# STICCER: Fast and Effective Database Test Suite Reduction Through Merging of Similar Test Cases

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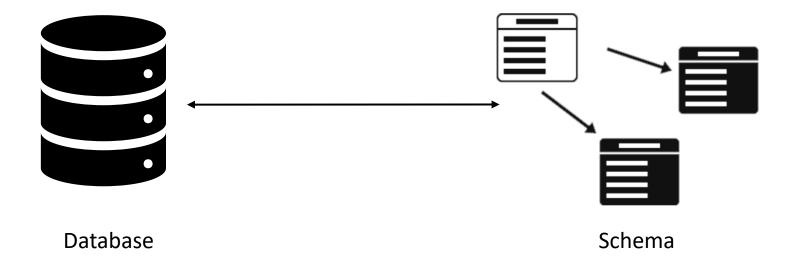






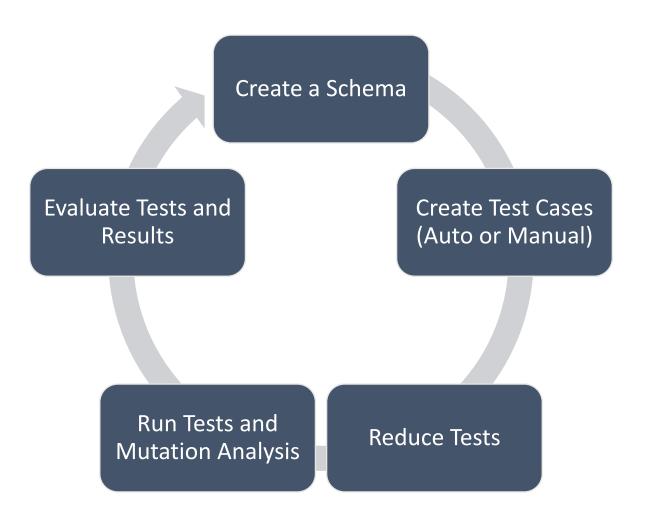
#### RELATIONAL DATABASES ARE EVERYWHERE AND THE BACKBONE OF MOST SOFTWARE SYSTEMS

#### Testing Relational Database Schemas



"A good [relational] database **schema** should have many **constraints**. [Therefore], you should **test** them" Szymon Guz, 2011

# The Process



#### Too Many Test Cases





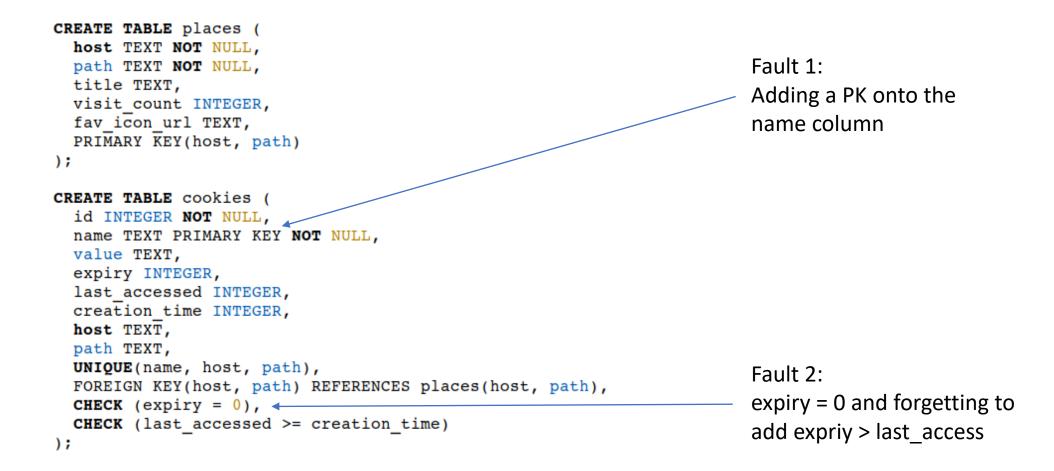


MANY CHANGES CAN INCREASES THE NUMBER OF TESTS RUNNING TESTS MIGHT CONSUME TIME INCREASE INSPECTION EFFORT (HUMAN ORACLE COST)

