



# Property / Fuzz Testing In Apache Cassandra

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# Agenda

Sorry if this is fuzzy...

- Why should you care?
- Anatomy of a Property Test
- What is a Stateful Property
- Role of Bias
- What is a Simulation Property

# Why should you care?

How many edge cases really exist?

- As developers we know all edge cases that could exist, right?
- How one change will interact with all other systems? Right?
- My change is simple!

# Why should you care?

How many edge cases really exist?

```
createTable("CREATE TABLE %s(pk int, v int, PRIMARY KEY(pk))");  
execute("INSERT INTO %s(pk, v) VALUES (?, ?)", 0, 0);  
assertRows(execute("SELECT * FROM %s WHERE pk=?", 0),  
            row(0, 0));
```

# Why should you care?

How many edge cases really exist?

```
createTable("CREATE TABLE %s(pk int, ck int, v int, PRIMARY KEY(pk, ck))");
execute("INSERT INTO %s(pk, ck, v) VALUES (?, ?, ?)", 0, 0, 0);
assertRows(execute("SELECT * FROM %s WHERE pk=?", 0),
            row(0, 0, 0));
```

# Why should you care?

How many edge cases really exist?

```
createTable("CREATE TABLE %s(pk int, ck int, v int, PRIMARY KEY(pk, ck)) WITH CLUSTERING ORDER BY (ck DESC)");  
execute("INSERT INTO %s(pk, ck, v) VALUES (?, ?, ?)", 0, 0, 0);  
assertRows(execute("SELECT * FROM %s WHERE pk=?", 0),  
            row(0, 0, 0));
```

# Why should you care?

How many edge cases really exist?

```
createTable("CREATE TABLE %s(pk text, ck text, v text, PRIMARY KEY(pk, ck)) WITH CLUSTERING ORDER BY (ck DESC)");  
execute("INSERT INTO %s(pk, ck, v) VALUES (?, ?, ?)", "a", "b", "c");  
assertRows(execute("SELECT * FROM %s WHERE pk=?", "a"),  
            row("a", "b", "c"));
```

# Why should you care?

How many edge cases really exist?

- We covered every case right? We know this is working...
- ...
- Its working?



# Why should you care?

How many edge cases really exist?

```
schemaChange(format("CREATE TYPE %s.test5 (a int)", KEYSPACE));
String name = createTableName(null);
String fq = format("%s.%s", KEYSPACE, name);
createTable(format("CREATE TABLE %s(pk int, ck frozen<%s.test5>, v int, PRIMARY KEY(pk, ck)) WITH CLUSTERING ORDER
BY (ck DESC)", fq, KEYSPACE));
execute(format("INSERT INTO %s(pk, ck, v) VALUES (?, ?, ?)", fq), 0, tuple(0), 0);
assertRows(execute(format("SELECT * FROM %s WHERE pk=?", fq), 0),
            row(0, tuple(0), 0));
```

# Why should you care?

How many edge cases really exist?

```
schemaChange(format("CREATE TYPE %s.test5 (a int)", KEYSPACE));
String name = createTableName(null);
String fq = format("%s.%s", KEYSPACE, name);
createTable(format("CREATE TABLE %s(pk int, ck frozen<%s.test5>, v int, PRIMARY KEY(pk, ck)) WITH CLUSTERING ORDER
BY (ck DESC)", fq, KEYSPACE));
execute(format("INSERT INTO %s(pk, ck, v) VALUES (?, {a: 0}, ?)", fq), 0, 0);
assertRows(execute(format("SELECT * FROM %s WHERE pk=?", fq), 0),
    row(0, tuple(0), 0));
```

```
▼ ! DemoTest (org.apache.cas 598 ms)
    ! test5 598ms
```

```
org.apache.cassandra.exceptions.InvalidRequestException: Invalid user type literal for ck of type frozen<test5>
at org.apache.cassandra.cql3.terms.UserTypes$Literal.validateAssignableTo(UserTypes.java:175)
at org.apache.cassandra.cql3.terms.UserTypes$Literal.prepare(UserTypes.java:137)
at org.apache.cassandra.cql3.terms.Terms$Raw$2.prepare(Terms.java:280)
```

# Why should you care?

How many edge cases really exist?

