inputs.



Seeds

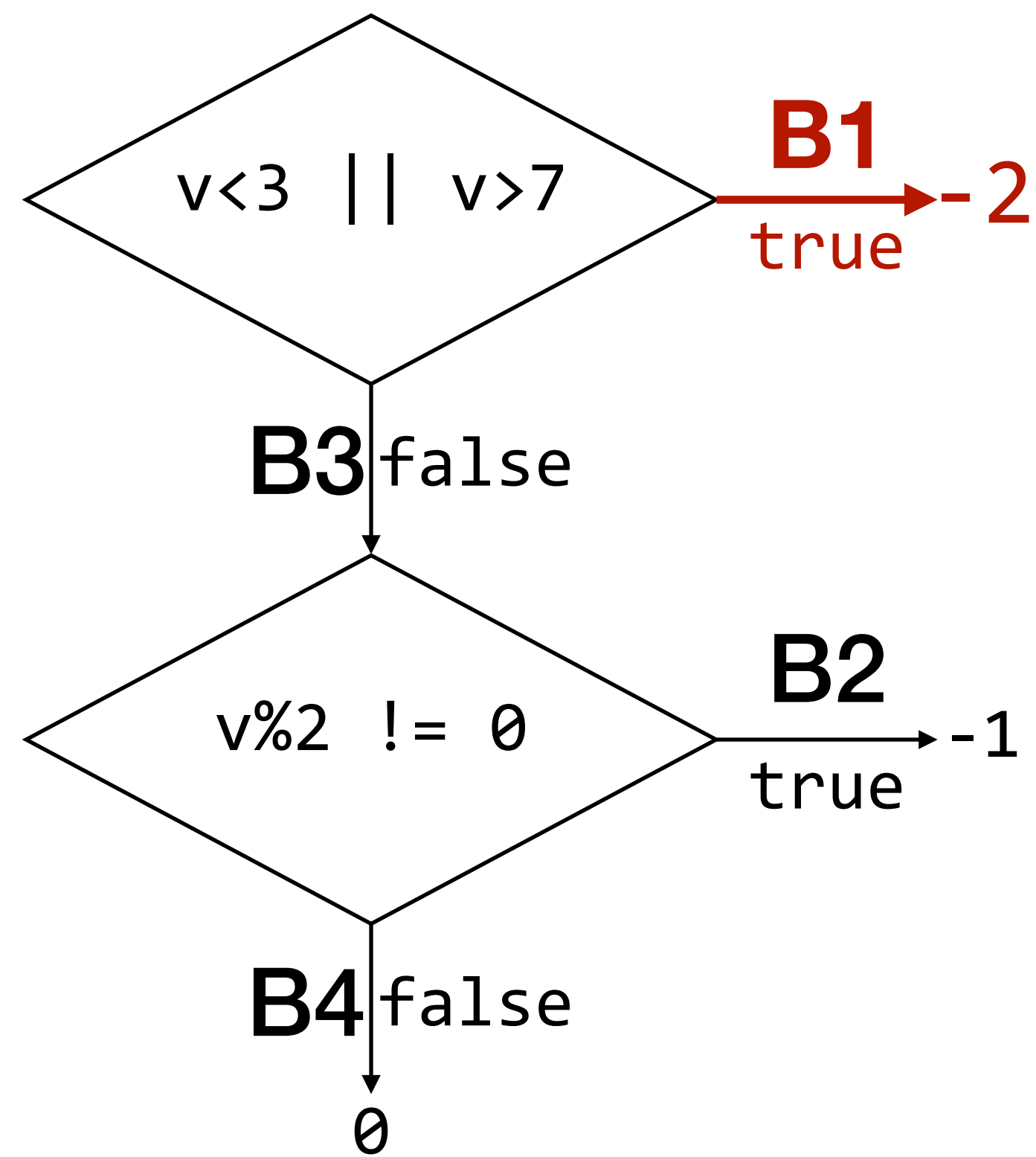
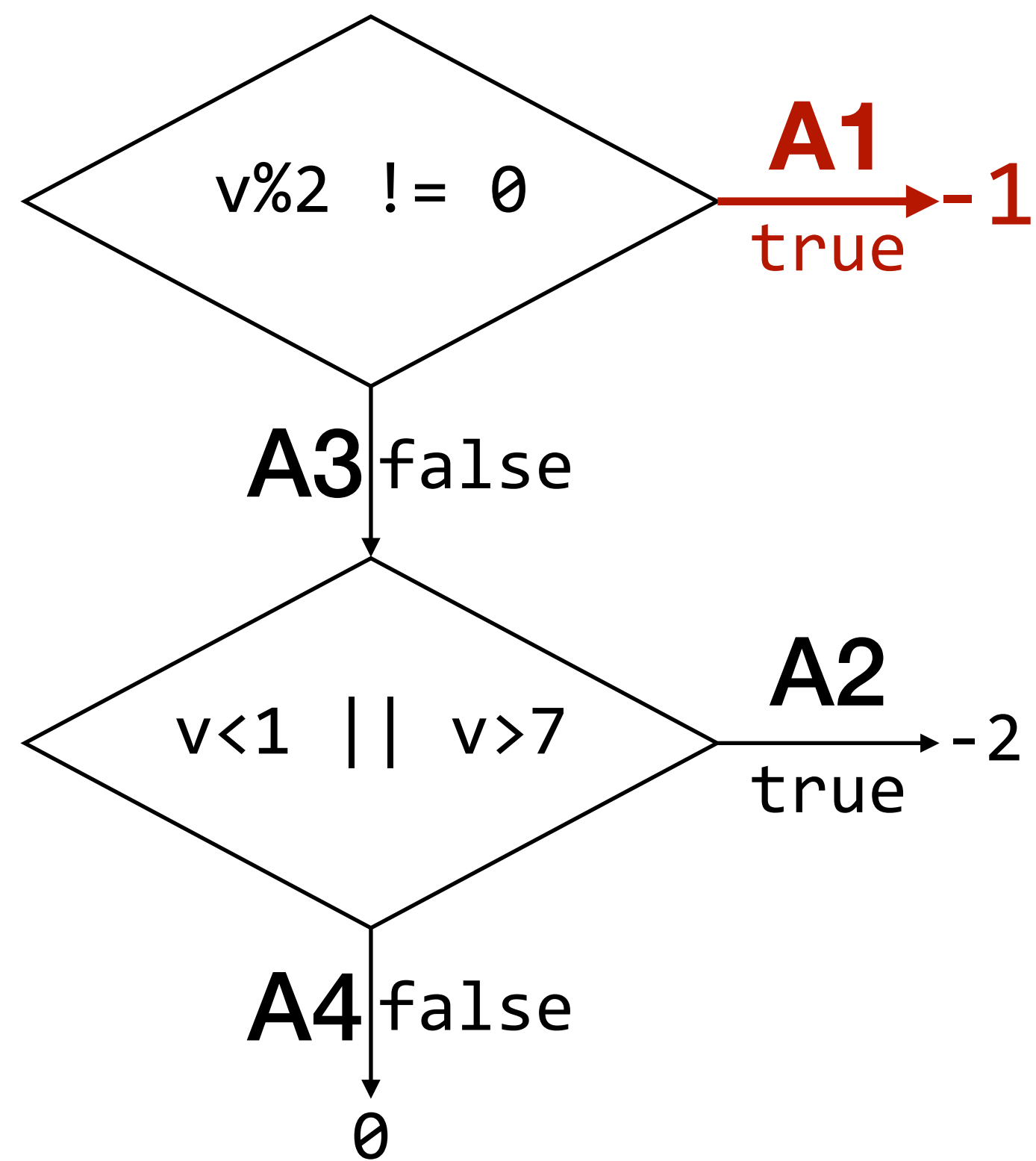


Mutations

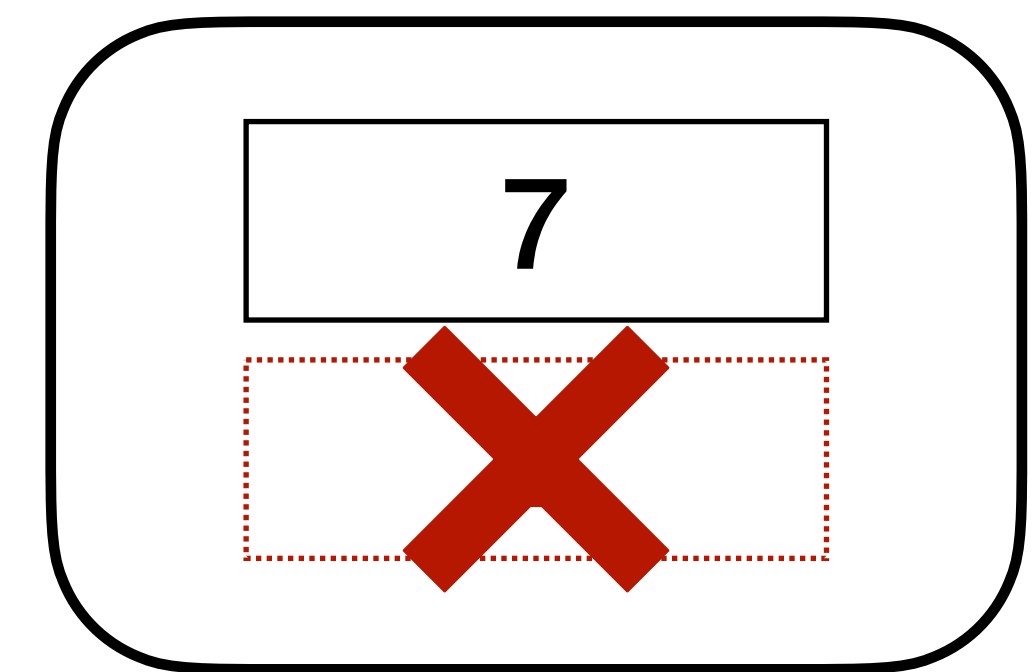


coverage = 2

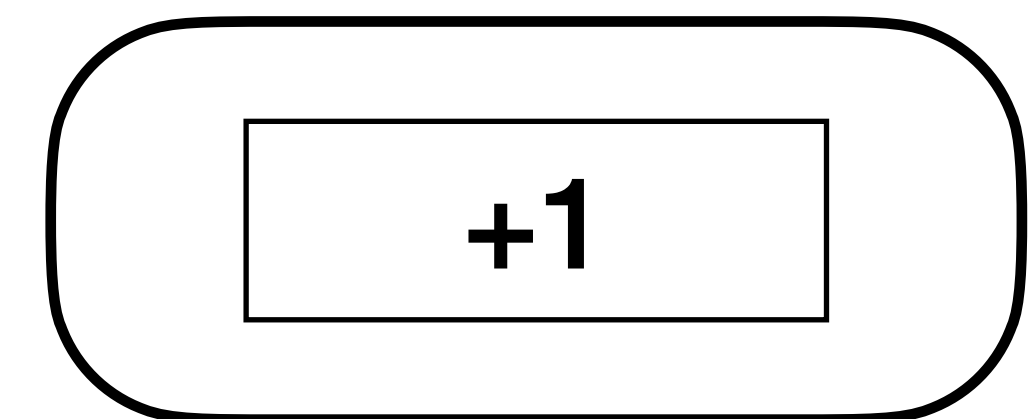
The strategy maximizing the global coverage often misses interesting inputs.



Seeds

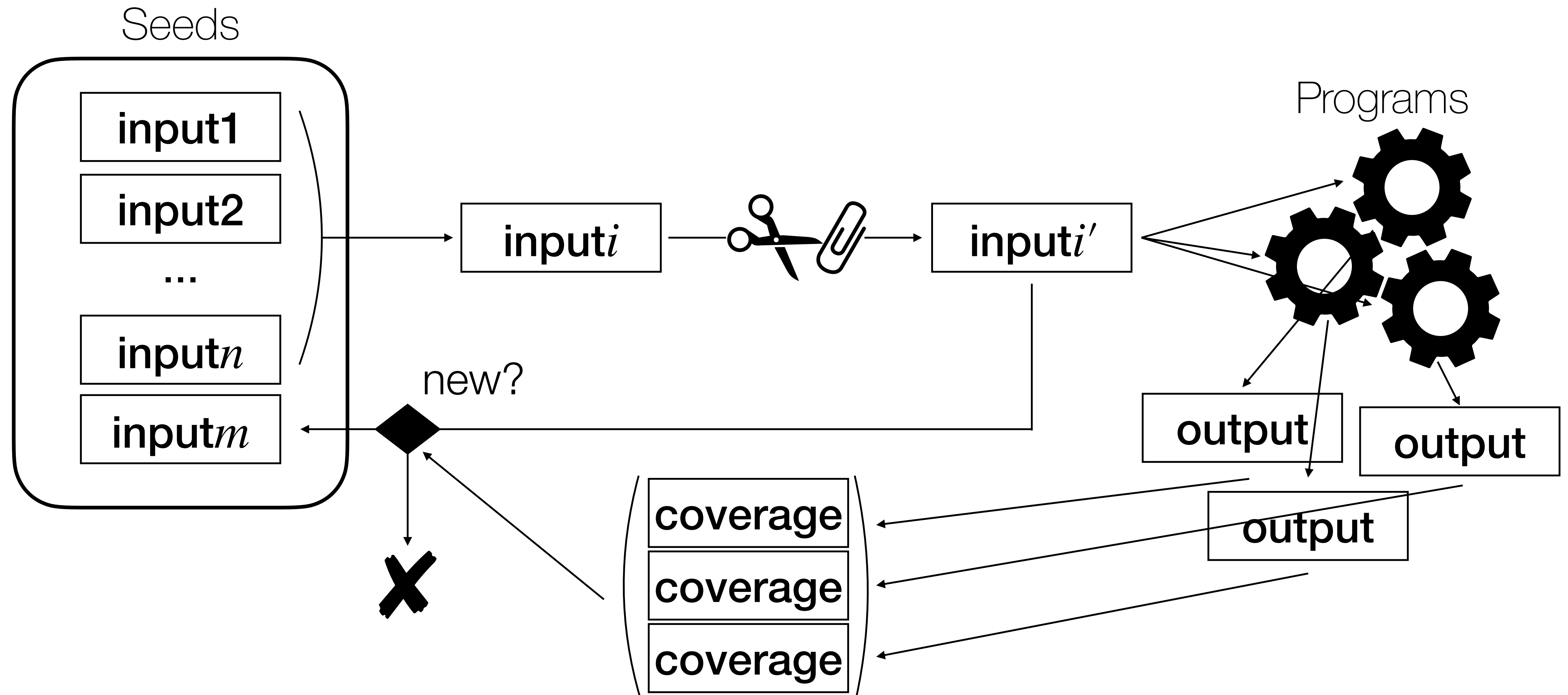


Mutations



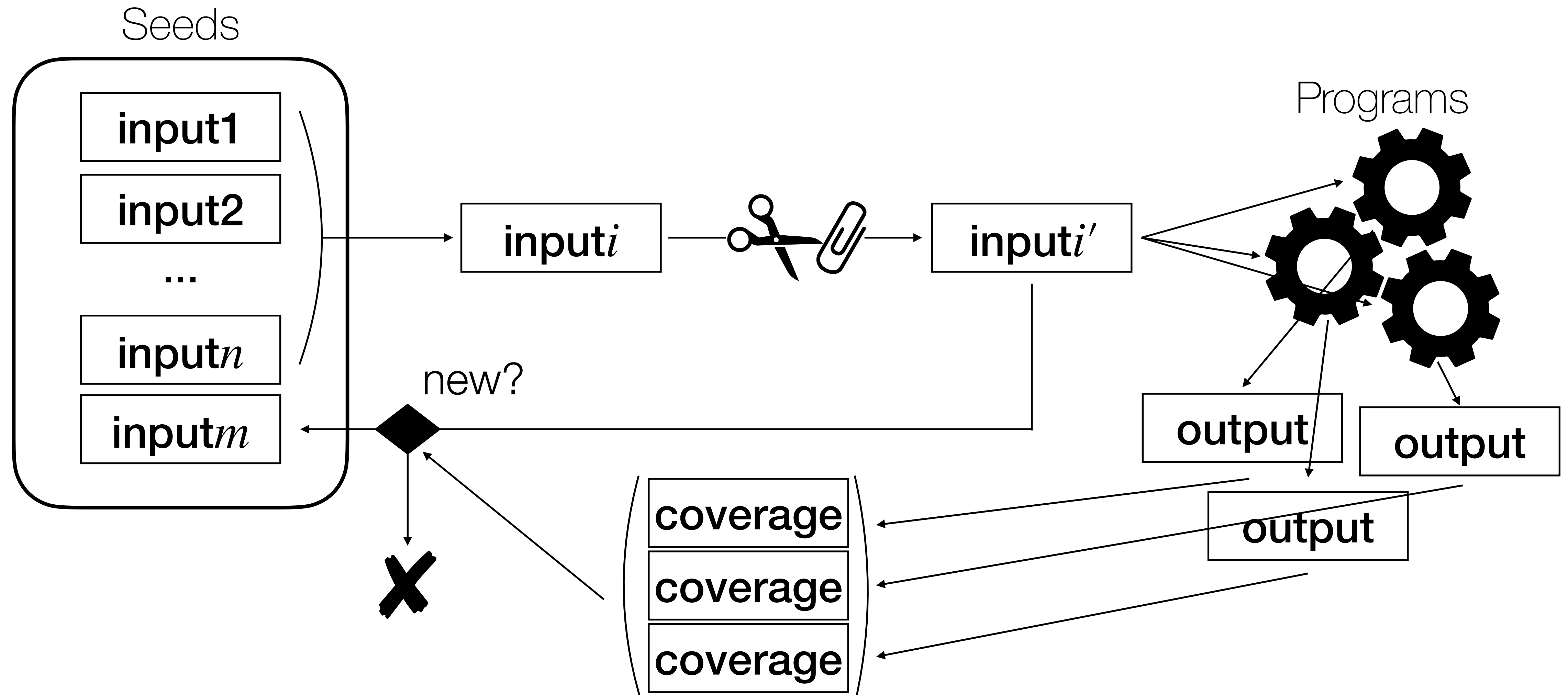
coverage = $2 < 3$

NEZHA introduces δ -diversity.