#### Schema

```
CREATE TABLE places (
  host TEXT NOT NULL,
  path TEXT NOT NULL,
 title TEXT,
  visit_count INTEGER, ←
                                                           Data Types
 fav_icon_url TEXT,
  PRIMARY KEY(host, path)
);
CREATE TABLE cookies (
 id INTEGER PRIMARY KEY NOT NULL,
  name TEXT NOT NULL,
 value TEXT,
  expiry INTEGER,
                                                                       Integrity
 last accessed INTEGER,
                                                                       Constraints
 creation_time INTEGER,
  host TEXT,
  path TEXT,
 UNIQUE(name, host, path),
  FOREIGN KEY(host, path) REFERENCES places(host, path),
 CHECK (expiry = 0 OR expiry > last accessed),
 CHECK (last accessed >= creation time)
);
```

#### An Example of Faults in a Database Schema

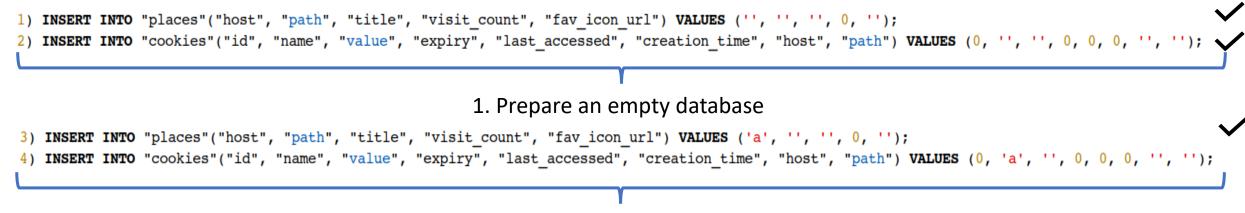


#### • Test 1 - Violating the PK constraint: id INTEGER PRIMARY KEY

1) INSERT INTO "places"("host", "path", "title", "visit\_count", "fav\_icon\_url") VALUES ('', '', '', 0, '');
2) INSERT INTO "cookies"("id", "name", "value", "expiry", "last\_accessed", "creation\_time", "host", "path") VALUES (0, '', '', 0, 0, 0, '', '');

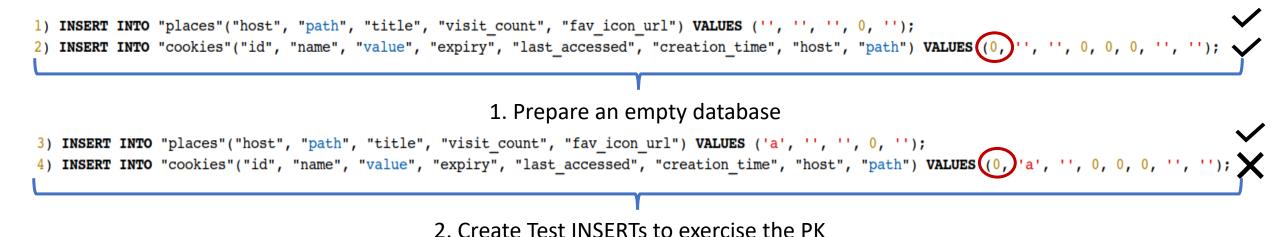
1. Prepare an empty database

#### • Test 1 - Violating the PK constraint: id INTEGER PRIMARY KEY

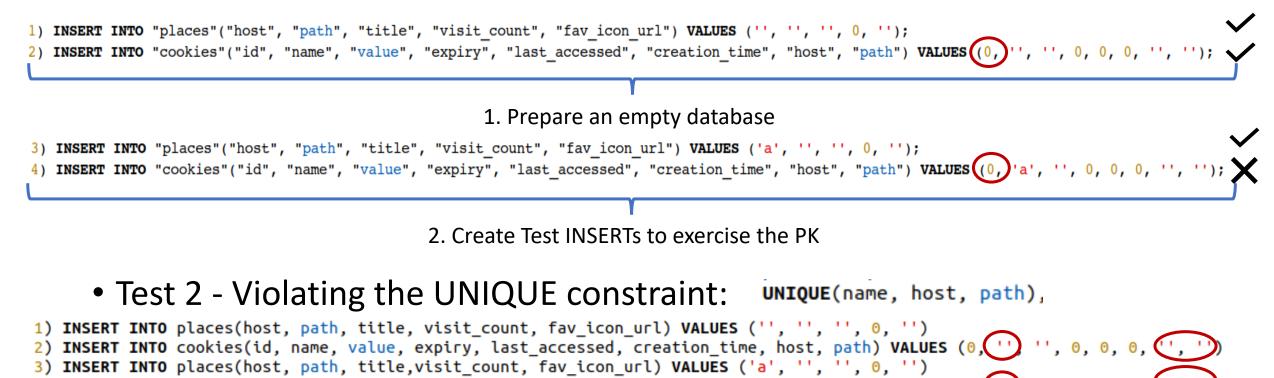


2. Create Test INSERTs to exercise the PK

#### • Test 1 - Violating the PK constraint: id INTEGER PRIMARY KEY



#### • Test 1 - Violating the PK constraint: id INTEGER PRIMARY KEY



4) INSERT INTO cookies(id, name, value, expiry, last\_accessed, creation\_time, host, path) VALUES (1,('') '', 0, 0, 0, (', '')

