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# HYBRID METHODS FOR REDUCING DATABASE SCHEMA TEST SUITES: EXPERIMENTAL INSIGHTS FROM COMPUTATIONAL AND HUMAN STUDIES

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“A good [relational] database schema should have many constraints. You should test them too.”

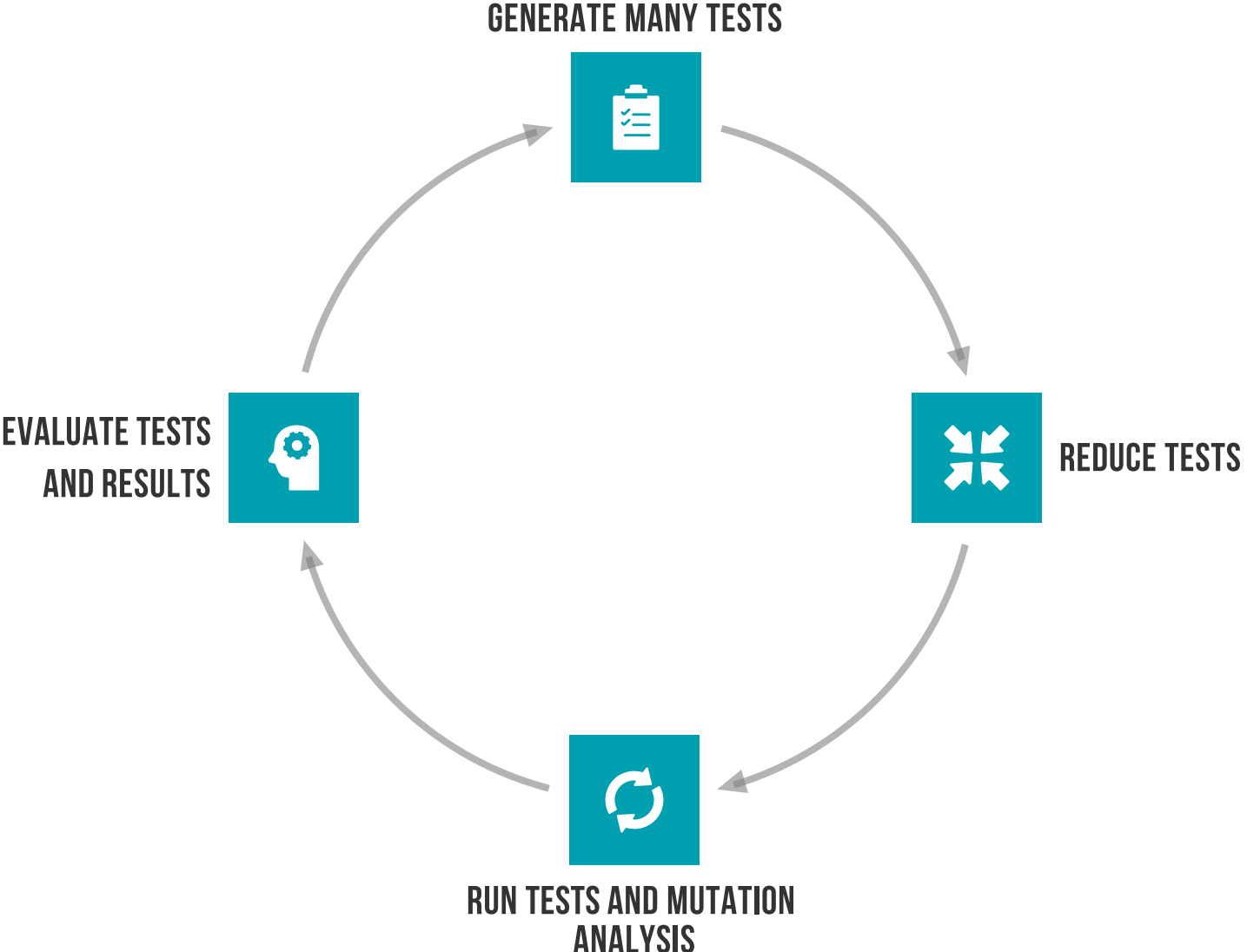
Szymon Guz, 2011





```
1 CREATE TABLE person (  
2     id int not null,  
3     last_name varchar(45) not null,  
4     first_name varchar(45) not null,  
5     gender varchar(6) not null,  
6     date_of_birth date not null,  
7     PRIMARY KEY (id),  
8     CHECK (gender IN ('Male', 'Female', 'Other'))  
9 );
```

# AUTOMATICALLY GENERATING TESTS



# STEP 1: GENERATING TEST DATA

```
1 CREATE TABLE person (  
2   id int not null,  
3   last_name varchar(45) not null,  
4   first_name varchar(45) not null,  
5   gender varchar(6) not null,  
6   date_of_birth date not null,  
7   PRIMARY KEY (id),  
8   CHECK (gender IN ('Male', 'Female', 'Other'))  
9 );
```