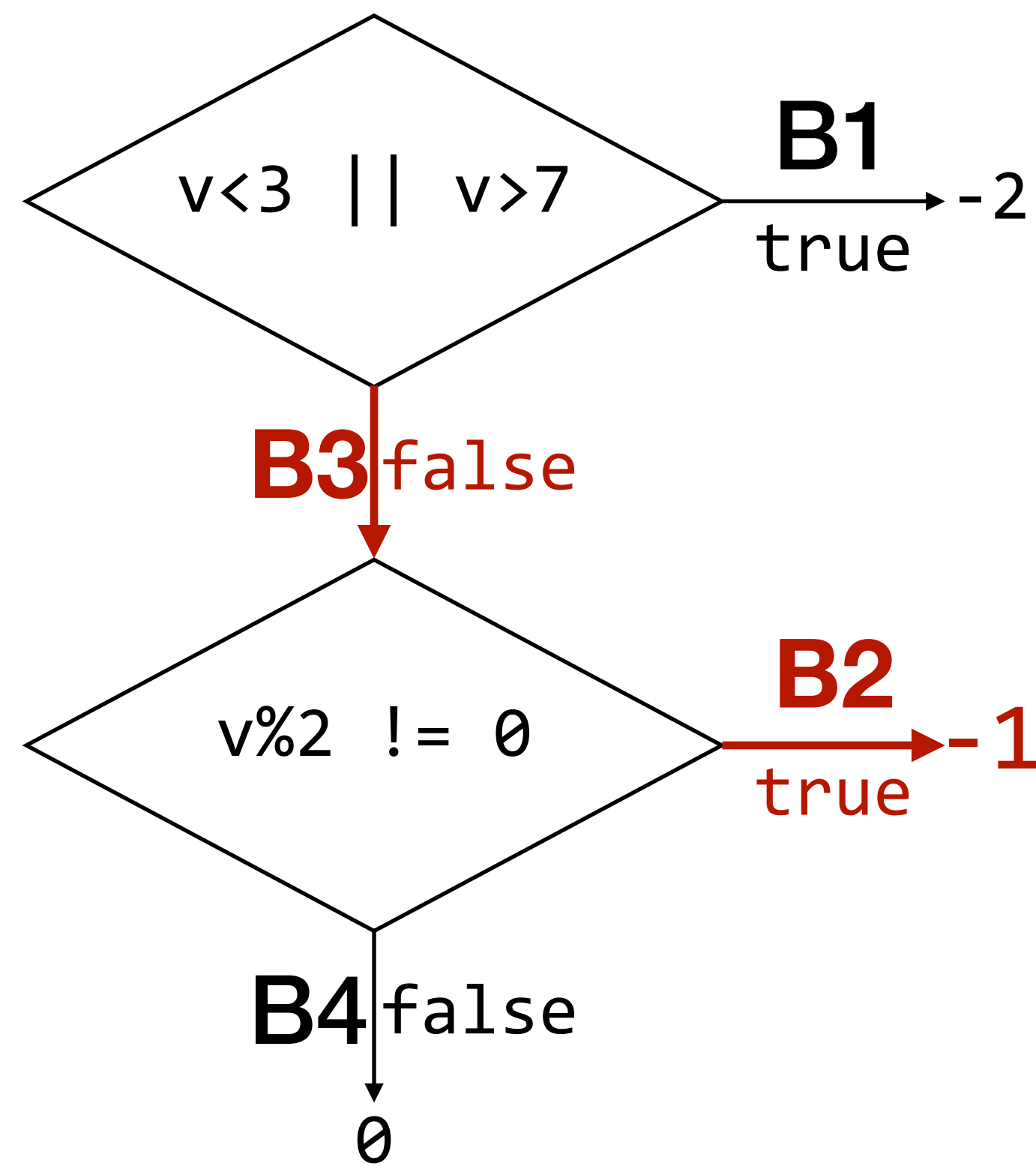
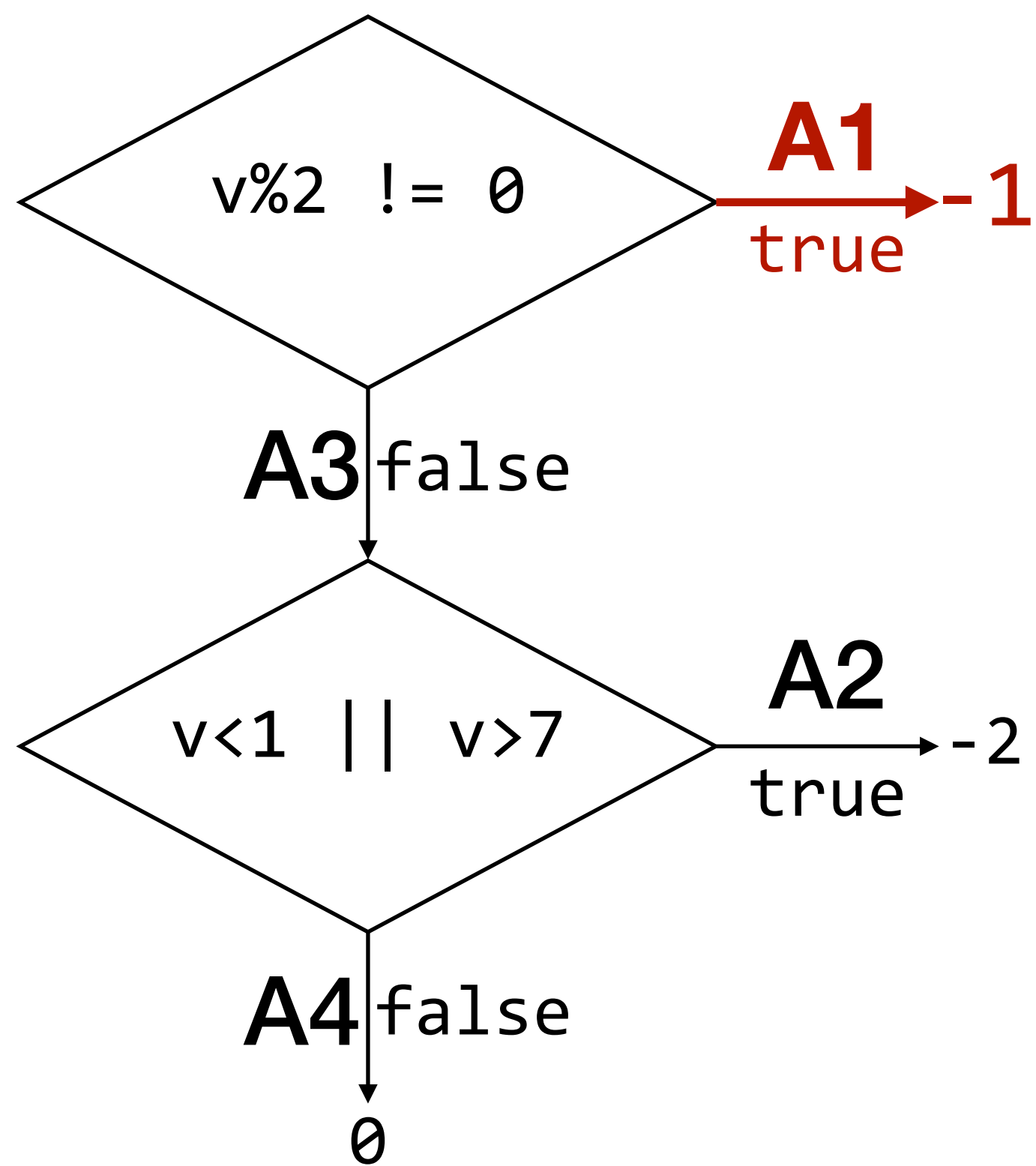


NEZHA introduces δ -diversity.

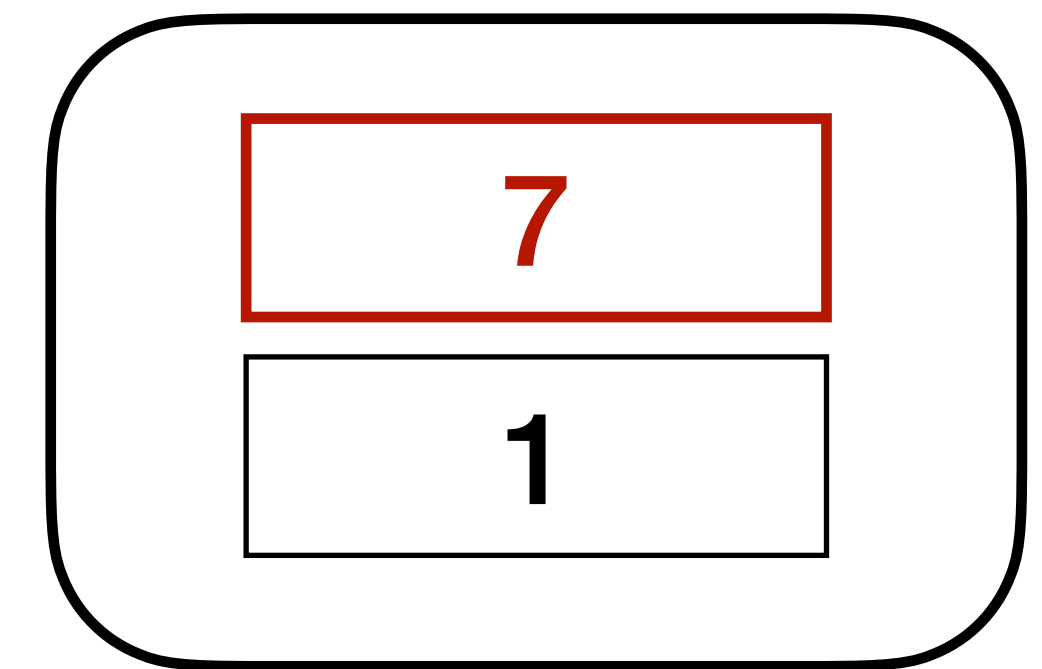
- Fine path δ -diversity
- Coarse path δ -diversity
- Output δ -diversity



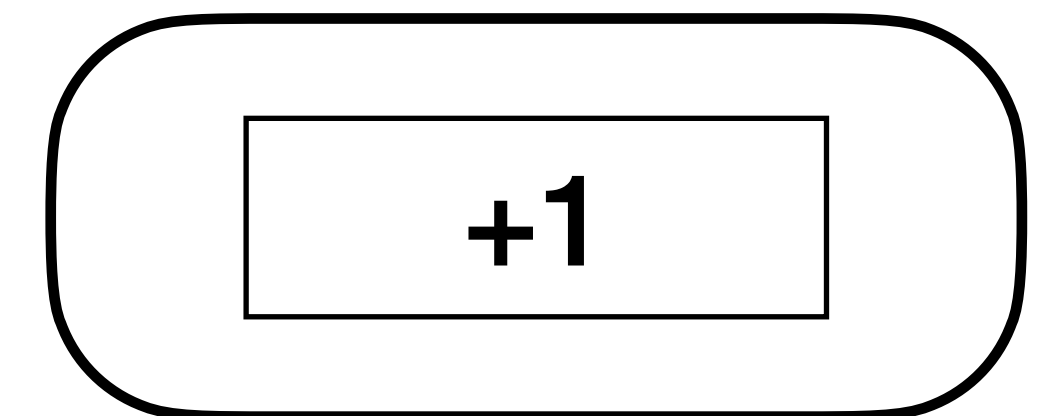
Fine path δ -diversity considers tuples of sets.



Seeds

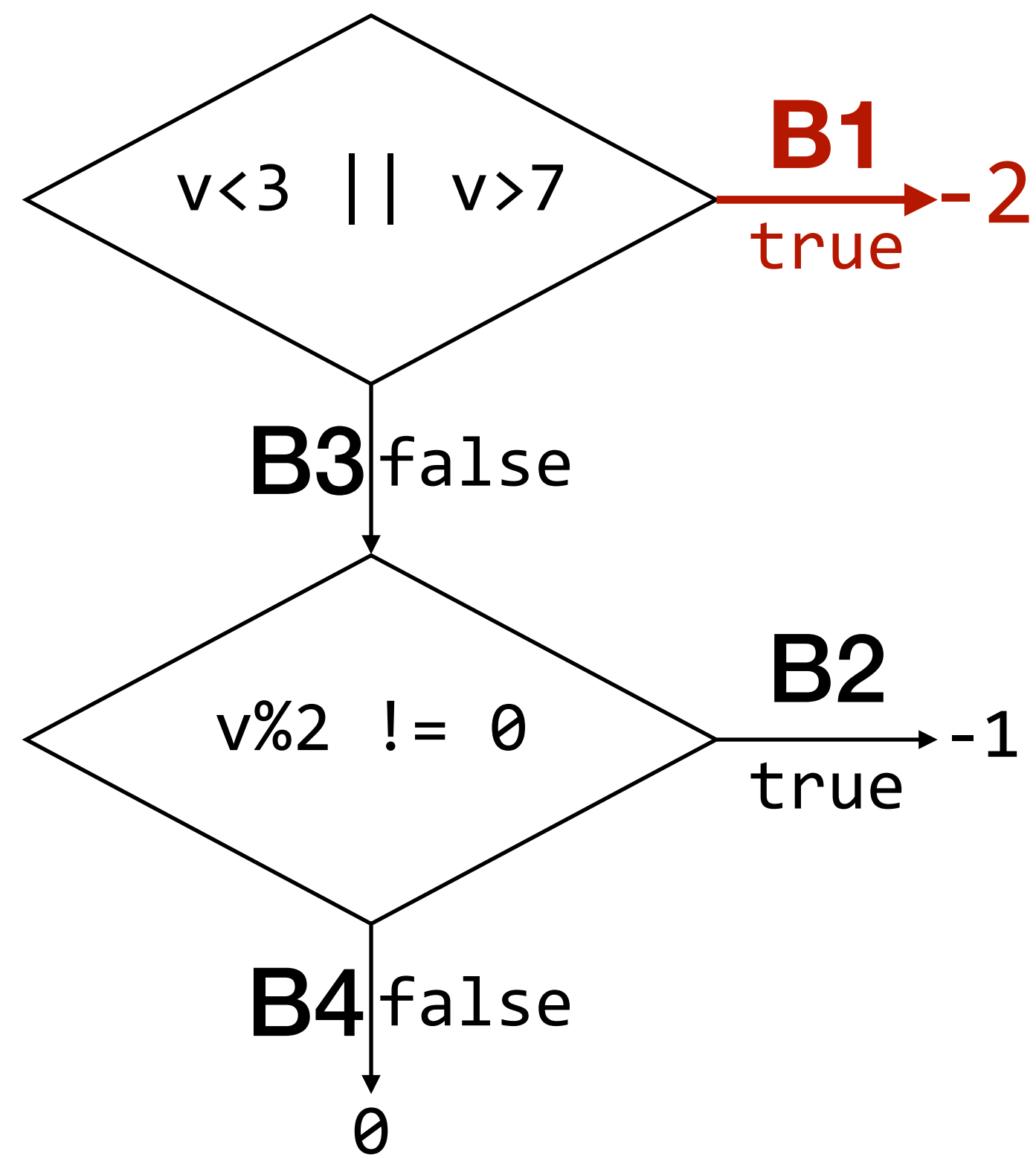
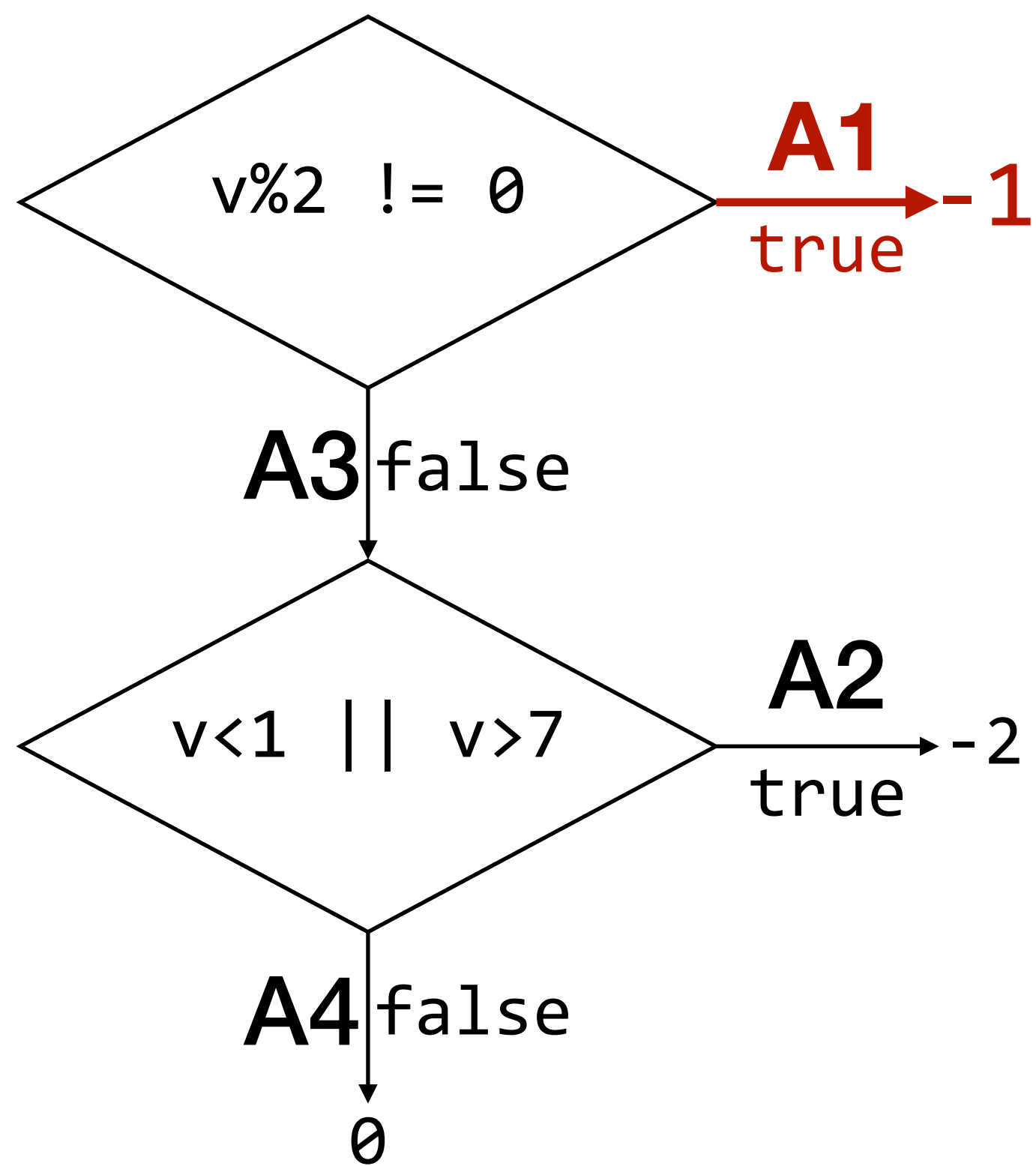