- Clearly that was the last edge case right?
- ...
- Right?

# Why should you care?

How many edge cases really exist?

```
BigInteger pk = BigInteger.valueOf(-42 + -42);
BigInteger ck = BigInteger.valueOf(42 + 42);
BigInteger v = BigInteger.valueOf(-8200 + -16990);
createTable("CREATE TABLE %s(pk varint, ck varint, v varint, PRIMARY KEY(pk, ck))");
execute("INSERT INTO %s(pk, ck, v) VALUES (-42 + -42, 42 + 42, -8200 + -16990)");
assertRows(execute("SELECT * FROM %s"),
            row(pk, ck, v));

assertRows(execute("SELECT * FROM %s WHERE pk=?", pk),
            row(pk, ck, v));
```

```
java.lang.AssertionError: Got less rows than expected. Expected 1 but got 0
    at org.junit.Assert.fail(Assert.java:88)
    at org.junit.Assert.assertTrue(Assert.java:41)
    at org.apache.cassandra.cql3.CQLTester.assertRows(CQLTester.java:2018)
```

# Why should you care?

How many edge cases really exist?

```
BigInteger pk = BigInteger.valueOf(59463118).multiply(BigInteger.valueOf(-2171));
BigInteger ck = pk;
BigInteger v = pk;
createTable("CREATE TABLE %s(pk varint, ck varint, v varint, PRIMARY KEY(pk, ck))");
execute("INSERT INTO %s(pk, ck, v) VALUES (59463118 * -2171, 59463118 * -2171, 59463118 * -2171)");
assertRows(execute("SELECT * FROM %s"),
            row(pk, ck, v));
```

```
java.lang.AssertionError: Invalid value for row 0 column 0 (pk of type varint), expected <-129094429178> but got
<-245410298>
Invalid value for row 0 column 1 (ck of type varint), expected <-129094429178> but got <-245410298>
Invalid value for row 0 column 2 (v of type varint), expected <-129094429178> but got <-245410298>
```

# How can we do better?

- Accept that we don't know every edge case
- But, we can generate them...
- So... how do we do that?

# Property Testing

# Anatomy of a Property Test

- Source of Randomness
- 1 or more Properties
- Multiple examples
- Reproducible and Replayable
- Generate Data



# Anatomy of a Property Test

## Source of Randomness

```
interface RandomSource {  
    long nextLong(long min, long max);  
}
```

# Anatomy of a Property Test

## A Property

```
RandomSource rs = new DefaultRandom();  
long input = rs.nextLong(0, 100);  
// property  
assertThat(input/input).isEqualTo(1);
```

# Anatomy of a Property Test

A Property



failingProperty()

87 ms

# Anatomy of a Property Test

Look Again

```
RandomSource rs = new DefaultRandom();  
long input = rs.nextLong(0, 100);  
// property  
assertThat(input/input).isEqualTo(1);
```

# Anatomy of a Property Test

## Multiple Examples

```
RandomSource rs = new DefaultRandom();  
for (int i = 0; i < 1000; i++) {  
    long input = rs.nextLong(0, 100);  
    // property  
    assertThat(input/input).isEqualTo(1);  
}
```

# Anatomy of a Property Test

## Multiple Examples

```
▼ ! DemoDeletemeTest (accord 79ms  
  ! failingPropertyV2() 79ms  
    java.lang.ArithmeticException: / by zero  
    at accord.utils.DemoDeletemeTest.failingPropertyV2(DemoDeletemeTest.java:44)
```

# Anatomy of a Property Test

Reproducible and Replayable

```
long seed = 42;
RandomSource rs = new DefaultRandom(seed);
try {
    for (int i = 0; i < 1000; i++) {
        long input = rs.nextLong(0, 100);
        // property
        assertThat(input/input).isEqualTo(1);
    }
} catch (Throwable t) {
    throw new AssertionError("Failing property for seed " + seed, t);
}
```