SchemaAnalyst

```
1 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
2   VALUES (-585, 'ddnmwdjv', 'djdrua', 'Uknown', '1998-03-01');  
3 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
4   VALUES (-470, 'lmyv', '', 'Female', '1996-02-17');  
5 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
6   VALUES (-585, 'ddnmwdjv', 'djdrua', 'Uknown', '1998-03-01');  
7 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
8   VALUES (-585, 'Uknown', 'Female', 'Male', '2009-05-28');  
9 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
10  VALUES (-416, 'qyvt', 'vwbtck', 'Uknown', '1996-11-22');  
11 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
12  VALUES (NULL, 'ljleqrs', 'anusj', 'Uknown', '1991-05-24');  
13 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
14  VALUES (-61, NULL, 'Female', 'Uknown', '1995-07-25');  
15 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
16  VALUES (959, 'atcusjct', NULL, 'Uknown', '1991-07-12');  
17 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
18  VALUES (58, 'Uknown', 'waphctipj', NULL, '2008-09-03');  
19 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
20  VALUES (-45, '', 'hwssnyss', 'Female', NULL);  
21 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
22  VALUES (-458, '', 'Female', 'Male', '2008-06-10');  
23 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
24  VALUES (414, 'sflk', 'hkn', 'Female', '2000-01-01');  
25 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
26  VALUES (0, 'ib', 'edvbewwyg', 'Uknown', '1992-03-17');  
27 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
28  VALUES (54, 'Uknown', 'Male', 'xicbaf', '2012-04-03');  
29 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
30  VALUES (-585, 'ddnmwdjv', 'djdrua', 'Uknown', '1998-03-01');  
31 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
32  VALUES (-653, 'dqtkrqp', '', 'Male', '2000-01-01');  
33 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
34  VALUES (-585, 'ddnmwdjv', 'djdrua', 'Uknown', '1998-03-01');  
35 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
36  VALUES (-156, 'ddnmwdjv', 'utcwxgk', 'Uknown', '2000-01-01');  
37 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
38  VALUES (-585, 'ddnmwdjv', 'djdrua', 'Uknown', '1998-03-01');  
39 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
40  VALUES (-114, 'jtdtu', 'Uknown', 'Uknown', '1998-06-14');  
41 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
42  VALUES (-585, 'ddnmwdjv', 'djdrua', 'Uknown', '1998-03-01');  
43 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
44  VALUES (0, 'pg', 'djdrua', 'Male', '1996-10-01');  
45 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
46  VALUES (-585, 'ddnmwdjv', 'djdrua', 'Uknown', '1998-03-01');  
47 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
48  VALUES (-83, '', 'lvcykgb', 'Female', '2000-01-01');  
49 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
50  VALUES (-585, 'ddnmwdjv', 'djdrua', 'Uknown', '1998-03-01');  
51 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
52  VALUES (432, '', 'sknbueyq', 'Uknown', '2007-01-27');  
53 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
54  VALUES (-585, 'ddnmwdjv', 'djdrua', 'Uknown', '1998-03-01');  
55 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
56  VALUES (543, '', 'Uknown', 'Male', '2008-10-10');  
57 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
58  VALUES (-585, 'ddnmwdjv', 'djdrua', 'Uknown', '1998-03-01');  
59 INSERT INTO "person"("id", "last_name", "first_name", "gender", "date_of_birth")  
60  VALUES (-435, 'vjtv', '', 'Male', '1998-03-01');
```