Mutations

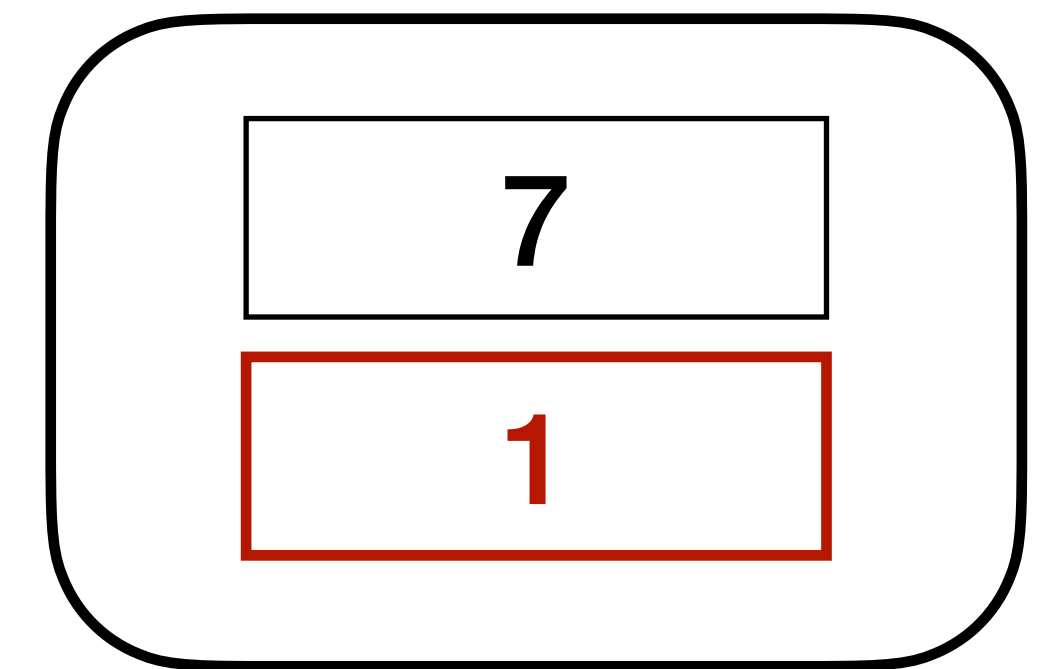


tuple = ({A1}, {B2, B3})

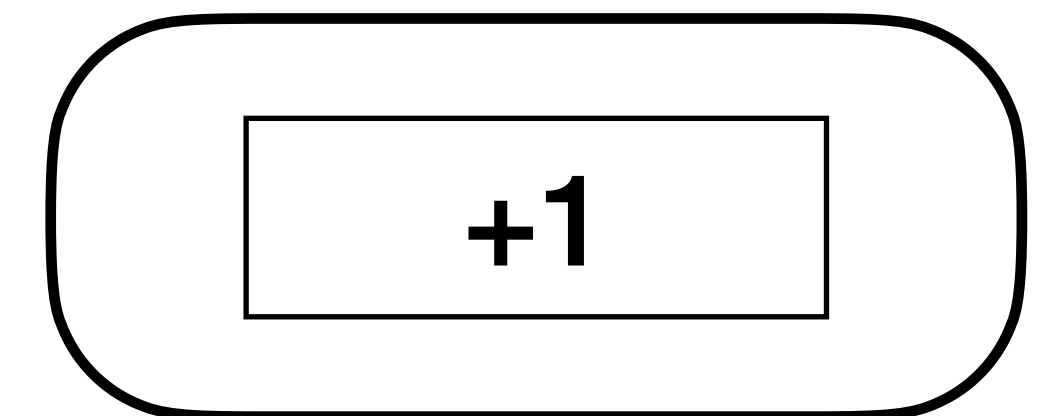
Fine path δ -diversity considers tuples of sets.



Seeds

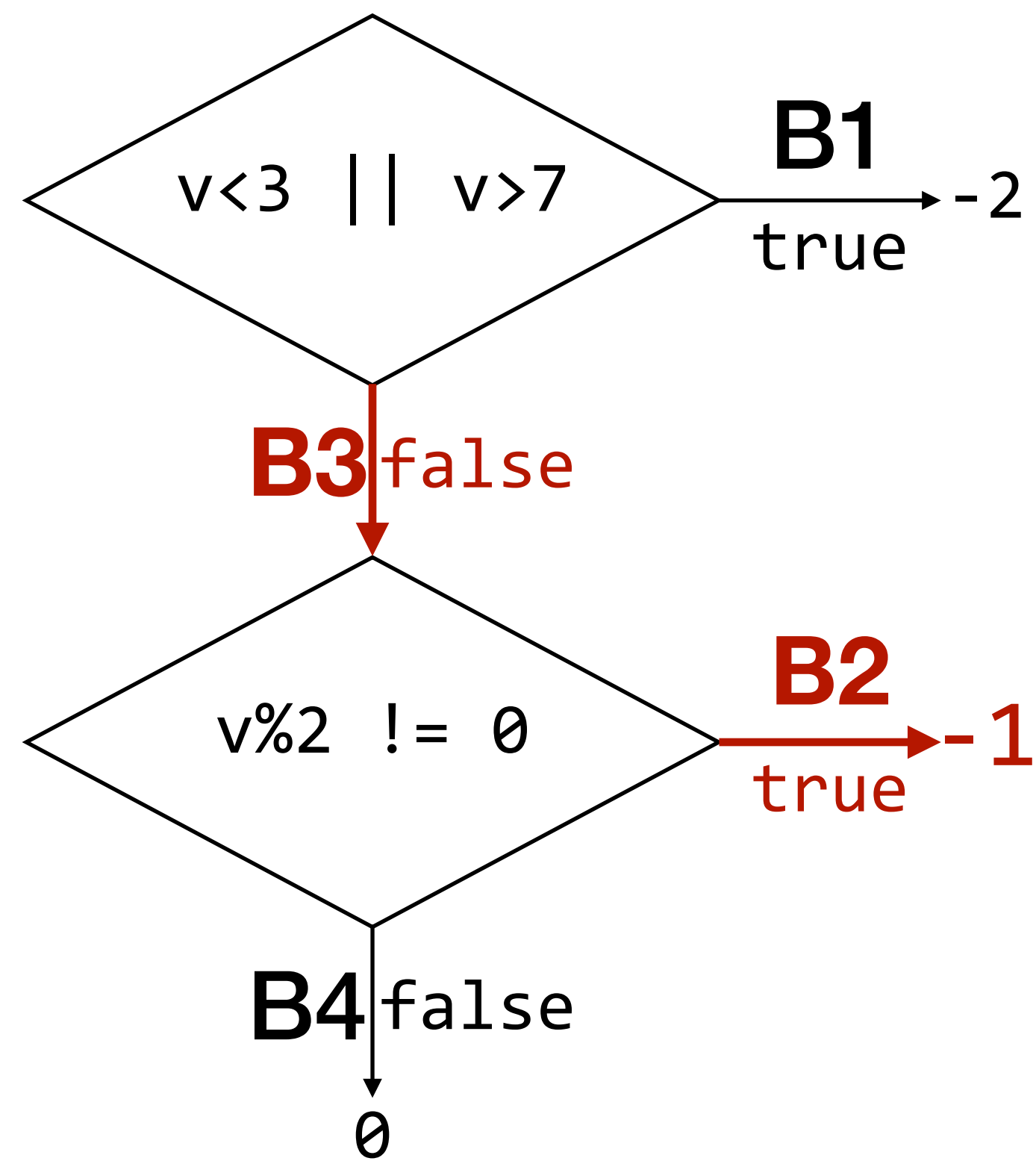
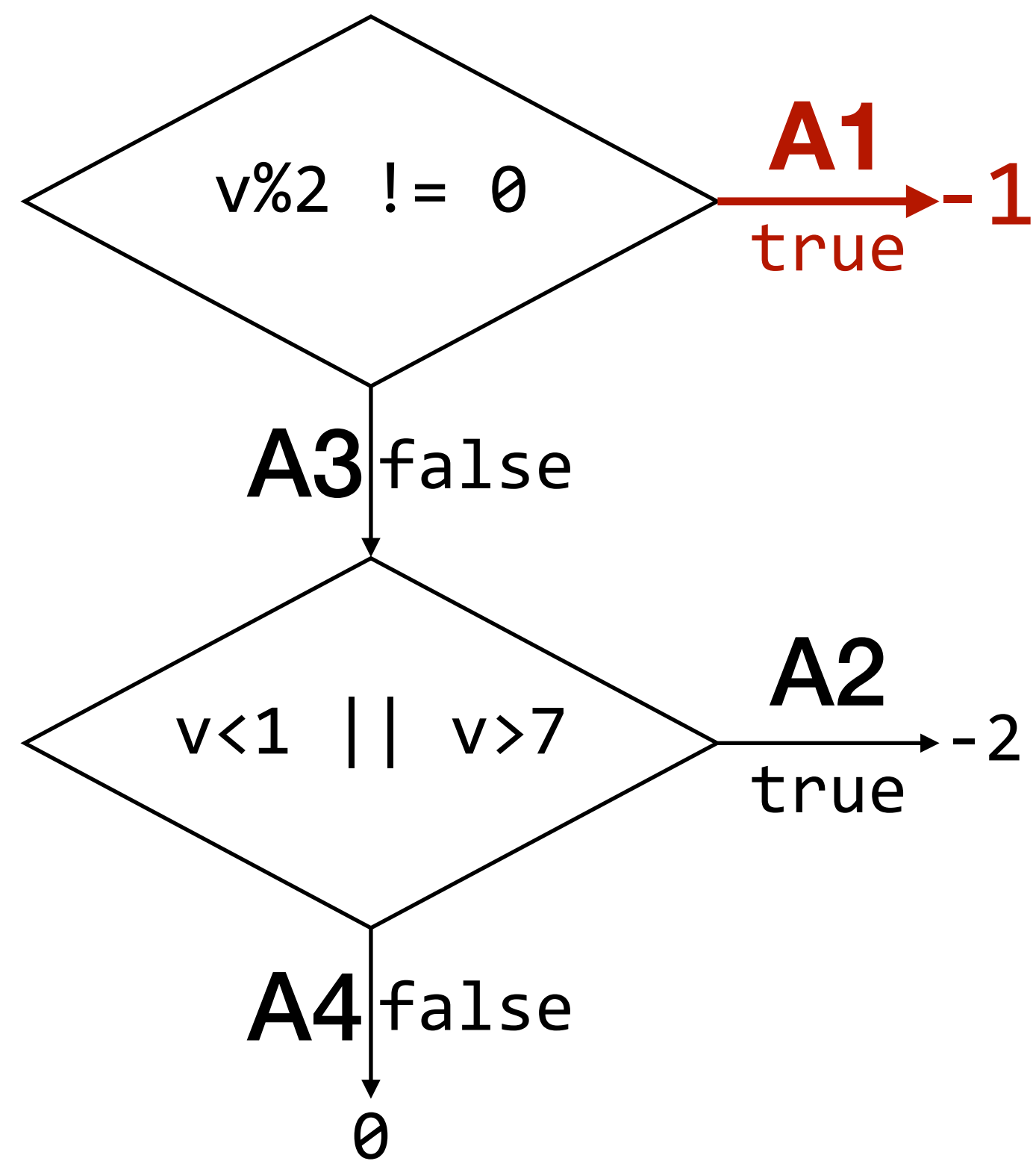


Mutations

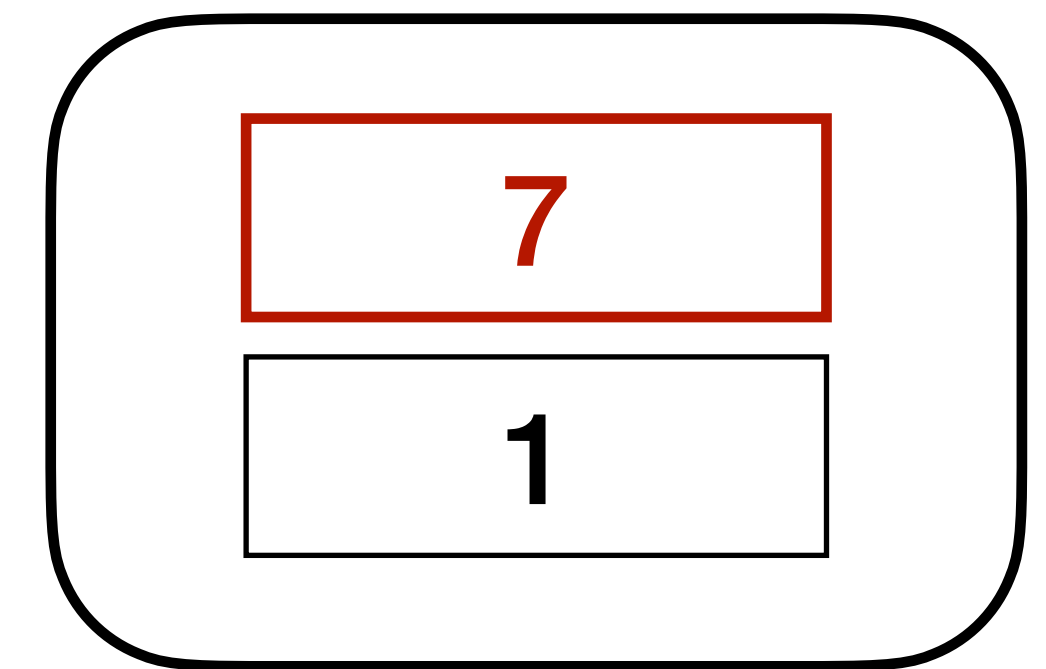


tuple = ({A1}, {B1})

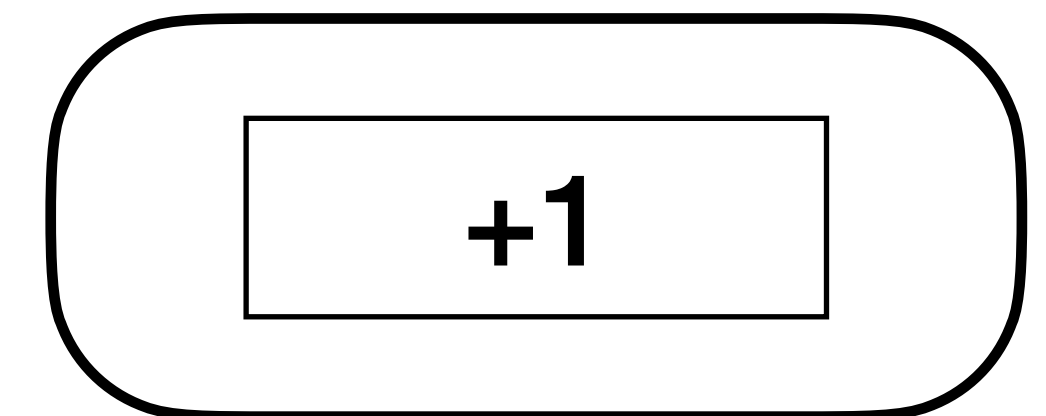
Coarse path δ -diversity considers tuples of the number of covered edges.