#### We Can Generate Tests Automatically

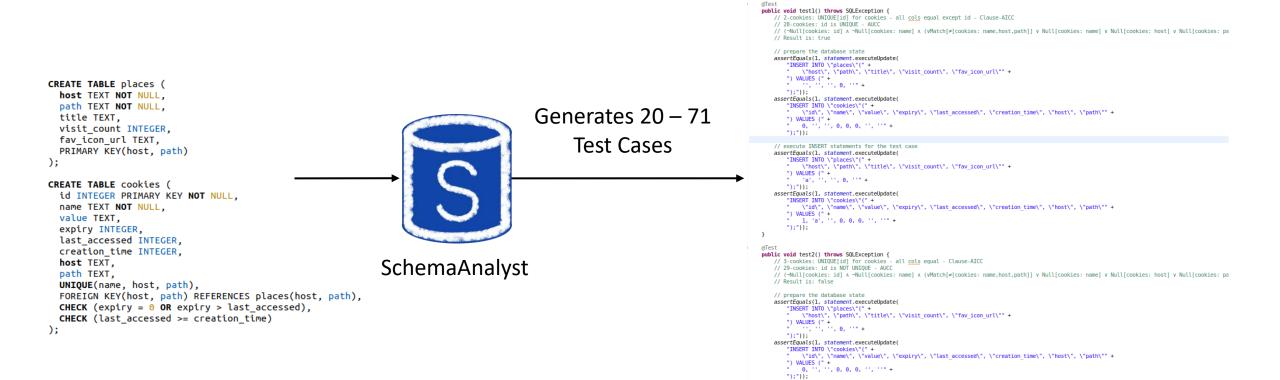
```
CREATE TABLE places (
 host TEXT NOT NULL,
  path TEXT NOT NULL,
 title TEXT.
 visit_count INTEGER,
 fav icon url TEXT,
 PRIMARY KEY(host, path)
);
CREATE TABLE cookies (
 id INTEGER PRIMARY KEY NOT NULL,
 name TEXT NOT NULL,
 value TEXT,
  expiry INTEGER,
  last_accessed INTEGER,
  creation_time INTEGER,
  host TEXT,
  path TEXT,
 UNIQUE(name, host, path),
 FOREIGN KEY(host, path) REFERENCES places(host, path),
 CHECK (expiry = 0 OR expiry > last_accessed),
 CHECK (last accessed >= creation time)
);
```

#### We Can Generate Tests Automatically

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**CREATE TABLE** places ( host TEXT NOT NULL, path TEXT NOT NULL, title TEXT. visit\_count INTEGER, fav icon url TEXT, PRIMARY KEY(host, path) ); **CREATE TABLE** cookies ( id INTEGER PRIMARY KEY NOT NULL, name TEXT NOT NULL, value TEXT, expiry INTEGER, last\_accessed INTEGER, creation\_time INTEGER, host TEXT, SchemaAnalyst path TEXT, UNIQUE(name, host, path), FOREIGN KEY(host, path) REFERENCES places(host, path), CHECK (expiry = 0 OR expiry > last\_accessed), CHECK (last accessed >= creation time) );

#### Generating Tests Automatically



Test data wrapped into INSERTs and

// execute INSERT statements for the test case
assertEquals(1, statement.executeUpdate(
 "INSERT INTO \"places\"(" +

") VALUES (" + " 'a', '', '', 0, ''" +

");"));