## STEP 2: REDUCE TEST SUITE (PRIOR WORK)

HIGHER IS BETTER

RANDOM REDUCTION

42%

GREEDY REDUCTION

48%

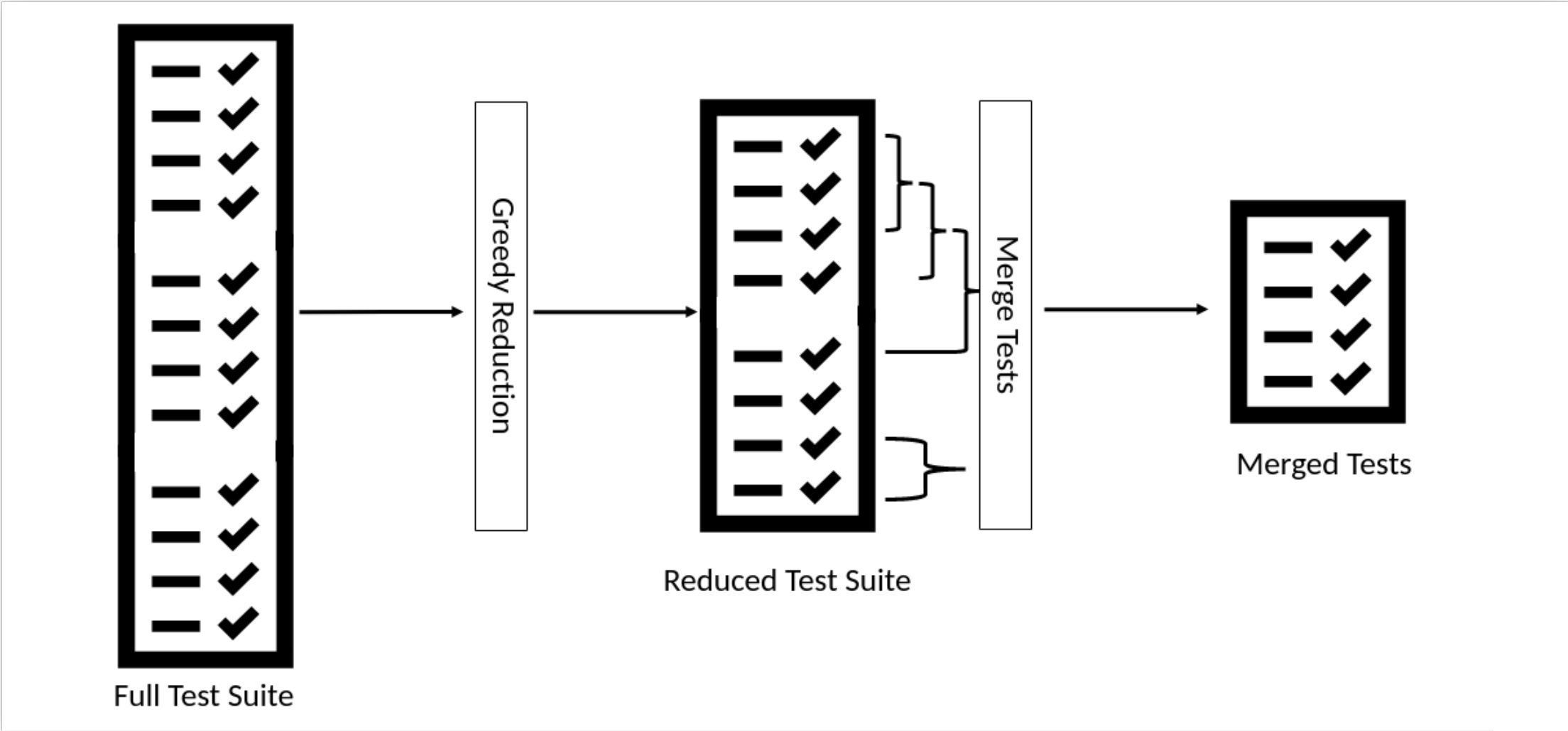
HGS REDUCTION

50%

STICCER + GREEDY REDUCTION

66%

# HOW DOES STICGER WORK?



```

@Test
public void test17() throws SQLException {
    // prepare the database state
    assertEquals(1, statement.executeUpdate(
        "INSERT INTO \"person\"(" +
        "  \"id\", \"last_name\", \"first_name\", \"gender\", \"date_of_birth\" +
        ") VALUES (" +
        "  -585, 'ddnwmwdjv', 'djdrua', 'Uknown', '1998-03-01' +
        ");"));

    // execute INSERT statements for the test case
    assertEquals(1, statement.executeUpdate(
        "INSERT INTO \"person\"(" +
        "  \"id\", \"last_name\", \"first_name\", \"gender\", \"date_of_birth\" +
        ") VALUES (" +
        "  -83, '', 'lvckygb', 'Female', '2000-01-01' +
        ");"));
}

@Test
public void test18() throws SQLException {
    // prepare the database state
    assertEquals(1, statement.executeUpdate(
        "INSERT INTO \"person\"(" +
        "  \"id\", \"last_name\", \"first_name\", \"gender\", \"date_of_birth\" +
        ") VALUES (" +
        "  -585, 'ddnwmwdjv', 'djdrua', 'Uknown', '1998-03-01' +
        ");"));

    // execute INSERT statements for the test case
    assertEquals(1, statement.executeUpdate(
        "INSERT INTO \"person\"(" +
        "  \"id\", \"last_name\", \"first_name\", \"gender\", \"date_of_birth\" +
        ") VALUES (" +
        "  432, '', 'sknbueyq', 'Uknown', '2007-01-27' +
        ");"));
}