Seeds

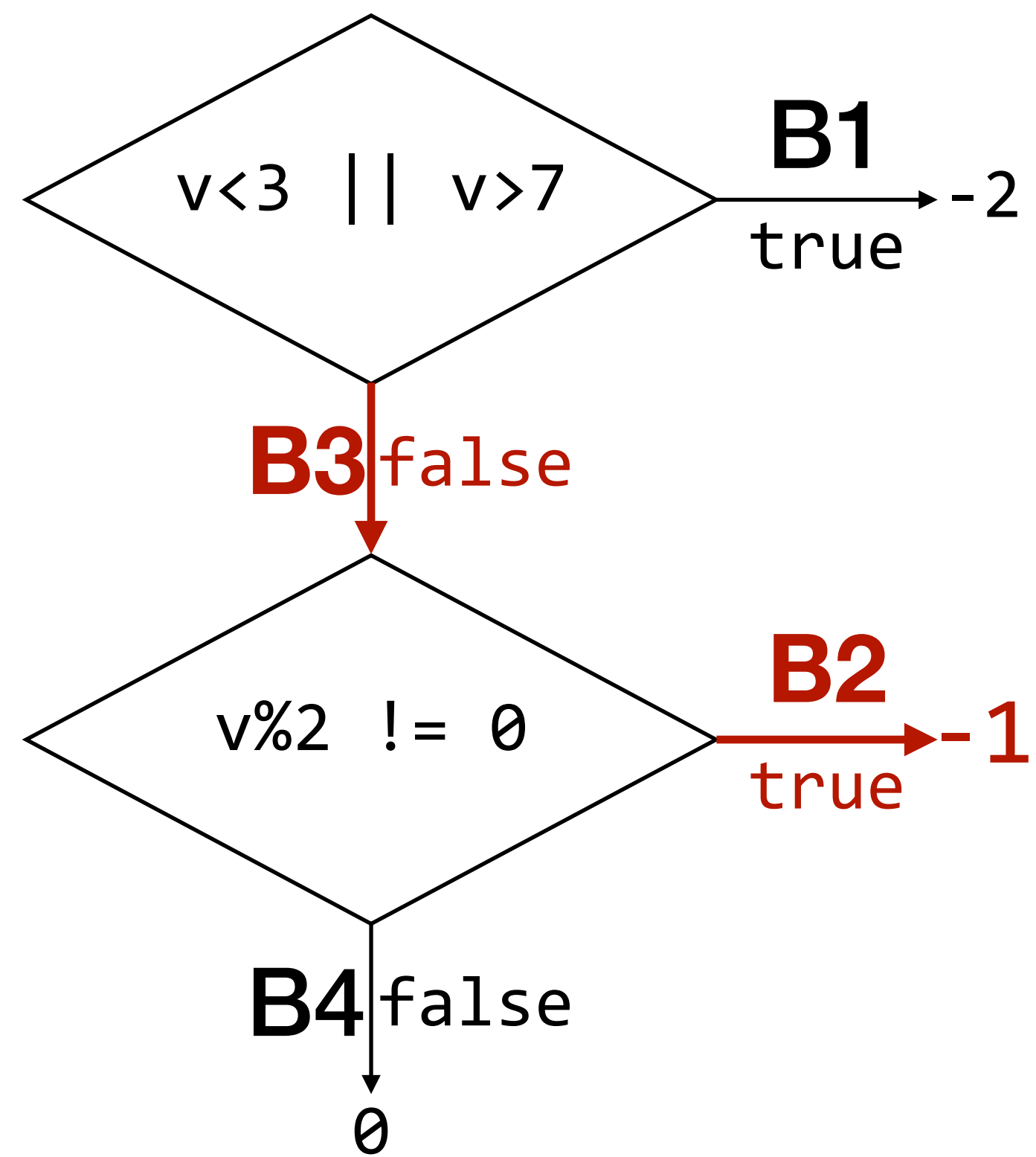
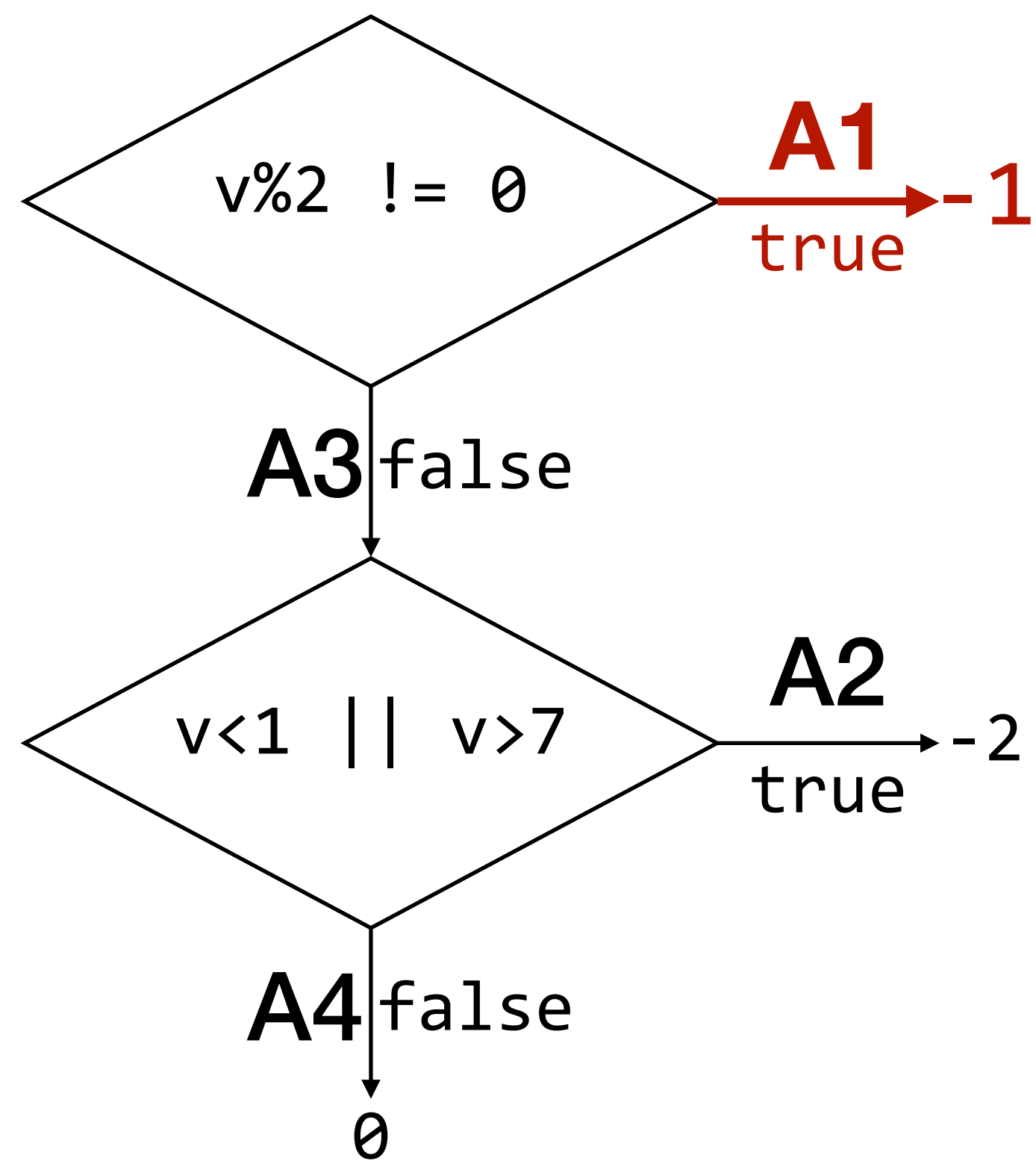


Mutations

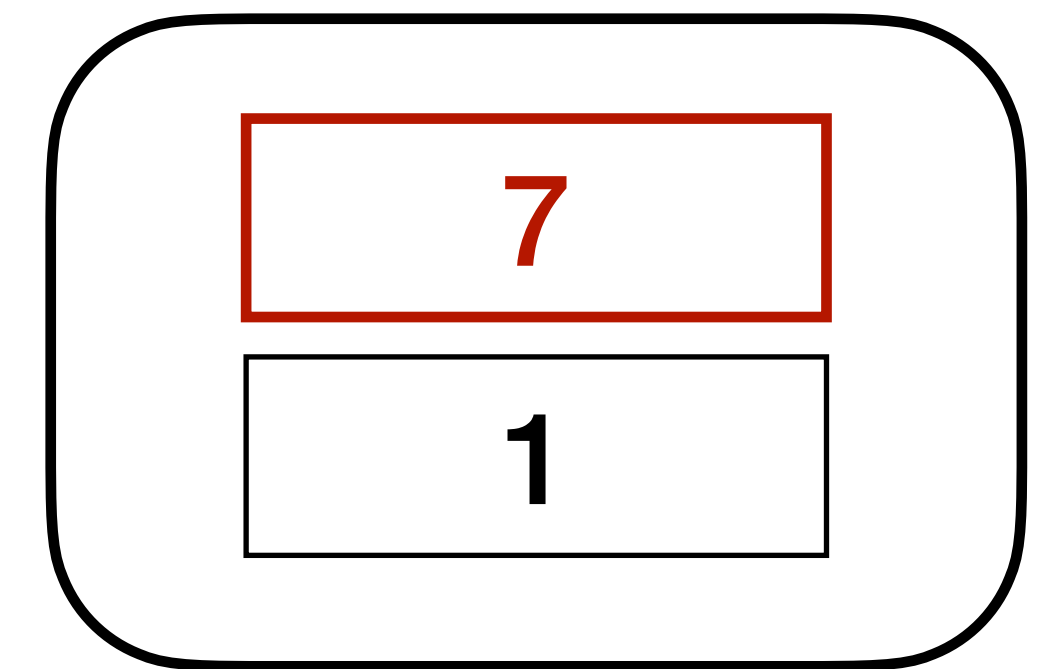


tuple = (|{A1}|, |{B2, B3}|)

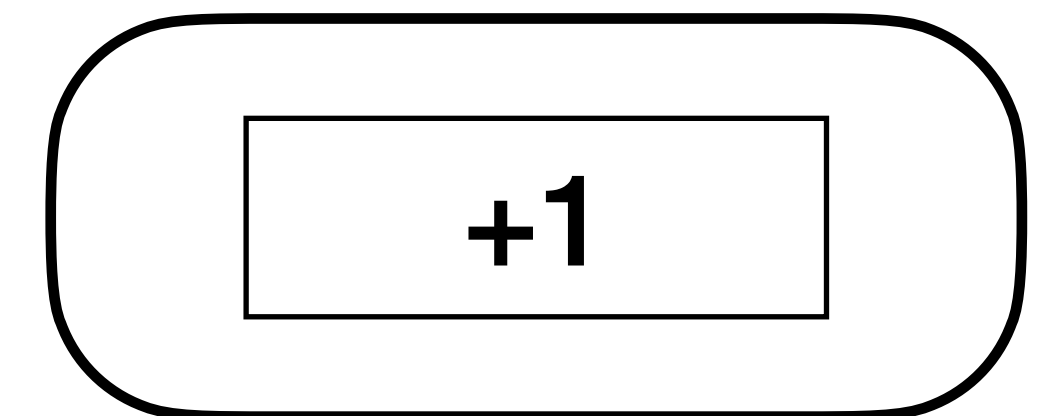
Coarse path δ -diversity considers tuples of the number of covered edges.



Seeds

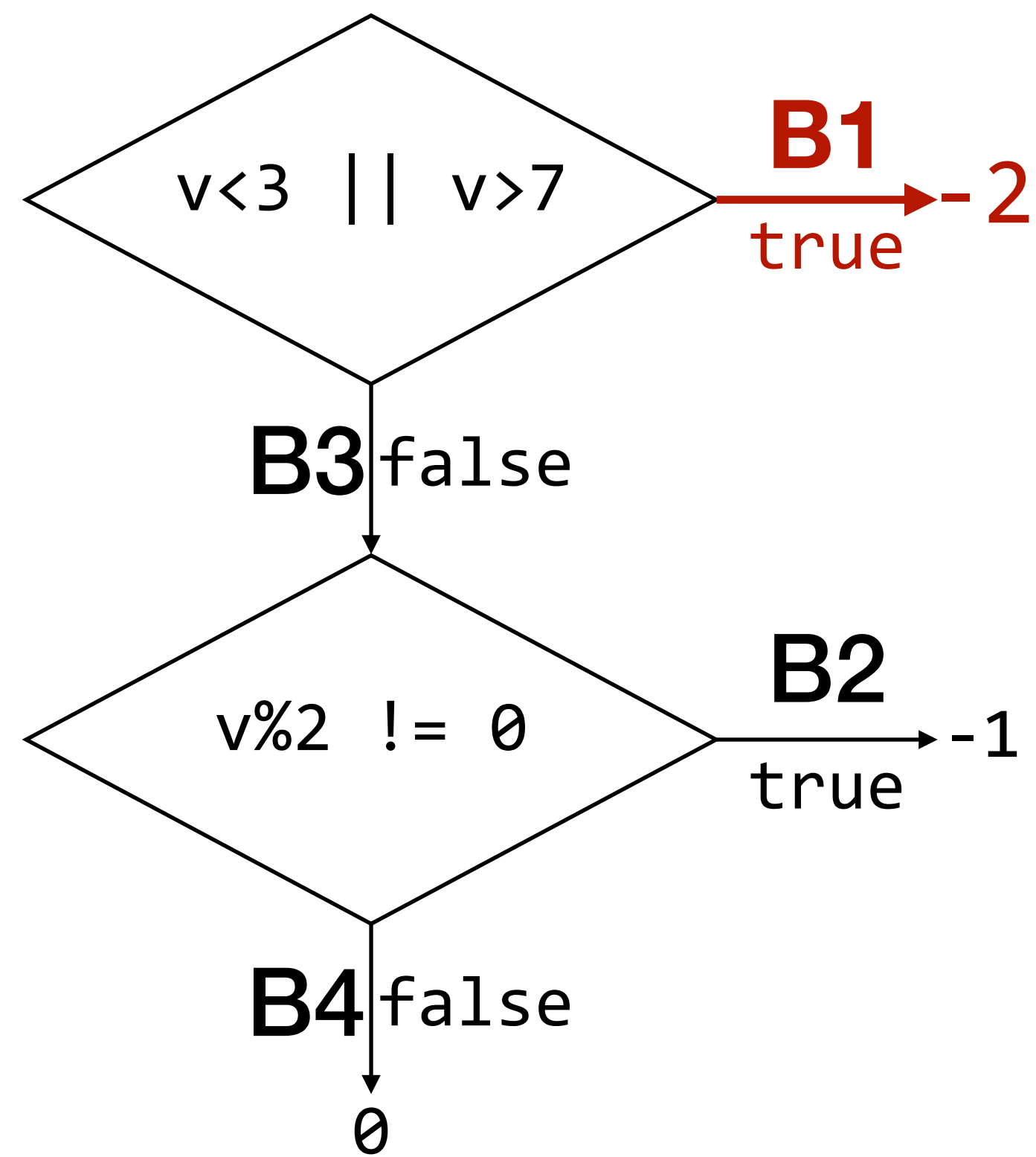
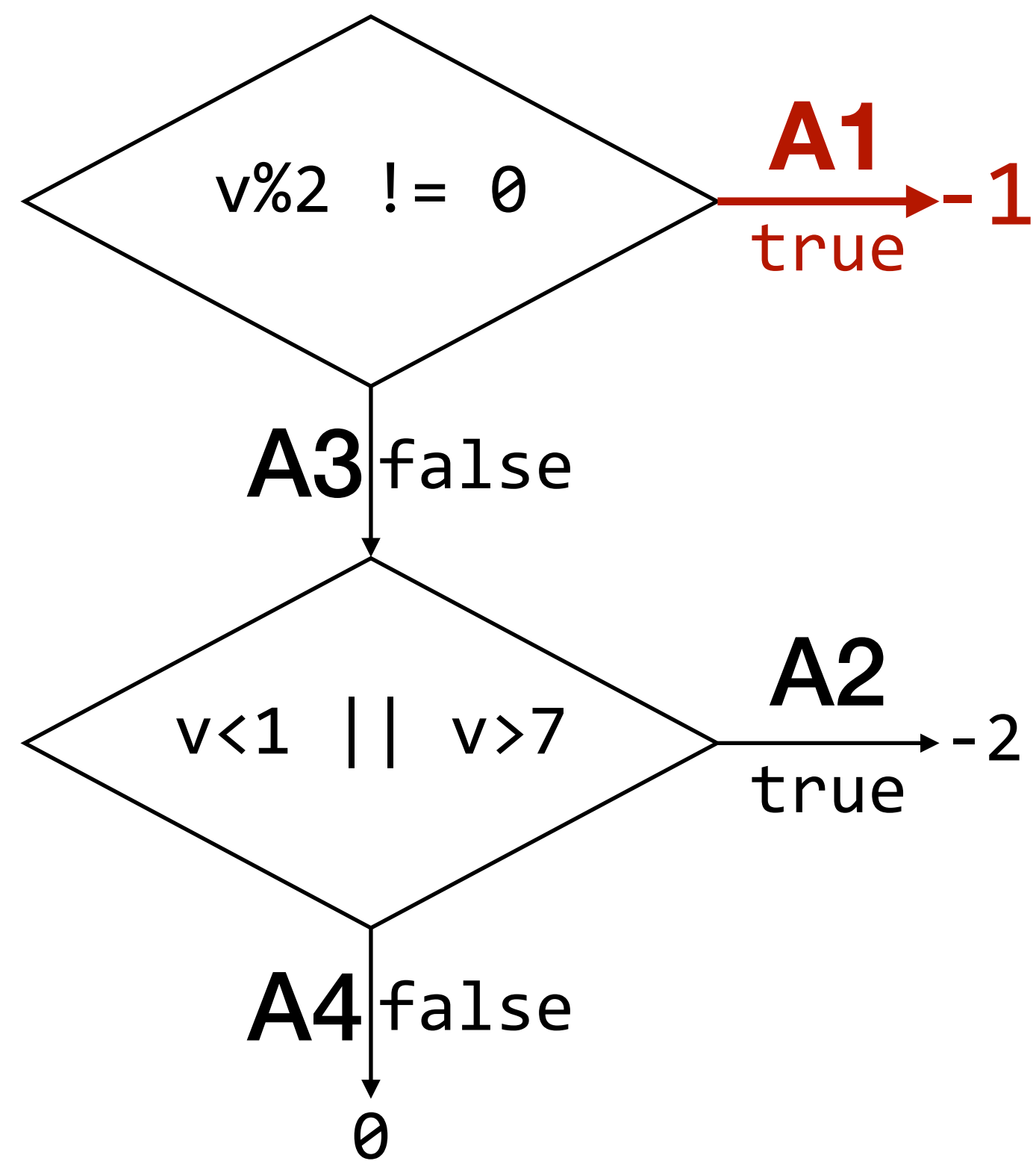