\"host\", \"path\", \"title\", \"visit\_count\", \"fav\_icon\_url\"" +

into JUnit test cases <sup>15</sup>

### The Solution



#### TO USE TRADITIONAL TEST SUITE REDUCTION TECHNIQUES

### Test Suite Reduction Background

	r1	r2	r3	r4	r5	r6
t1	Х	X	Х			
t2	Х			Х		
t3		X			Х	
t4			Х			Х
t5					Х	

- We can use the following approaches:
  - Random Reduction randomly select test case until all the requirements covered
  - Additional Greedy (or called greedy in TSR literature)
  - HGS (an approach by Harrold, Gupta, and Soffa)

	r1	r2	r3	r4	r5	r6
t1	Х	Х	X			
t2	Х			Х		
t3		Х			Х	
t4			Х			Х
t5					Х	
	r1	r2	r3	r4	r5	r6

	r1	r2	r3	r4	r5	r6
t1	Х	Х	X			
t2	Х			Х		
t3		Х			Х	
t4			Х			Х
t5					X	
	r1	r2	r3	r4	r5	r6
t1	Х	Х	X			

	r1	r2	r3	r4	r5	r6
t1	Х	Х	Х			
t2	Х			Х		
t3		Х			Х	
t4			Х			Х
t5					Х	
	r1	r2	r3	r4	r5	r6
t1	Х	Х	X			
t3		Х			Х	

	r1	r2	r3	r4	r5	r6
t1	Х	Х	X			
t2	Х			Х		
t3		Х			X	
t4			Х			Х
t5					X	
	r1	r2	r3	r4	r5	r6
t1	Х	Х	X			
t3		Х			Х	
t2	Х			Х		

	r1	r2	r3	r4	r5	r6
t1	Х	Х	Х			
t2	Х			Х		
t3		Х			Х	
t4			Х			Х
t5					Х	
	r1	r2	r3	r4	r5	r6
t1	Х	Х	X			
t3		Х			Х	
t2	Х			X		
t4			Х			Х

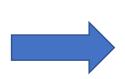
	r1	r2	r3	r4	r5	r6	-	Т	R	tn	Cardinality
t1	Х	Х	Х					T1	r1	{t1, t2}	2
t2	Х			Х				T2	r2	{t1, t3}	2
t3		Х			Х			Т3	r3	{t1, t4}	2
t4			Х			Х		T4	r4	{t2}	1
t5					Х			T5	r5	{t3, t5}	2
	T1	Т2	Т3	Т4	T5	Т6		Т6	r6	{t4}	1

Т	R	tn	Cardinality
T1	r1	{t1, t2}	2
T2	r2	{t1, t3}	2
Т3	r3	{t1, t4}	2
<del>T</del> 4	r4	<del>{t2}</del>	<del>1</del>
T5	r5	{t3, t5}	2
<del>T6</del>	<del>r6</del>	<del>{t4}</del>	1



	r1	r2	r3	r4	r5	r6
t2	Х			X		
t4			Х			Х

т	R	tn	Cardinality
<del>71</del>	<del>r1</del>	<del>{t1, t2}</del>	2
T2	r2	{ <del>t1</del> , t3}	2
<del>13</del>	<del>rЗ</del>	<del>{t1, t4}</del>	2
<del>T4</del>	r4	<del>{t2}</del>	1
T5	r5	{t3, t5}	2
<del>T6</del>	<del>r6</del>	<del>{t4}</del>	1



	r1	r2	r3	r4	r5	r6
t2	Х			X		
t4			Х			Х

т	R	tn	Cardinality
<del>71</del>	<del>r1</del>	<del>{t1, t2}</del>	2
T2	r2	{ <b>t1</b> , <b>t3</b> }	2
<del>T3</del>	<del>r3</del>	<del>{t1, t4}</del>	2
<del>T4</del>	r4	<del>{t2}</del>	1
T5	r5	{ <b>t3</b> , t5}	2
<del>T6</del>	<del>r6</del>	<del>{t4}</del>	1



	r1	r2	r3	r4	r5	r6
t2	Х			Х		
t4			Х			Х
t3		X			X	

### What is missing?

	r1	r2	r3	r4	r5	r6
t2	Х			Х		
t4			Х			Х
t3		X			X	

Can we merge similar test cases (decreasing the data restarts)? Can we decrease the number of INSERTs (decreasing database interactions)? Can we remove any extra redundancy?