```

```

@Test
public void test19() throws SQLException {
    // prepare the database state
    assertEquals(1, statement.executeUpdate(
        "INSERT INTO \"person\"(" +
        "  \"id\", \"last_name\", \"first_name\", \"gender\", \"date_of_birth\" +
        ") VALUES (" +
        "  -585, 'ddnwmwdjv', 'djdrua', 'Uknown', '1998-03-01' +
        ");"));

    // execute INSERT statements for the test case
    assertEquals(1, statement.executeUpdate(
        "INSERT INTO \"person\"(" +
        "  \"id\", \"last_name\", \"first_name\", \"gender\", \"date_of_birth\" +
        ") VALUES (" +
        "  543, '', 'Uknown', '1998-03-01' +
        ");"));
}

@Test
public void test20() throws SQLException {
    // prepare the database state
    assertEquals(1, statement.executeUpdate(
        "INSERT INTO \"person\"(" +
        "  \"id\", \"last_name\", \"first_name\", \"gender\", \"date_of_birth\" +
        ") VALUES (" +
        "  -585, 'ddnwmwdjv', 'djdrua', 'Uknown', '1998-03-01' +
        ");"));

    // execute INSERT statements for the test case
    assertEquals(1, statement.executeUpdate(
        "INSERT INTO \"person\"(" +
        "  \"id\", \"last_name\", \"first_name\", \"gender\", \"date_of_birth\" +
        ") VALUES (" +
        "  -435, 'vjiv', '', 'Male', '1998-03-01' +
        ");"));
}

```

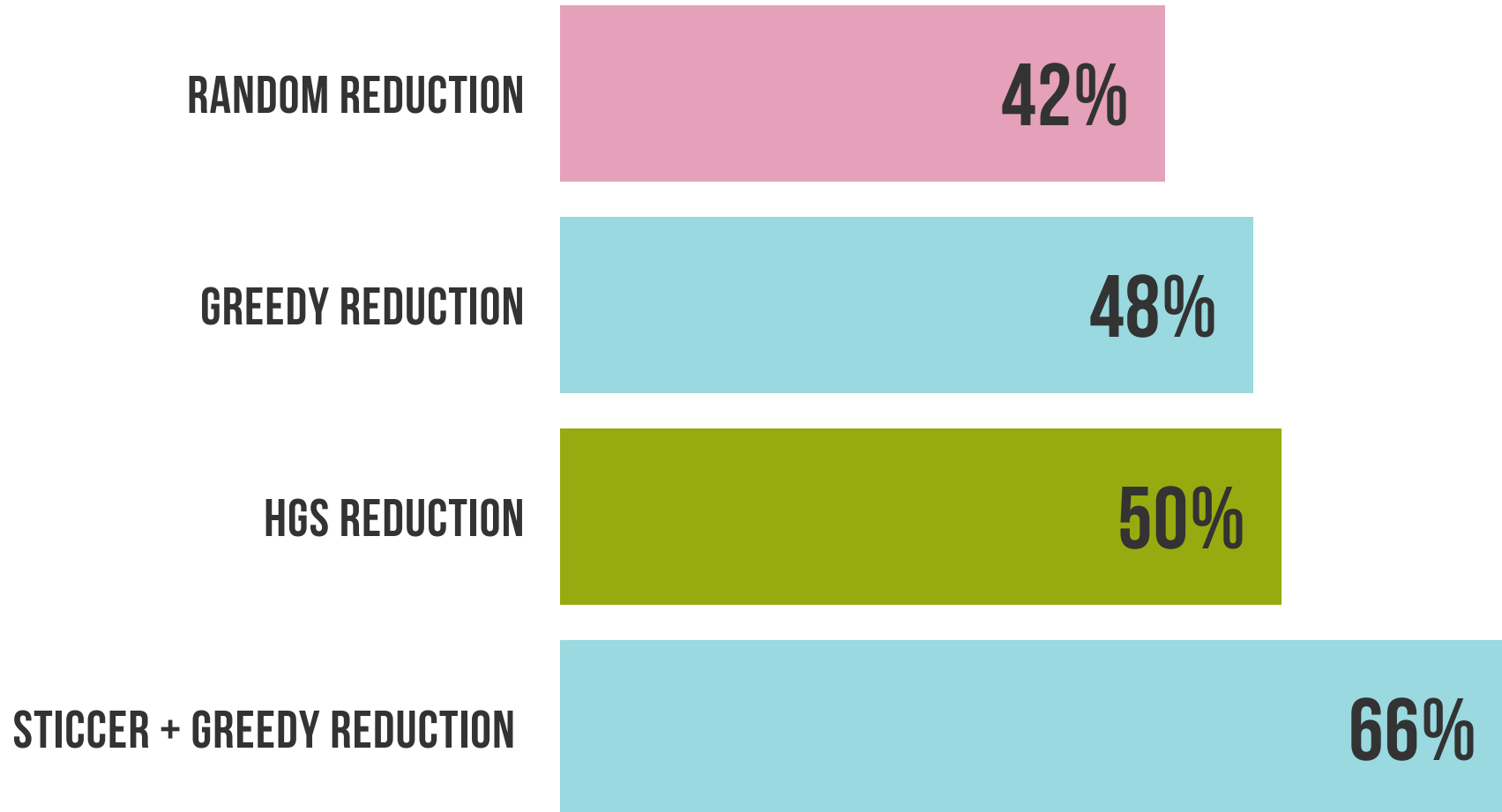






```
1 @Test
2 public void test17() throws SQLException {
3     // prepare the database state
4     assertEquals(1, statement.executeUpdate(
5         "INSERT INTO \"person\"(" +
6         "    \"id\", \"last_name\", \"first_name\", \"gender\", \"date_of_birth\" +
7         ") VALUES (" +
8         "    -585, 'ddnwmwdjv', 'djdrua', 'Uknown', '1998-03-01' +
9         ");"));
10
11     // execute INSERT statements for the test case
12     assertEquals(1, statement.executeUpdate(
13         "INSERT INTO \"person\"(" +
14         "    \"id\", \"last_name\", \"first_name\", \"gender\", \"date_of_birth\" +
15         ") VALUES (" +
16         "    -83, '', 'lvcykqb', 'Female', '2000-01-01' +
17         ");"));
18
19     // execute INSERT statements for the test case
20     assertEquals(1, statement.executeUpdate(
21         "INSERT INTO \"person\"(" +
22         "    \"id\", \"last_name\", \"first_name\", \"gender\", \"date_of_birth\" +
23         ") VALUES (" +
24         "    432, '', 'sknbueyq', 'Uknown', '2007-01-27' +
25         ");"));
26 }
```