Mutations

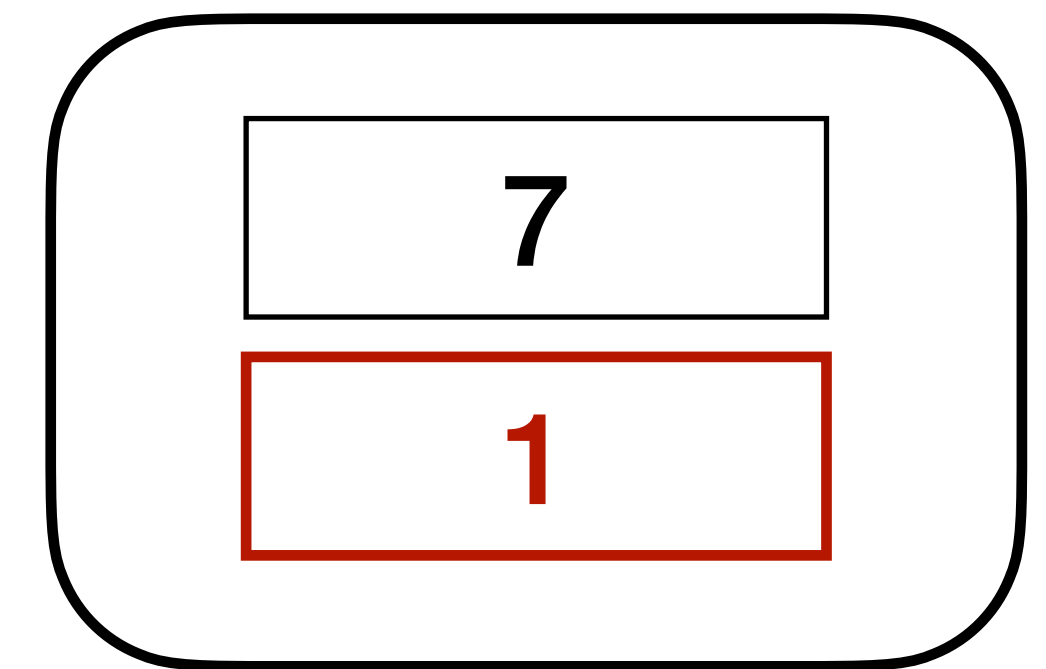


tuple = (1, 2)

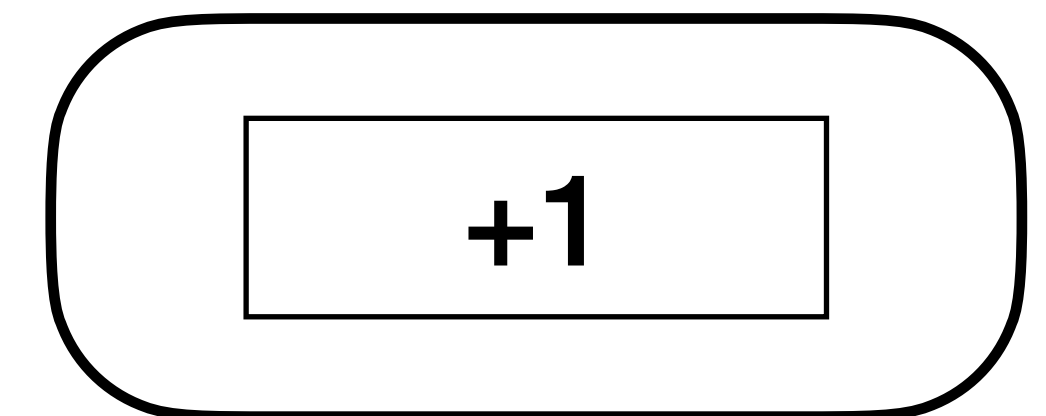
Coarse path δ -diversity considers tuples of the number of covered edges.



Seeds

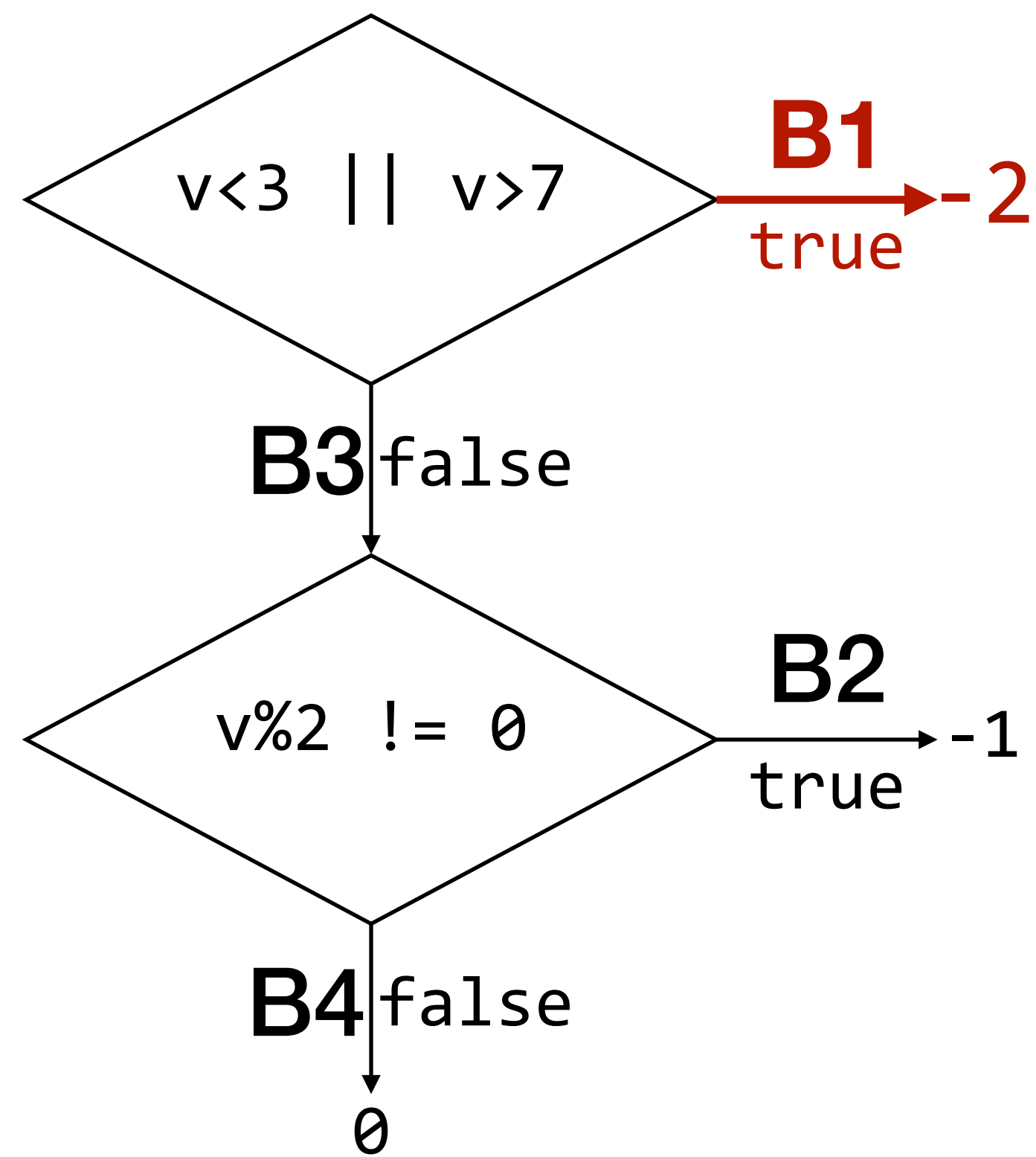
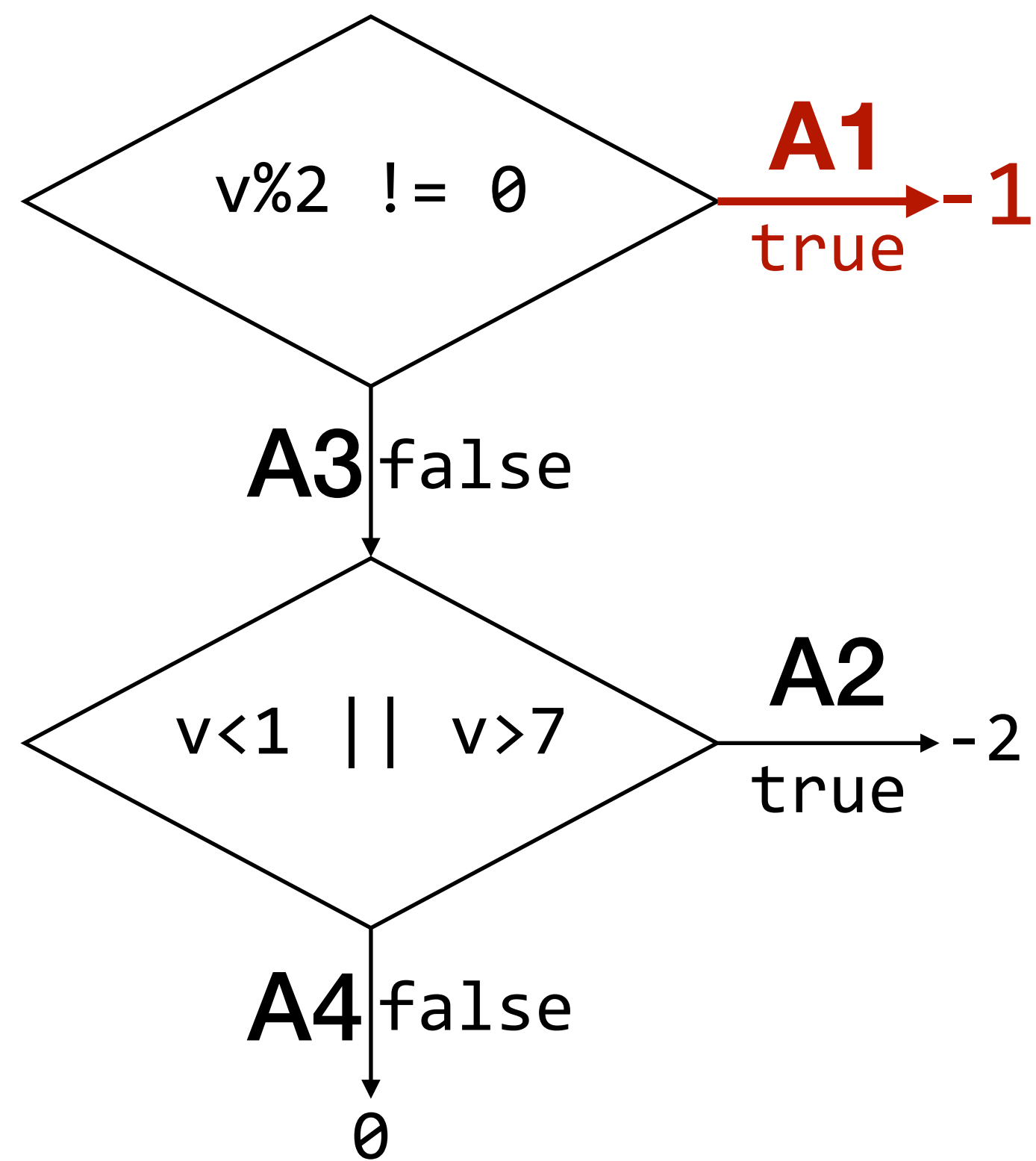


Mutations

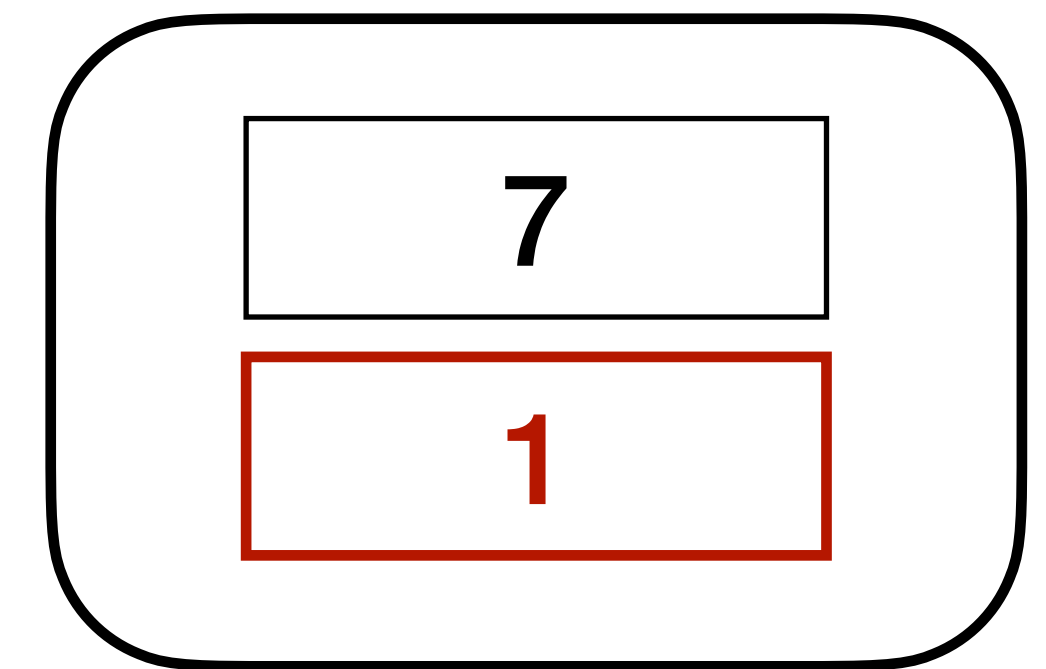


tuple = (|{A1}|, |{B1}|)

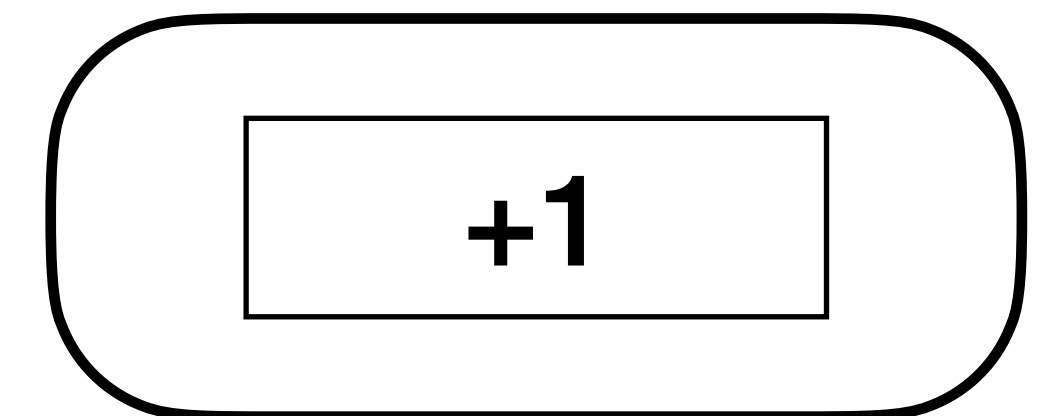
Coarse path δ -diversity considers tuples of the number of covered edges.