Test 1

1) INSERT INTO "places"("host", "path", "title", "visit\_count", "fav\_icon\_url") VALUES ('', '', '', 0, '');
2) INSERT INTO "cookies"("id", "name", "value", "expiry", "last\_accessed", "creation\_time", "host", "path") VALUES (0, '', '', 0, 0, 0, '', '');
3) INSERT INTO "places"("host", "path", "title", "visit\_count", "fav\_icon\_url") VALUES ('a', '', 0, 0, '');
4) INSERT INTO "cookies"("id", "name", "value", "expiry", "last accessed", "creation time", "host", "path") VALUES (0, 'a', '', 0, 0, 0, '', '');

Test 2

1) INSERT INTO "places"("host", "path", "title", "visit\_count", "fav\_icon\_url") VALUES ('', '', '', 0, '');
2) INSERT INTO "cookies"("id", "name", "value", "expiry", "last\_accessed", "creation\_time", "host", "path") VALUES (0, '', '', 0, 0, 0, '', '');
3) INSERT INTO "places"("host", "path", "title", "visit\_count", "fav\_icon\_url") VALUES ('a', '', '', 0, '');
4) INSERT INTO "cookies"("id", "name", "value", "expiry", "last accessed", "creation\_time", "host", "path") VALUES (1, '', '', 0, 0, 0, 0, '', '');

Test 1

2) INSERT I 3) INSERT I	NTO "places"("host", "path", "title", "visit_count", "fav_icon_url") VALUES ('', '', '', 0, ''); NTO "cookies"("id", "name", "value", "expiry", "last_accessed", "creation_time", "host", "path") VALUES (0, '', '', 0, 0, 0, 0, '', ''); NTO "places"("host", "path", "title", "visit_count", "fav_icon_url") VALUES ('a', '', '', 0, ''); NTO "cookies"("id", "name", "value", "expiry", "last_accessed", "creation_time", "host", "path") VALUES (0, 'a', '', 0, 0, 0, 0, '', ''); NTO "cookies"("id", "name", "value", "expiry", "last_accessed", "creation_time", "host", "path") VALUES (0, 'a', '', 0, 0, 0, 0, '', '');	Equal
Test 2		
1) INSERT I	NTO "places"("host", "path", "title", "visit_count", "fav_icon_url") VALUES ('', '', '', 0, '');	
2) INSERT I	NTO "cookies"("id", "name", "value", "expiry", "last_accessed", "creation_time", "host", "path") VALUES (0, '', '', 0, 0, 0, '', '');	
3) INSERT I	NTO "places"("host", "path", "title", "visit_count", "fav_icon_url") VALUES ('a', '', '', 0, '');	
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Test 1

1) INSERT INTO "places"("host", "path", "title", "visit\_count", "fav\_icon\_url") VALUES ('', '', '', 0, '');
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4) INSERT INTO "cookies"("id", "name", "value", "expiry", "last\_accessed", "creation\_time", "host", "path") VALUES (0, 'a', '', 0, 0, 0, 0, '', '');

Test 2

INSERT INTO "cookies"("id", "name", "value", "expiry", "last\_accessed", "creation\_time", "host", "path") VALUES (1, '', '', 0, 0, 0, '', '');

Remove

Test 1

1) INSERT INTO "places"("host", "path", "title", "visit\_count", "fav\_icon\_url") VALUES ('', '', '', 0, '');
2) INSERT INTO "cookies"("id", "name", "value", "expiry", "last\_accessed", "creation\_time", "host", "path") VALUES (0, '', '', 0, 0, 0, 0, '', '');
3) INSERT INTO "places"("host", "path", "title", "visit count", "fav icon url") VALUES ('a', '', '', 0, '');
4) INSERT INTO "cookies"("id", "name", "value", "expiry", "last\_accessed", "creation\_time", "host", "path") VALUES (0, 'a', '', 0, 0, 0, 0, '', '');
4) INSERT INTO "cookies"("id", "name", "value", "expiry", "last\_accessed", "creation\_time", "host", "path") VALUES (0, 'a', '', 0, 0, 0, 0, '', '');

Test 2

4) INSERT INTO "cookies"("id", "name", "value", "expiry", "last\_accessed", "creation\_time", "host", "path") VALUES (1, '', '', 0, 0, 0, '', '');

Test 1

1) INSERT INTO "places"("host", "path", "title", "visit\_count", "fav\_icon\_url") VALUES ('', '', '', 0, '');

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4) INSERT INTO "cookies"("id", "name", "value", "expiry", "last\_accessed", "creation\_time", "host", "path") VALUES (0, 'a', '', 0, 0, 0, '', '');

Test 2

4) INSERT INTO "cookies"("id", "name", "value", "expiry", "last\_accessed", "creation\_time", "host", "path") VALUES (1, '', '', 0, 0, 0, '', '');