# WHAT ABOUT HYBRIDIZING HGS WITH STICCER?



# COMPUTATIONAL STUDY RESEARCH QUESTIONS

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## 1 REDUCTION EFFECTIVENESS.

How does STICCER-HGS compare at reducing test suites to STICCER-GRD, HGS, and Greedy?

## 2 FAULT FINDING CAPABILITY.

Fault-finding capability of test suites reduced by STICCER-HGS compare to those reduced by STICCER-GRD, HGS, and Greedy

## 3 REDUCTION AND MUTATION ANALYSIS RUNTIME.

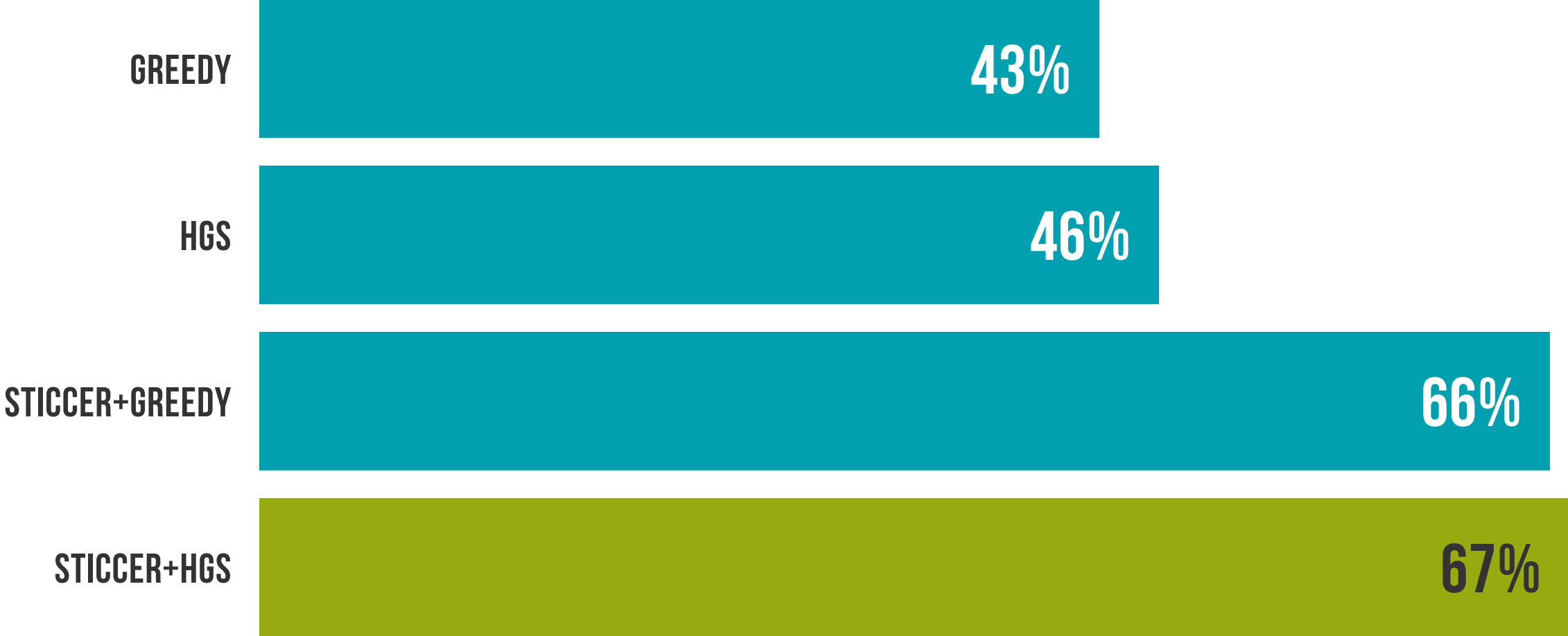
Comparing STICCER-HGS and STICCER-GREEDY reduction and mutation analysis timing.