Seeds

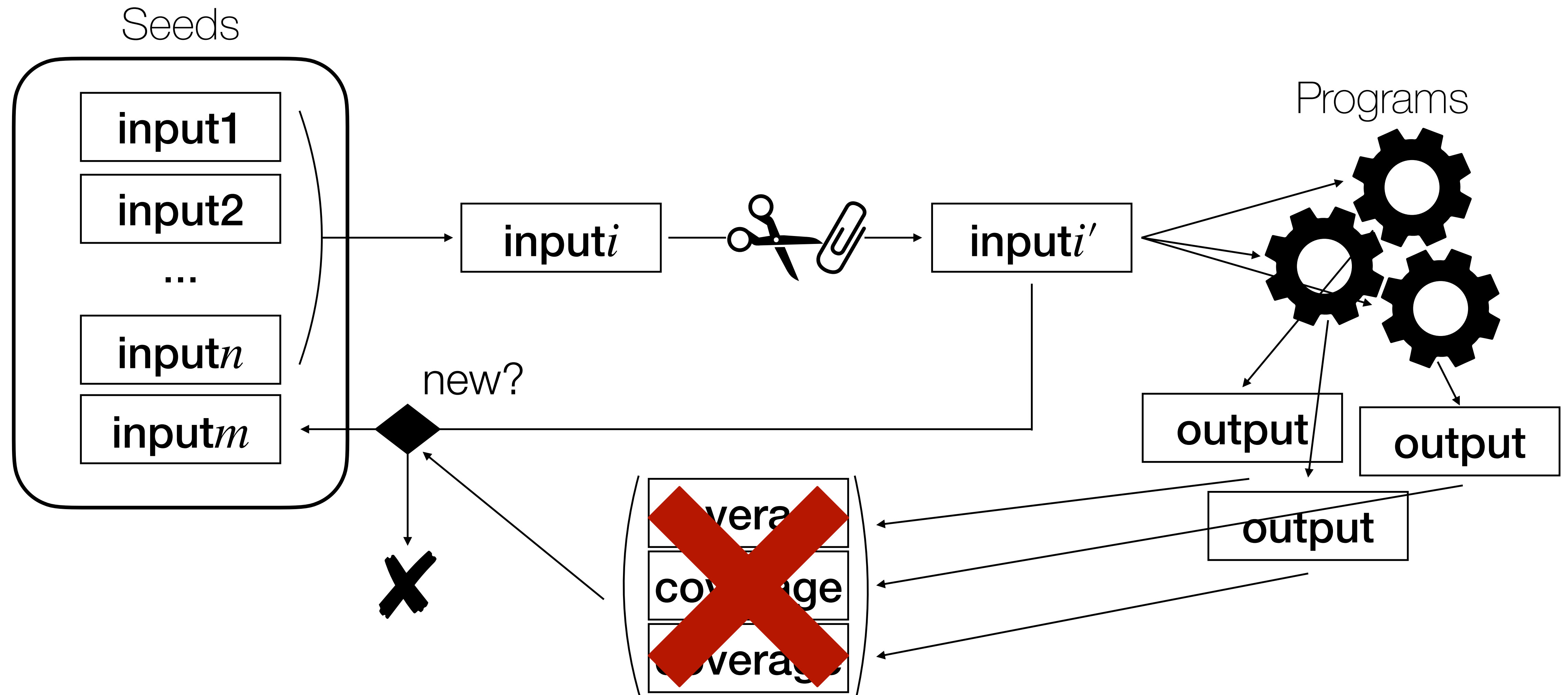


Mutations

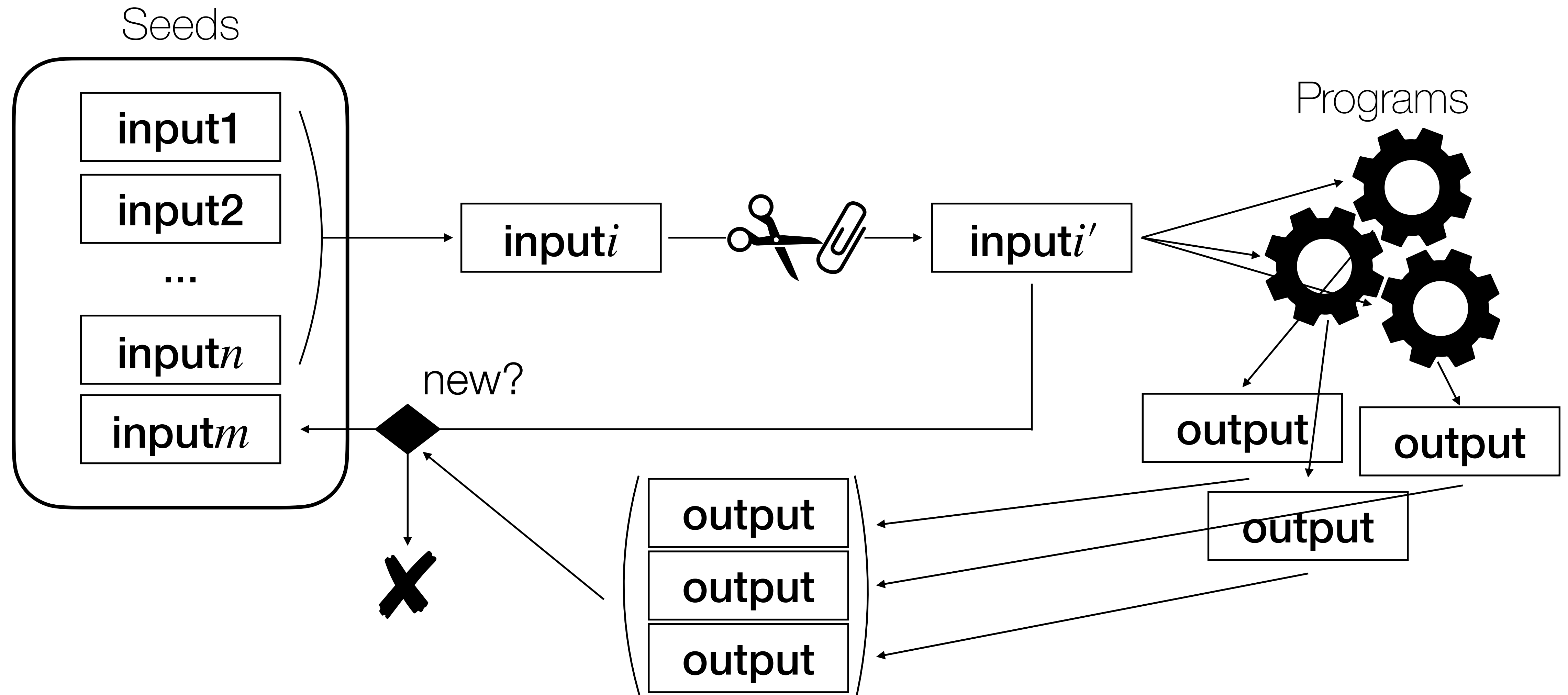


tuple = (1, 1)

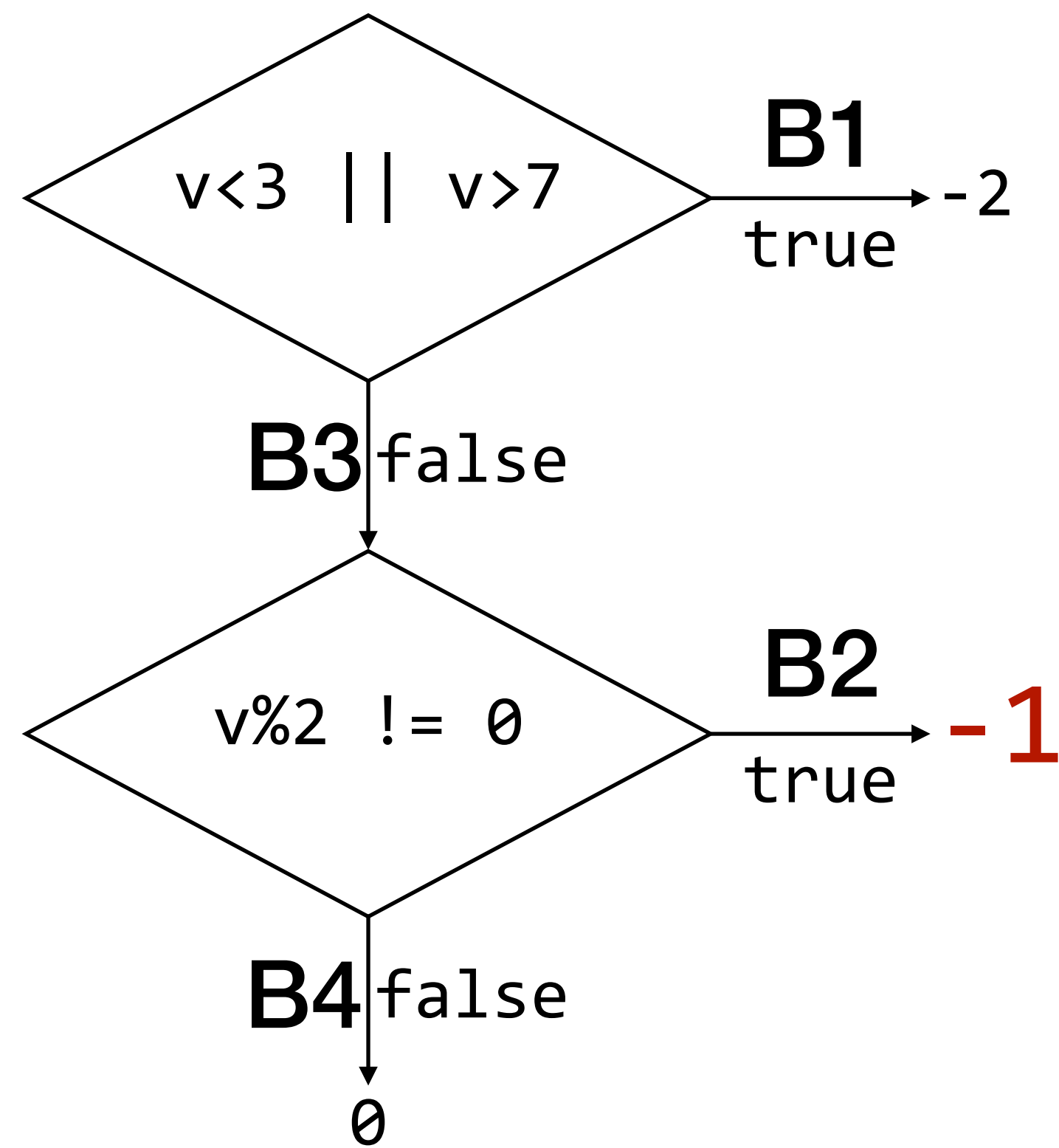
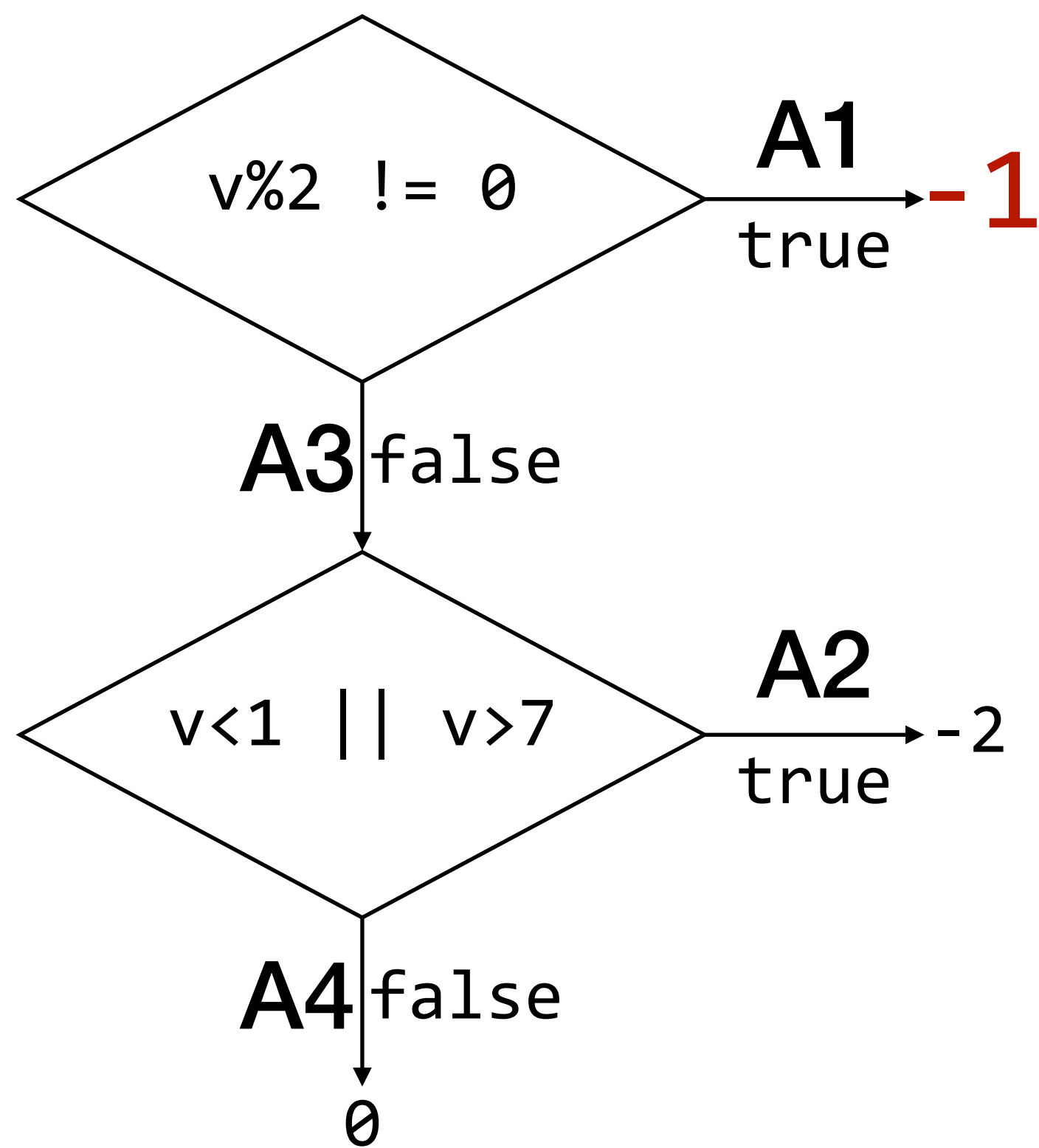
NEZHA works even in a black-box setting.