Remove

Test 1

Test 2

1) INSERT INTO "places"("host", "path", "title", "visit\_count", "fav\_icon\_url") VALUES ('', '', 0, '');
2) INSERT INTO "cookies"("id", "name", "value", "expiry", "last accessed", "creation time", "host", "path") VALUES (0, '', '', 0, 0, 0, '', '');

4) INSERT INTO "cookies"("id", "name", "value", "expiry", "last\_accessed", "creation\_time", "host", "path") VALUES (0, 'a', '', 0, 0, 0, '', '');

Merge

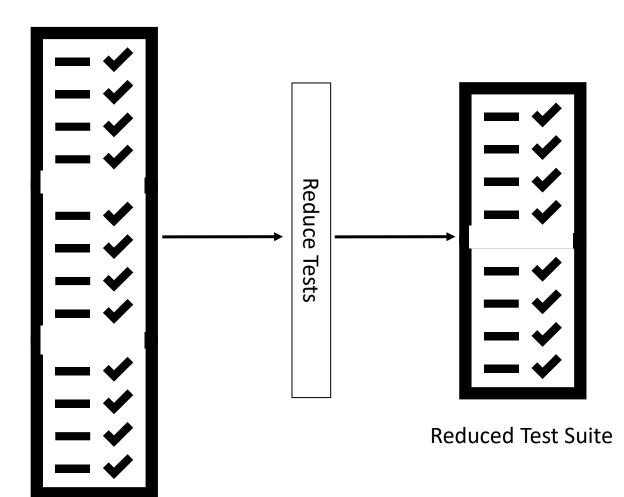
4) INSERT INTO "cookies"("id", "name", "value", "expiry", "last\_accessed", "creation\_time", "host", "path") VALUES (1, '', '', 0, 0, 0, '', '');

Test 1 & Test 2
1) INSERT INTO places(host, path, title, visit\_count, fav\_icon\_url) VALUES ('', '', '', 0, '')
2) INSERT INTO cookies(id, name, value, expiry, last\_accessed, creation\_time, host, path) VALUES (0, '', '', 0, 0, 0, 0, '', '')
3) INSERT INTO cookies(id, name, value, expiry, last\_accessed, creation\_time, host, path) VALUES (0, 'a', '', 0, 0, 0, 0, '', '')
4) INSERT INTO cookies(id, name, value, expiry, last\_accessed, creation\_time, host, path) VALUES (1, '', '', 0, 0, 0, 0, '', '')

# Schema Test Integrity Constraints Combination for Efficient Reduction (STICCER)

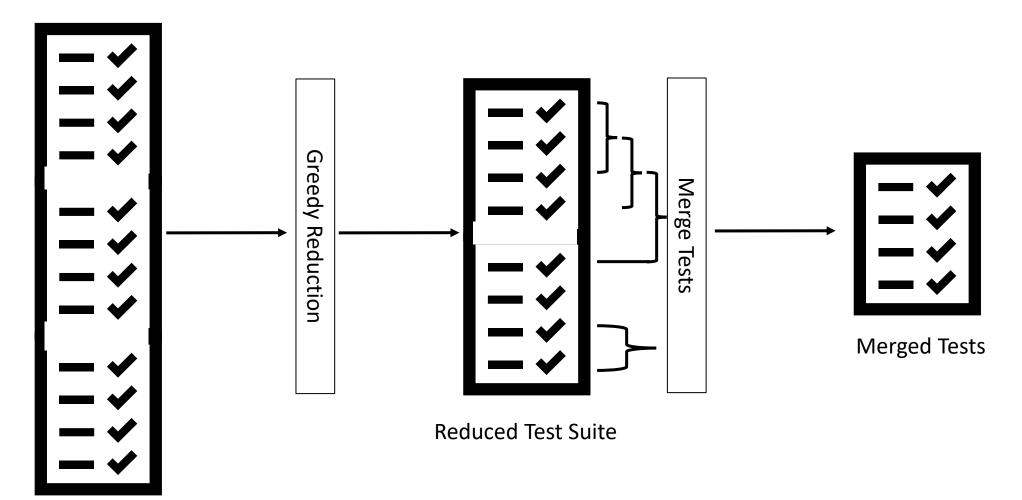


# Schema Test Integrity Constraints Combination for Efficient Reduction (STICCER)



Full Test Suite

# Schema Test Integrity Constraints Combination for Efficient Reduction (STICCER)



Full Test Suite

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RQ1: Reduction Effectiveness - How effective is STICCER at *reducing the number of test cases and INSERTs?* 

# Research Questions



RQ2: Impact on Fault Finding Capability -How is the *fault-finding capability* of the test suites affected?