# COMPUTATIONAL METHODOLOGY

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- 1** 34 RELATIONAL DATABASE SCHEMAS
- 2** TWO TEST DATA GENERATION - AVM-DEFAULTS & DOMINO
- 3** DBMS: SQLITE
- 4** MUTATION ANALYSIS - ADDING, REMOVING, AND EXCHANGING INTEGRITY CONSTRAINTS
- 5** RECORDED COVERAGE, REDUCTION AND MUTATION TIME, AND MUTATION SCORES
- 6** COMPARED GREEDY, HGS, STICGER+GREEDY, AND STICGER+HGS REDUCTION METHODS

# RQ 1: REDUCTION EFFECTIVENESS - NUMBER OF TESTS

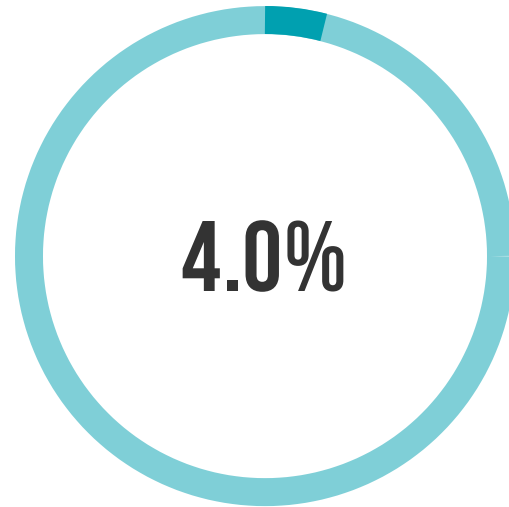


# RQ 1: REDUCTION EFFECTIVENESS - NUMBER OF INSERTS



## RQ2: FAULT FINDING CAPABILITY - DETECTION DIFFERENCE

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### STICCER+HGS

AVM-D-generated suites did incur decreased scores, but only for *seven* schemas and not > 4%

## RQ3: REDUCTION AND MUTATION ANALYSIS RUNTIME

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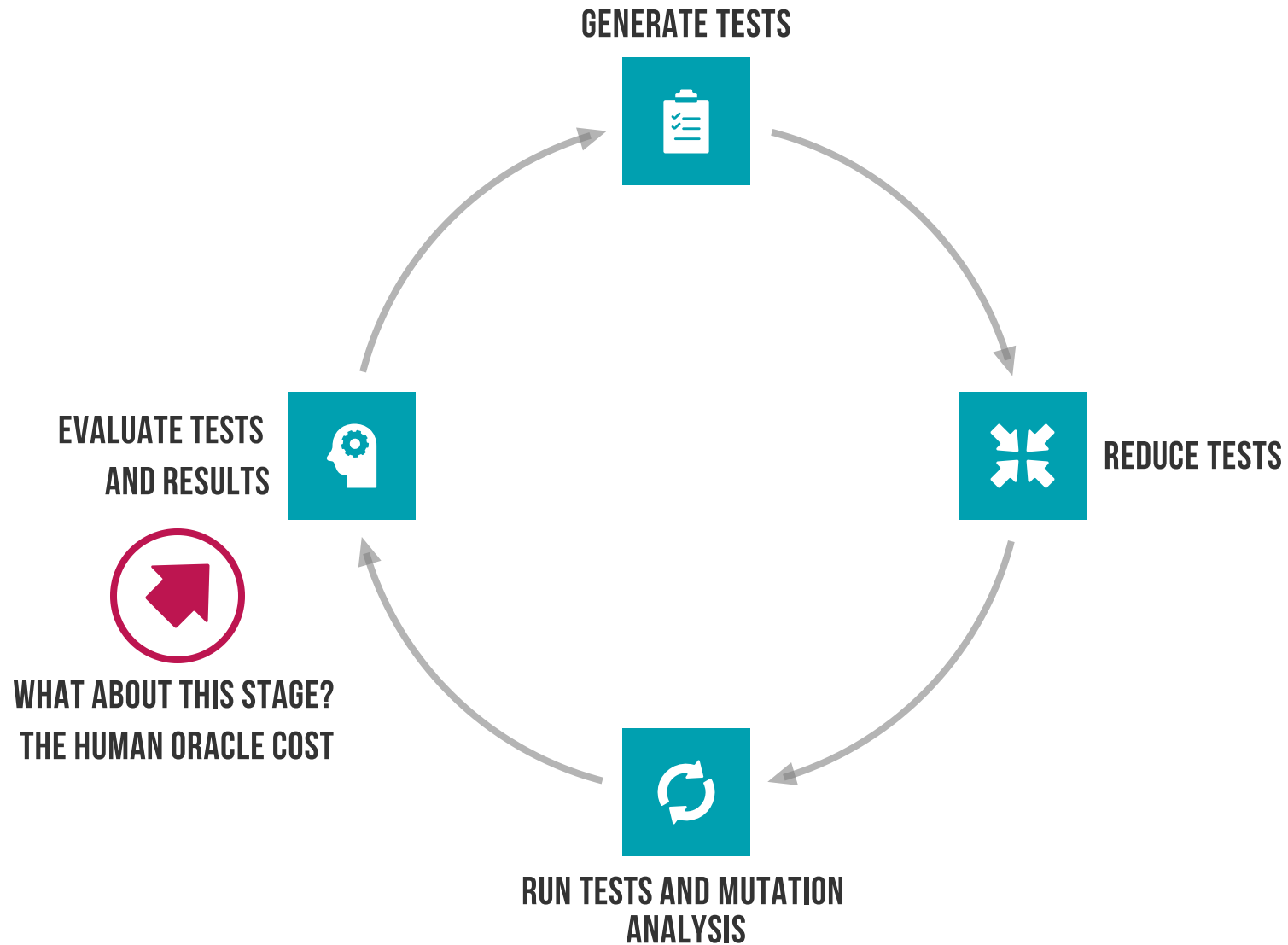
1 STICCER+HGS IS MUCH FASTER FOR SMALLER SCHEMAS