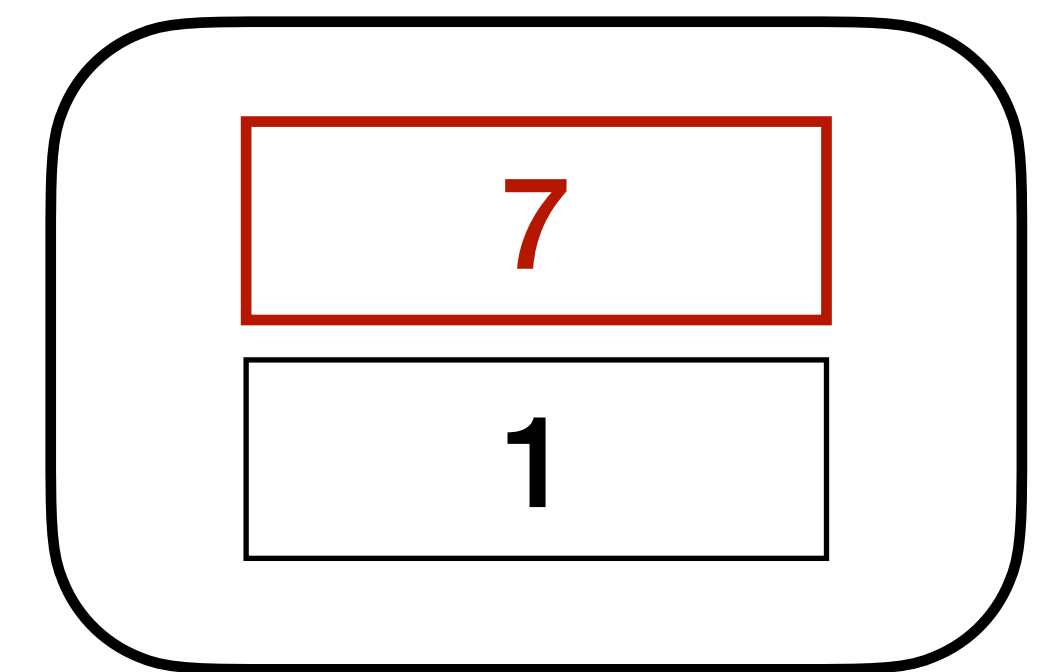
NEZHA works even in a black-box setting.



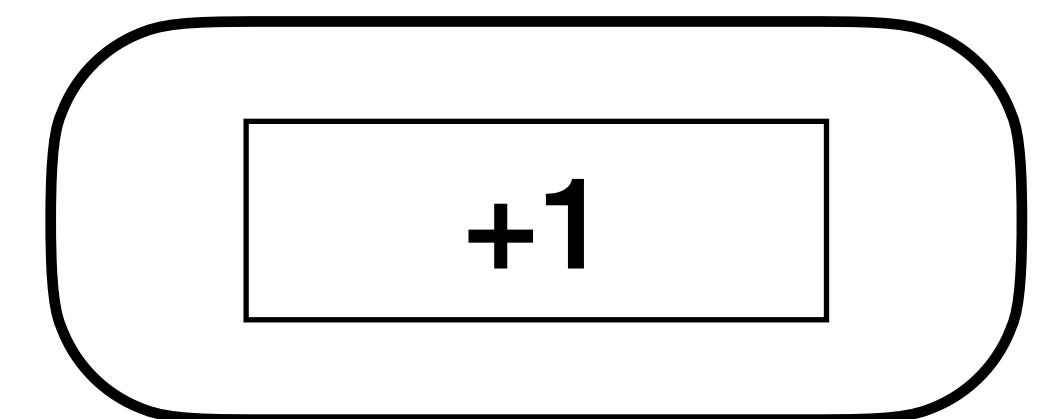
Output δ -diversity considers tuples of outputs.



Seeds

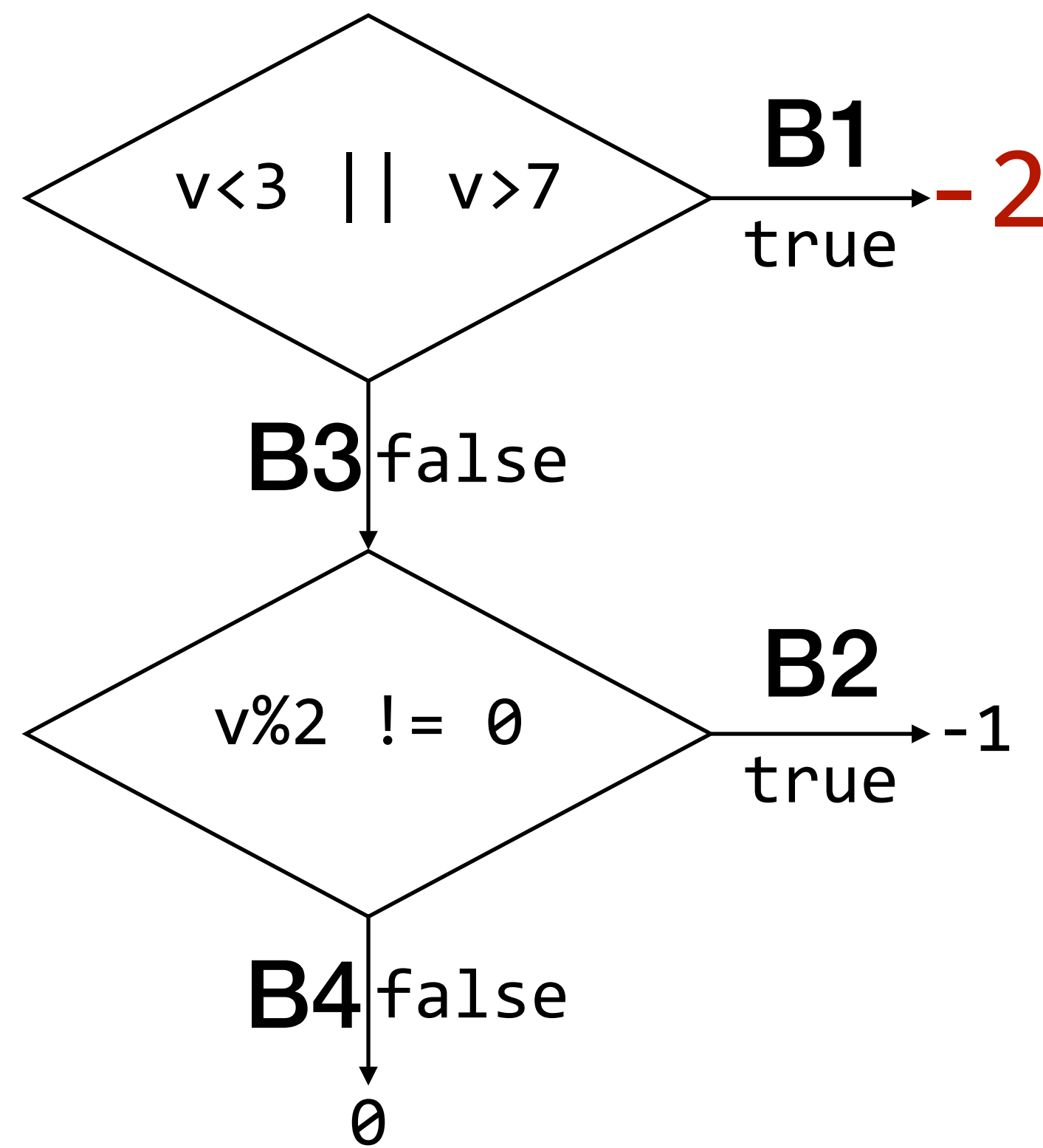
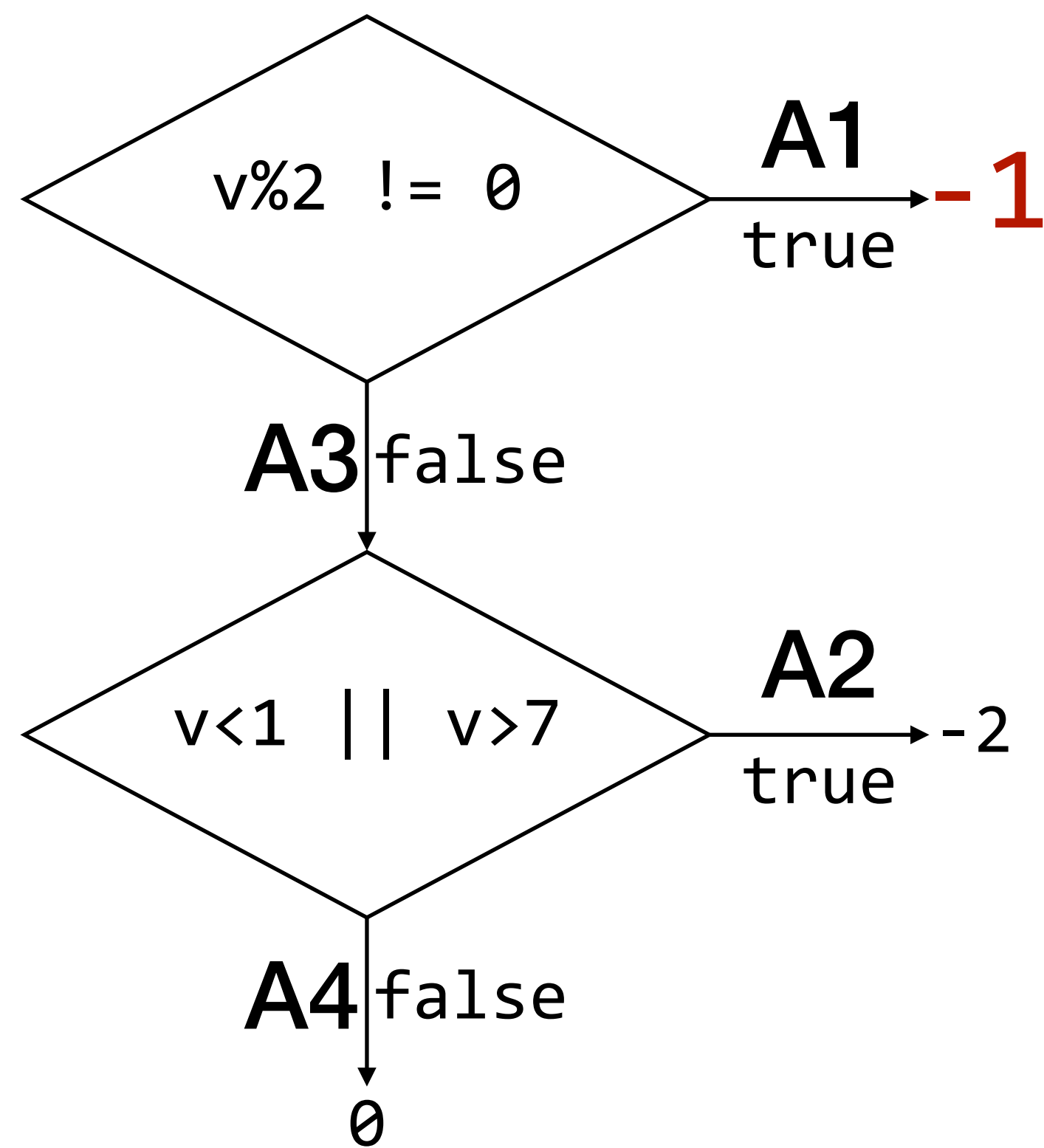


Mutations

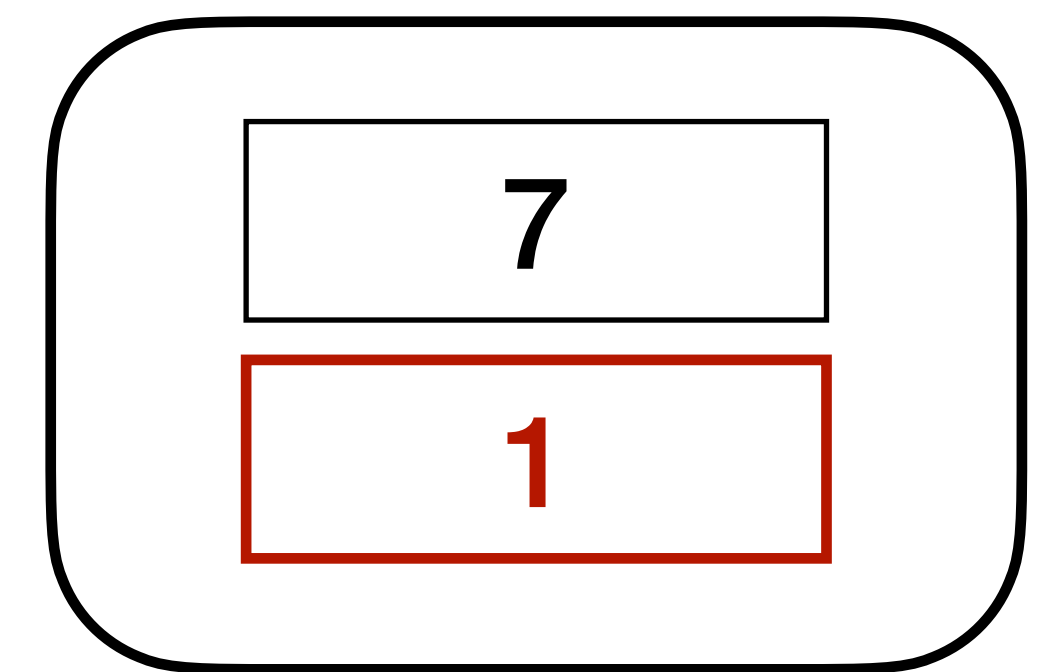


tuple = $(-1, -1)$

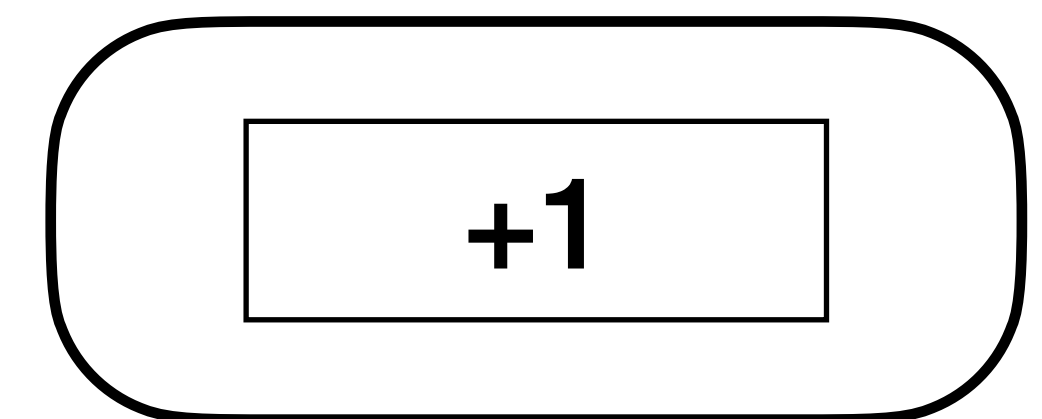
Output δ -diversity considers tuples of outputs.



Seeds



Mutations



tuple = (-1, -2)

Evaluation

1. Effectiveness
2. NEZHA vs Domain-specific differential testing
3. NEZHA vs Domain-independent fuzzers
4. Path δ -diversity vs Output δ -diversity

NEZHA effectively discovers discrepancies.

SSL/TLS	XZ	ELF	PDF
764	5	2	7

of discrepancies

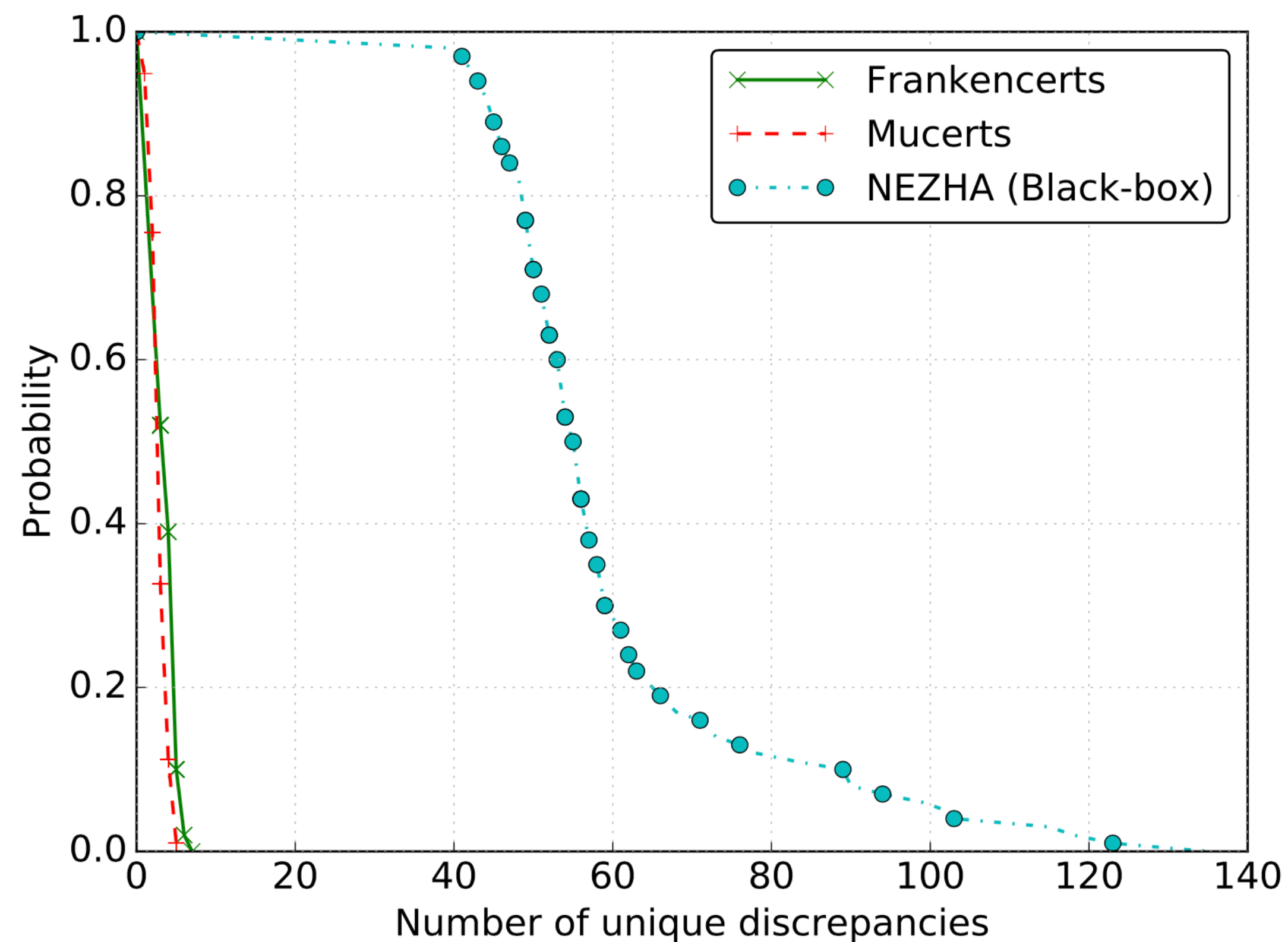
NEZHA effectively discovers discrepancies.