RQ3: Impact on Test Suite and Mutation Analysis Runtime - How are the *running times* of the reduced test suites on mutation analysis affected?

#### 34 schemas

- 1-42 tables
- 3 309 columns

#### 1 – 134 integrity constraints

Two test data generators

30 runs

Four reduction techniques

**Mutation analysis** 

Methodology

- iTrust schema includes 42 tables, 309 columns, 134 Integrity Constraints
  - Highest merge count = 539 merges.

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  - Highest merge count = 539 merges.

Metric	OTS	STICCER	Random	Greedy	HGS
Test Cases	1517	85% (235)	44% (849)	49% (776)	50% (754)
INSERTs	2204	57% (940)	45% (1212)	50% (1101)	52% (1064)

- iTrust schema includes 42 tables, 309 columns, 134 Integrity Constraints
  - Highest merge count = 539 merges.

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INSERTs	2204	57% (940)	45% (1212)	50% (1101)	52% (1064)

On Average:

Metric	STICCER	Random	Greedy	HGS
Test Cases	74%	42%	48%	50%
INSERTs	59%	43%	49%	51%

• No loss of coverage

- iTrust schema includes 42 t Constraints
  - Highest mer

Metric

**INSERTs** 

Test

Test

STICCER is the most effective at reducing the number of test cases and the overall number of INSERT statements in a test suite

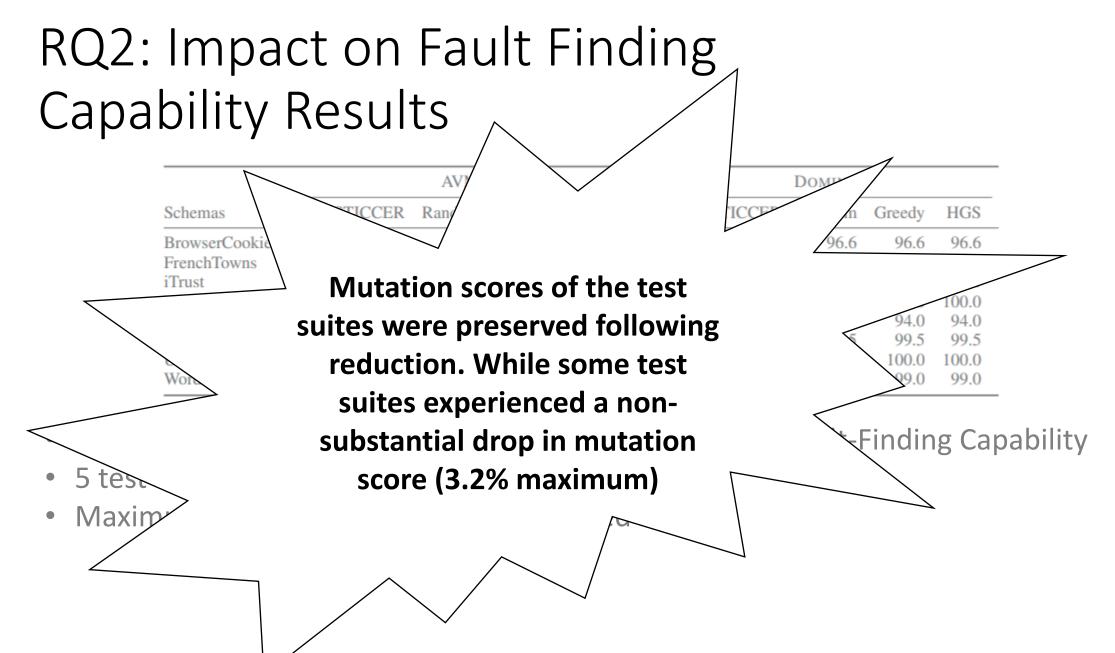
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51%