2 STICCER+GREEDY IS FASTER WITH LARGER SCHEMAS

3 GREEDY (2 MIN) IS MUCH FASTER THAN HGS (11 MIN) SAVING MINUTES



# AUTOMATICALLY GENERATING TESTS



## HGS REDUCED TEST SUITE



```
@Test
public void test17() throws SQLException {

    // prepare the database state
    assertEquals(1, statement.executeUpdate(
        "INSERT INTO `person`(" +
        "  `id`, `last_name`, `first_name`, `gender`, `date_of_birth`" +
        ") VALUES (" +
        "  -585, 'ddnwmwdjv', 'djdrua', 'Uknown', '1998-03-01'" +
        ");"));

    // execute INSERT statements for the test case
    assertEquals(1, statement.executeUpdate(
```

## STICCER+HGS = MERGED TEST SUITE



```
@Test
public void test17() throws SQLException {
    // prepare the database state
    assertEquals(1, statement.executeUpdate(
        "INSERT INTO `person`(" +
        "  `id`, `last_name`, `first_name`, `gender`, `date_of_birth`" +
```

# CAN HUMAN TESTERS EFFECTIVELY INSPECT REDUCED VERSIONS OF AUTOMATICALLY GENERATED SQL TEST SUITES?

```
@Test
public void test18() throws SQLException {

    // prepare the database state
    assertEquals(1, statement.executeUpdate(
        "INSERT INTO `person`(" +
        "  `id`, `last_name`, `first_name`, `gender`, `date_of_birth`" +
        ") VALUES (" +
        "  -585, 'ddnwmwdjv', 'djdrua', 'Uknown', '1998-03-01'" +
        ");"));

    // execute INSERT statements for the test case
    assertEquals(1, statement.executeUpdate(
        "INSERT INTO `person`(" +
        "  `id`, `last_name`, `first_name`, `gender`, `date_of_birth`" +
        ") VALUES (" +
        "  432, '', 'sknbueyq', 'Uknown', '2007-01-27'" +
        ");"));
}
```

```
) VALUES (" +
    "  -83, '', 'lvcykqb', 'Female', '2000-01-01'" +
    ");"));

    // execute INSERT statements for the test case
    assertEquals(1, statement.executeUpdate(
        "INSERT INTO `person`(" +
        "  `id`, `last_name`, `first_name`, `gender`, `date_of_birth`" +
        ") VALUES (" +
        "  432, '', 'sknbueyq', 'Uknown', '2007-01-27'" +
        ");"));
}
```

# HUMAN STUDY RESEARCH QUESTIONS

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1

## TEST INSPECTION ACCURACY

How accurate are humans at inspecting STICCER-HGS test suite compared to HGS?

2

## TEST INSPECTION DURATION

How long does it take for humans to inspect STICCER-HGS test suites compared to HGS?