# Anatomy of a Property Test

Reproducible and Replayable

```
▼ DemoDeletemeTest (accord 87 ms)
  ✖ failingPropertyV3() 87 ms
    java.lang.AssertionError: Failing property for seed 42
      at accord.utils.DemoDeletemeTest.failingPropertyV3(DemoDeletemeTest.java:64) <31 internal lines>
      at java.base/java.util.ArrayList.forEach(ArrayList.java:1541) <9 internal lines>
      at java.base/java.util.ArrayList.forEach(ArrayList.java:1541) <25 internal lines>
    Caused by: java.lang.ArithmeticException: Create breakpoint : / by zero
      at accord.utils.DemoDeletemeTest.failingPropertyV3(DemoDeletemeTest.java:59)
      ... 67 more
```



# Anatomy of a Property Test

## Generate Data

```
Gen<UUID> randomUUID = rs -> {  
    long most = rs.nextLong();  
    most &= 0x0f << 8; /* clear version */  
    most += 0x40 << 8; /* set to version 4 */  
    long least = rs.nextLong();  
    least &= 0x3f1 << 56; /* clear variant */  
    least |= 0x801 << 56; /* set to IETF variant */  
    return new UUID(most, least);  
};
```

```
Gen<InetAddress> ipv4 = rs -> {  
    byte[] bytes = new byte[4];  
    ByteArrayUtil.putInt(bytes, 0, rs.nextInt());  
    return InetAddress.getByAddress(bytes);  
};
```

```
enum Status { Pending, Running, ShuttingDown, Down }  
Gen<Status> statusGen = rs -> {  
    return Status.values()[rs.nextInt(0, Status.values().length)];  
};
```

# Anatomy of a Property Test

## Generate Data: Complex Types

```
Gen<KeyspaceMetadata> ksGen = rs -> {  
    String name = nameGen.next(rs);  
    KeyspaceMetadata.Kind kind = kindGen.next(rs);  
    ReplicationParams replicationParams = replicationGen.next(rs).withKeyspace(nameGen).build().next(rs);  
    boolean durableWrites = durableWritesGen.next(rs);  
    KeyspaceParams params = new KeyspaceParams(durableWrites, replicationParams);  
    Tables tables = tablesGen.next(rs);  
    Views views = viewsGen.next(rs);  
    Types types = typesGen.next(rs);  
    UserFunctions userFunctions = userFuncGen.next(rs);  
    return KeyspaceMetadata.createUnsafe(name, kind, params, tables, views, types, userFunctions);  
};
```

# Anatomy of a Property Test

## Generate Data

- Hundreds of non-Cassandra generators exist today!
- Need an identifier? Generators#IDENTIFIER\_GEN
- Need a DNS domain name? Generators#DNS\_DOMAIN\_NAME
- Need UTF8? Generators#UTF\_8\_GEN
- Time? Generators#TIMESTAMP\_GEN

# Anatomy of a Property Test

## Generate Data

- Hundreds of Cassandra generators exist today!
- Need Types? `AbstractTypeGenerators#typeGen()`
- Need tables? `TableMetadataBuilder#build()`
- Need data for a type? `AbstractTypeGenerators#getTypeSupport`

# Bringing it all together

```
// Create property builder using the "qt" function  
// Allows overriding seed/examples/etc.  
qt()
```

# Bringing it all together

```
// Select the Gen as input to the test  
qt().forAll(Gens.ints().all())
```

# Bringing it all together

```
// Add the test to the builder's "check" method
qt().forAll(Gens.ints().all()).check(value -> {
  assertThat(value / value).isEqualTo(1);
});
```

# Bringing it all together

```
// Add the test to the builder's "check" method
qt().forAll(Gens.ints().all()).check(value -> {
  assertThat(value / value).isEqualTo(1);
});
```

```
accord.utils.Property$PropertyError: Property error detected:
Seed = 3448125481938895569
Examples = 1000
Pure = true
Error: / by zero
Values:
  0 = 0: java.lang.Integer
    at accord.utils.Property$SingleBuilder.checkInternal(Property.java:251)
    at accord.utils.Property$SingleBuilder.check(Property.java:235)
    at org.apache.cassandra.cql3.validation.operations.DemoTest.test7(DemoTest.java:151)
Caused by: java.lang.ArithmeticException: / by zero
    at org.apache.cassandra.cql3.validation.operations.DemoTest.lambda$test7$2(DemoTest.java:152)
    at accord.utils.Property$SingleBuilder.checkInternal(Property.java:247)
... 32 more
```