# RQ2: Impact on Fault Finding Capability Results

	AVM-D				Domino					
Schemas	OTS	STICCER	Random	Greedy	HGS	OTS	STICCER	Random	Greedy	HGS
BrowserCookies	86.5	▼86.5	86.5	▼86.5	▼86.5	96.6	96.6	96.6	96.6	96.6
FrenchTowns	83.3	*▼80.3	*▼80.3	*▼80.3	*▼81.8	95.5	95.5	95.5	95.5	95.5
iTrust	83.6	*▼83.6	*▼83.6	*▼83.6	*▼83.6	99.2	99.2	99.2	99.2	99.1
NistWeather	93.8	*▼90.6	93.8	*▼90.6	93.8	100.0	100.0	100.0	100.0	100.0
NistXTS749	92.0	92.0	▼92.0	92.0	*▼88.0	94.0	94.0	94.0	94.0	94.0
RiskIt	89.3	89.3	▼89.3	89.3	*▼88.8	99.5	99.5	99.5	99.5	99.5
UnixUsage	98.2	98.2	98.2	98.2	*▼97.3	100.0	100.0	100.0	100.0	100.0
WordNet	87.4	* ▼86.3	▼87.4	* ¥86.3	*▼86.3	99.0	99.0	99.0	99.0	99.0

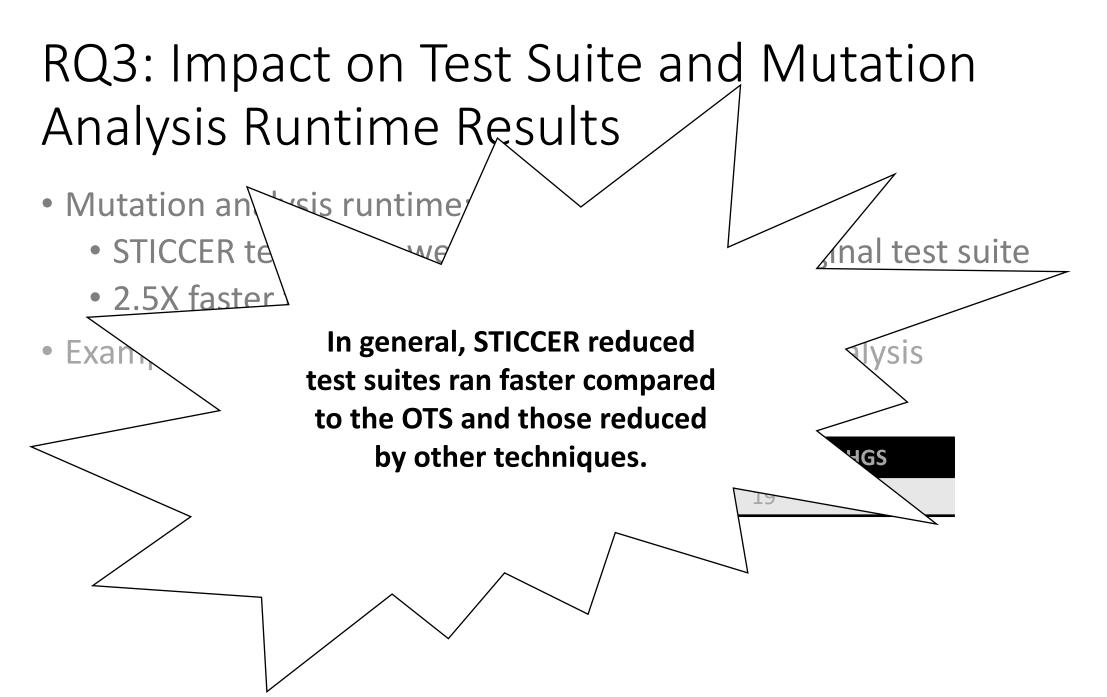
- AVM-D generated and reduced test case impacted the Fault-Finding Capability
- 5 test suites were impacted by STICCER reduction
- Maximum impact was only 3.2% compared to OTS



## RQ3: Impact on Test Suite and Mutation Analysis Runtime Results

- Mutation analysis runtime:
  - STICCER test suites were 5X faster than the original test suite
  - 2.5X faster than other traditional reduction techniques
- Example: iTrust test suites and running mutation analysis

Unit	OTS	STICCER	Random	Greedy	HGS
Minutes	38	7 (+2 reduction)	21	19	18.5



- STICCER = Reduce + Merge
- Outperforms other reduction techniques and maintains coverage
- A maximum of 3.2% loss of fault-finding capabilities (mutation)
- Conclusions and Future Work
- Mutation analysis execution:
  - 5X faster than the original test suite
  - 2.5X faster than other traditional reduction techniques
- Future Work:
  - Integrate STICCER within the test data generator
  - Enhance STICCER with multi-objective test data generators
  - Adapt STICCER into traditional programs that manipulate complex state in other formats



github.com/schemaanalyst/schemaanalyst