# HUMAN STUDY METHODOLOGY

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## FOUR SCHEMAS

With seeded-faults to fail many INSERTs



## TWO REDUCTION METHODS

STICCER+HGS & HGS



## TWO TEST DATA GENERATORS

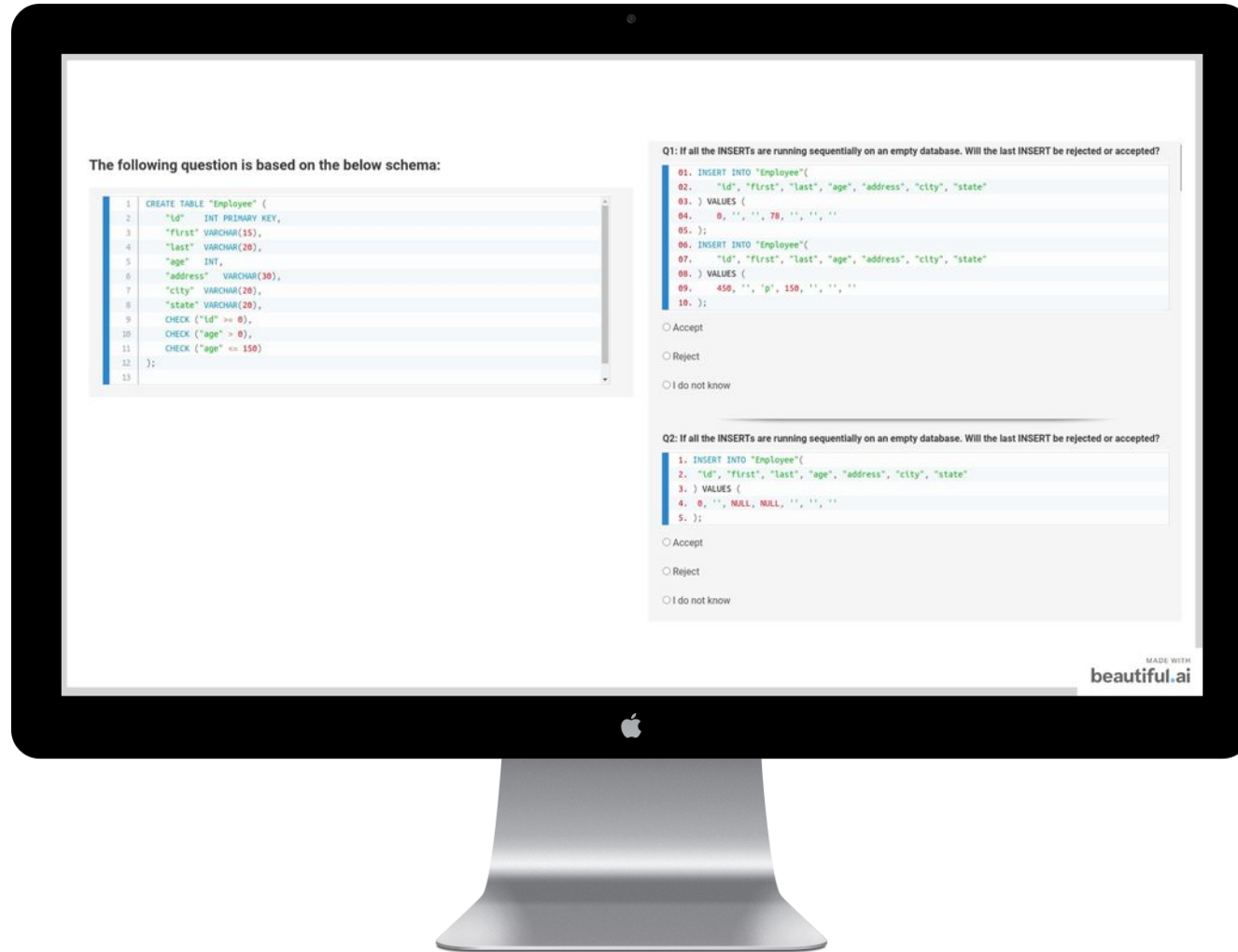
DOMINO (random values) & AVM (default values)



## 25 PARTICIPANTS

Students - Undergrads and PhDs

# WEB-BASED QUESTIONNAIRE



- THE ORIGINAL & NON-FAULTY SCHEMA
- TESTS GENERATED ON THE FAULTY SCHEMA
- PARTICIPANTS ARE ASKED TO SELECT THE REJECTED INSERTS
- WE MEASURED TIMING AND SCORES

# HUMAN STUDY RESULTS



**STICCER-HGS'S ACCURACY GAVE IT NO CLEAR ADVANTAGE**

**PARTICIPANTS WERE FASTER AT INSPECTING THE SMALLER TEST SUITES REDUCED AND MERGED BY STICCER-HGS**

# CONCLUSION & FUTURE WORK

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[github.com/schemaanalyst/schemaanalyst](https://github.com/schemaanalyst/schemaanalyst)

- **COMPUTATIONAL STUDY**

- Neither STICCER-GRD nor STICCER-HGS are a strictly dominant method
- No significant benefit to hybridizing STICCER with HGS instead of Greedy

- **HUMAN STUDY**

- Participants manually inspect reduced test suites and answer questions about their behavior
- Compared HGS to STICCER-HGS
- STICCER-HGS may help humans to perform test inspection faster, but not always more accurately

- **FUTURE WORK**

- Other reduction techniques with STICCER
- Further human study with professionals
- Improve reduction efficiency