SSL/TLS	XZ	ELF	PDF
764	5	2	7

	LibreSSL	BoringSSL	wolfSSL	mbedTLS	GnuTLS
OpenSSL	10	1	8	33	25
LibreSSL		11	8	19	19
BoringSSL			8	33	25
wolfSSL				6	8
mbedTLS					31

of discrepancies

NEZHA outperforms existing domain-specific differential testing frameworks.

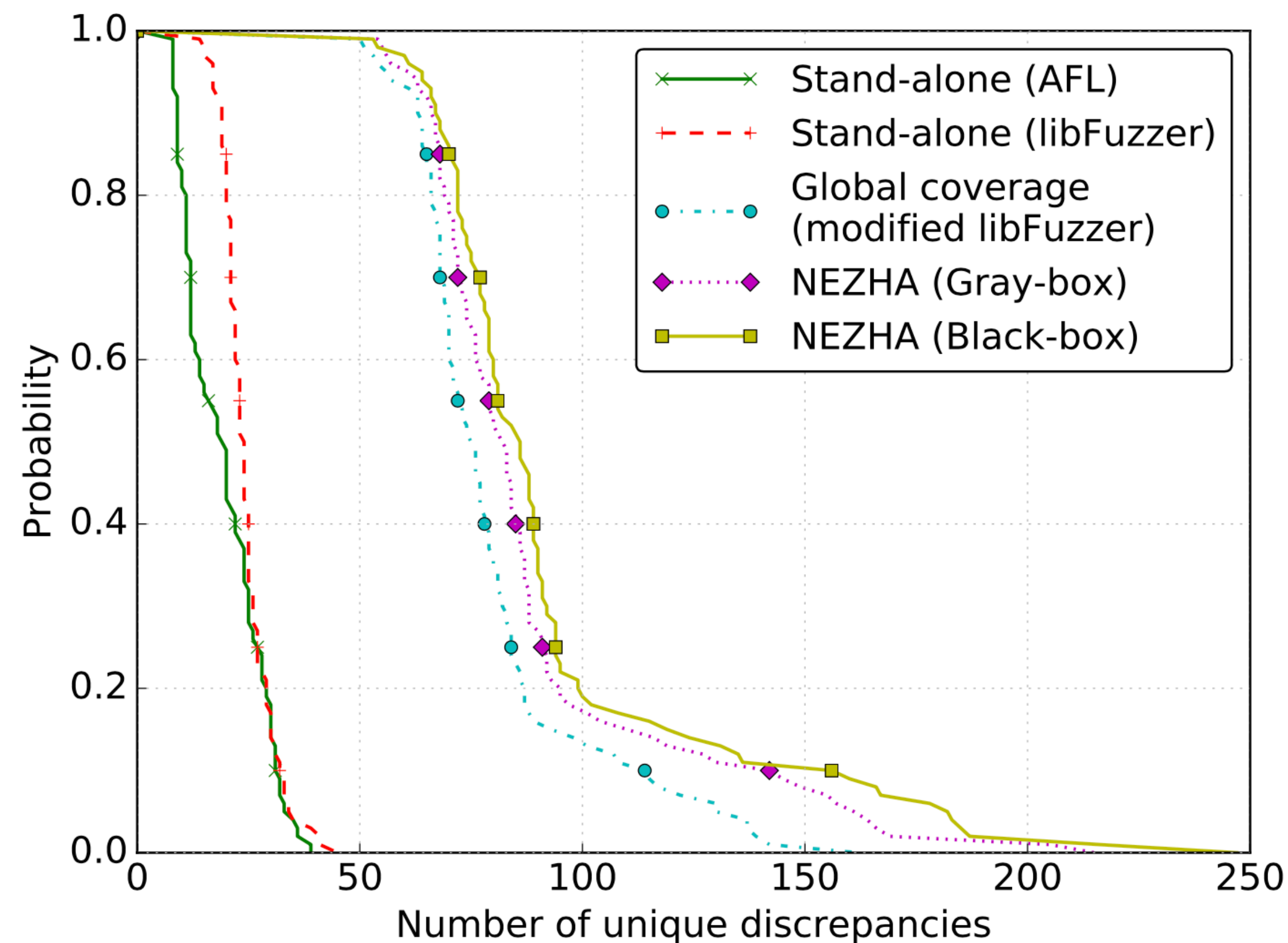


Mucerts
19

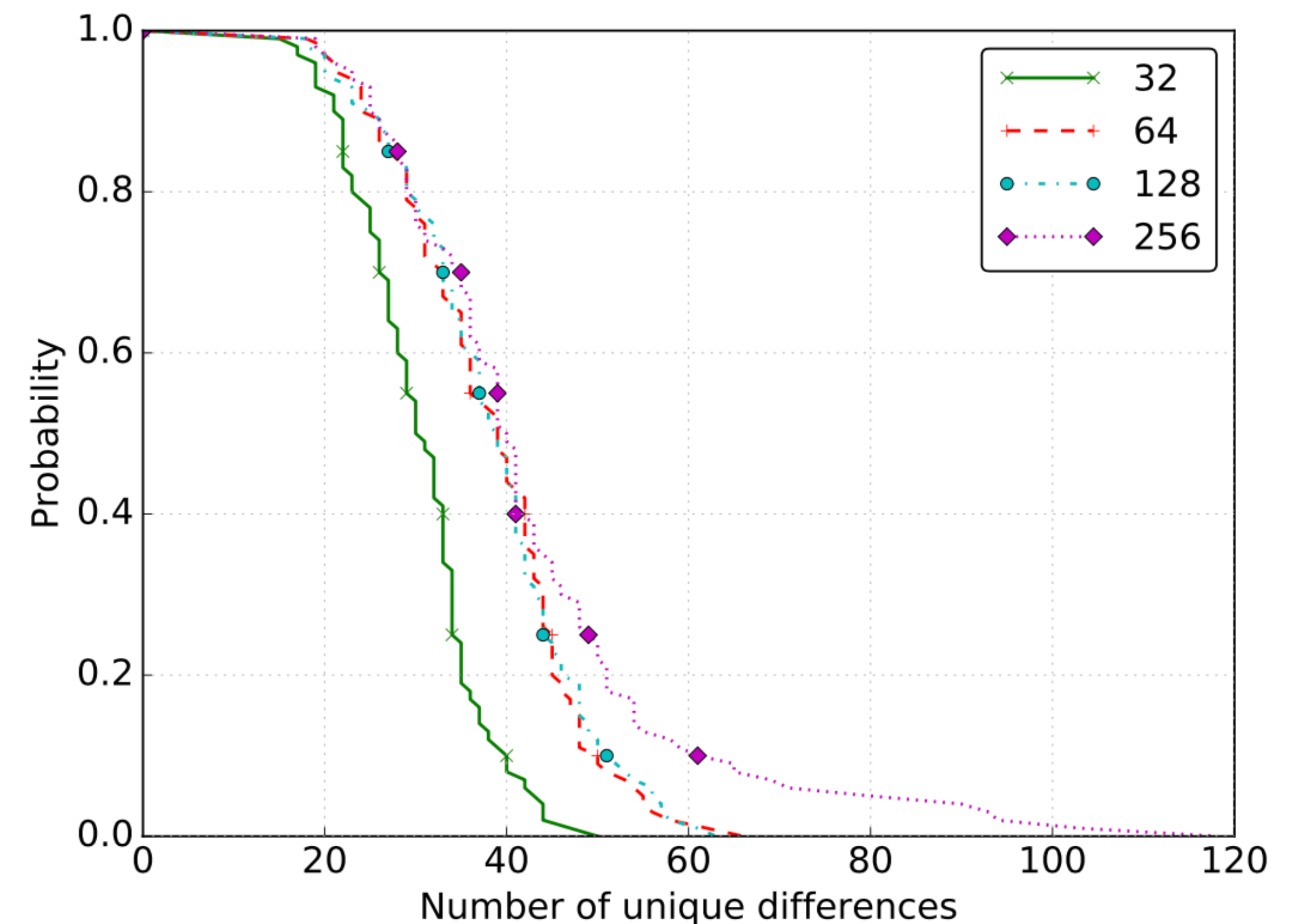
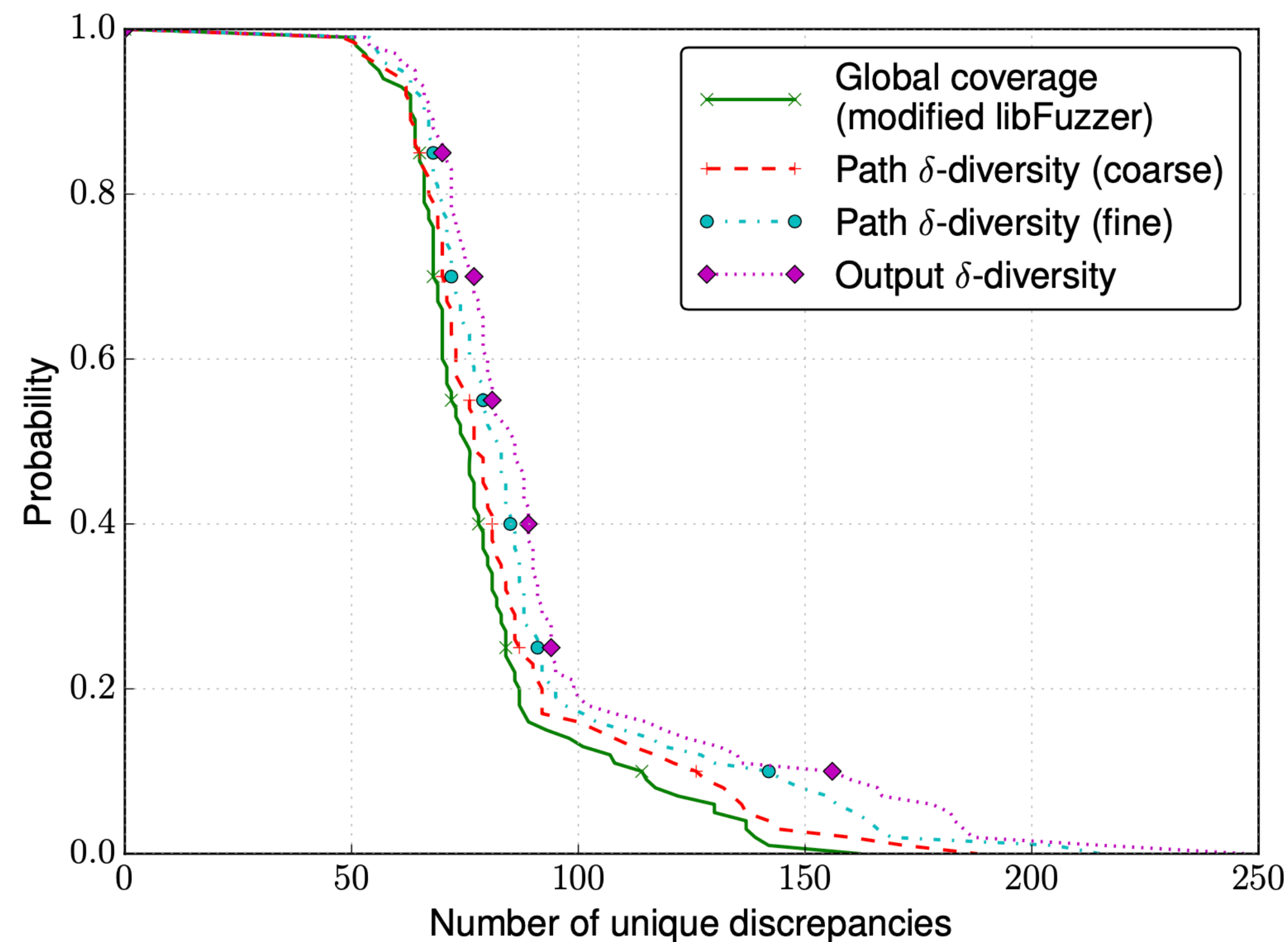
Frankencerts
10

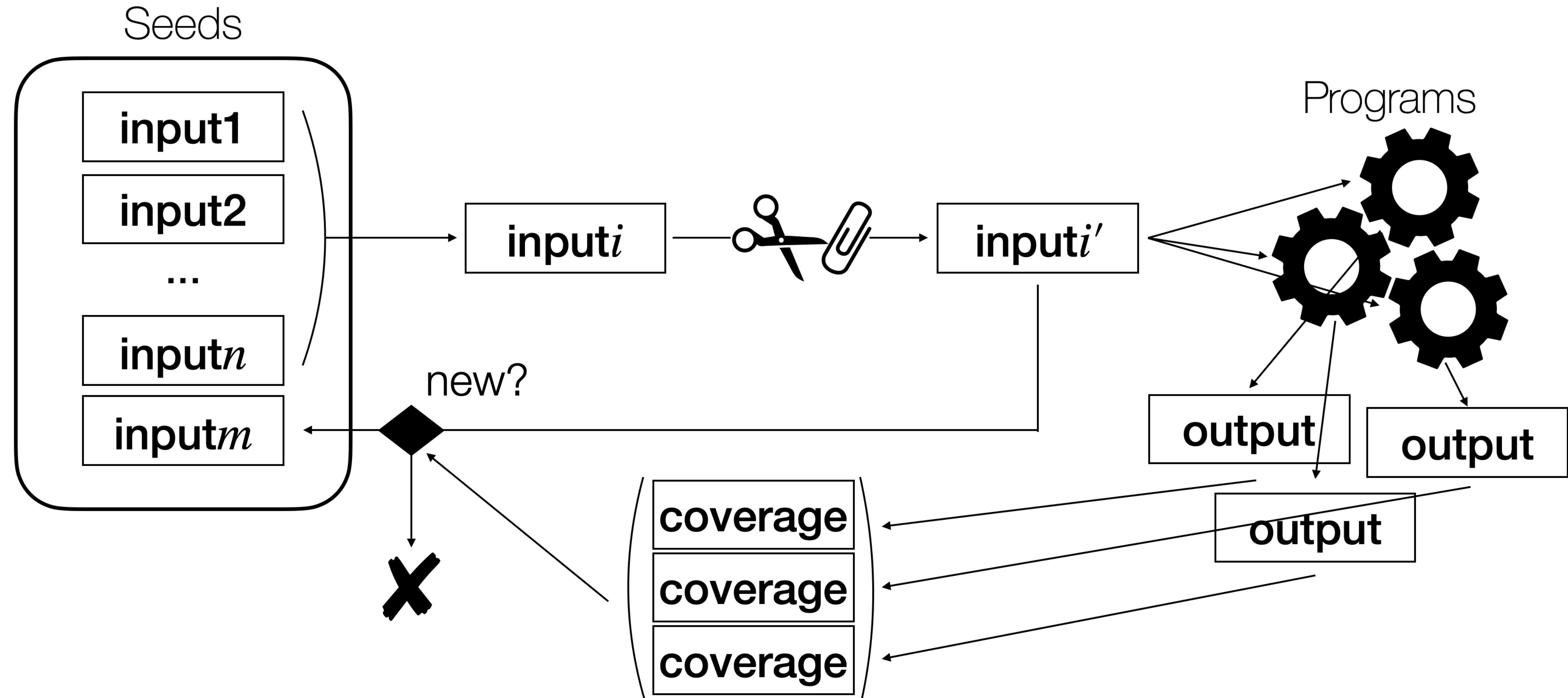
NEZHA
521

NEZHA outperforms existing domain-independent fuzzers.



Output δ -diversity is as good as path δ -diversity when outputs are fine-grained.





NEZHA

δ -diversity

- Fine path δ -diversity
- Coarse path δ -diversity
- Output δ -diversity