# Bringing it all together

```
// Rerun the failing case by controlling the seed
qt().withSeed(3448125481938895569L).forAll(Gens.ints().all()).check(value -> {
  assertThat(value / value).isEqualTo(1);
});
```

# Example

## Serialize / Deserialize

```
qt().forAll(token()).check(token -> {  
    var p = token.getPartitioner();  
    var comparable = asComparableBytes(token);  
    Token read = fromComparableBytes(p, comparable);  
    assertThat(read).isEqualTo(token);  
});
```

# Example

## Serialize / Deserialize Continued

```
DataOutputStream output = new DataOutputStream();
qt().forAll(token()).check(token -> {
    for (MessagingService.Version version : supportedVersions())
        // see IVersionedSerializers.testSerde
        testSerde(output, Token.compactSerializer, token, version.value);
});
```

# Example

Write / Read

```
createTable("CREATE TABLE %s(pk int, v int, PRIMARY KEY(pk))");
execute("INSERT INTO %s(pk, v) VALUES (?, ?)", 0, 0);
assertRows(execute("SELECT * FROM %s WHERE pk=?", 0),
            row(0, 0));
```

# Example

Write / Read

```
qt().check(rs -> {  
  TableMetadata metadata = createTable(rs, createKeyspace(rs).name);  
  Mutation mutation = createMutation(rs, metadata);  
  execute(mutation);  
  
  Select select = select(mutation);  
  assertRows(execute(select),  
             rows(mutation));  
});
```

# Stateful Property

# Stateful Property

- Just a property that has... state
- Commonly represented with a “model”
- Don't be scared... they don't bite!

# Example

## Create / Read / Update / Delete

```
enum Action { Create, Read, Update, Delete }
Gen<Action> ACTION_GEN = Gens.enums().all(Action.class);
qt().check(rs -> {
    TreeMap<Integer, Integer> model = new TreeMap<>();
    RangeTree<Integer, Integer, Integer> tree = intTree();
    for (int i = 0; i < 1000; i++) {
        Gen<Action> actionGen = model.isEmpty() ? constant(Action.Create) : ACTION_GEN;
        switch (actionGen.next(rs)) {
            case Create: doCreate(rs, model, tree); break;
            case Read:   doRead(rs, model, tree); break;
            case Update: doUpdate(rs, model, tree); break;
            case Delete: doDelete(rs, model, tree); break;
        }
    }
});
```



# Example

## Create / Read / Update / Delete

```
void doCreate(RandomSource rs, TreeMap<Integer, Integer> model, RangeTree<Integer, Integer, Integer> tree) {
    int key = rs.nextInt();
    while (model.containsKey(key))
        key = rs.nextInt();
    int value = rs.nextInt();
    model.put(key, value);
    tree.add(key, value);
    assertEquals(tree.size(), model.size());
}

void doRead(RandomSource rs, TreeMap<Integer, Integer> model, RangeTree<Integer, Integer, Integer> tree) {
    int key = rs.pick(model.keySet());
    int expected = model.get(key);
    assertEquals(tree.get(key), Arrays.asList(expected));
}
```

# Example

## SAI Index

```
protected void test(AbstractType<?> type, Gen<Gen<ByteBuffer>> distribution) {
    createTable("CREATE TABLE %s (pk int PRIMARY KEY, value " + type.asCQL3Type() + ')');
    createIndex("CREATE INDEX ON %s(value) USING 'sai'");
    qt().check(rs -> {
        truncateTable();
        Gen<ByteBuffer> gen = distribution.next(rs);
        Map<ByteBuffer, IntArrayList> termIndex = new TreeMap<>();

        for (int i = 0; i < 1000; i++) {
            ByteBuffer term = gen.next(rs);
            execute("INSERT INTO %s (pk, value) VALUES (?, ?)", i, term);
            termIndex.computeIfAbsent(term, ignore -> new IntArrayList()).addInt(i);
        }

        for (var e : termIndex.entrySet()) {
            ByteBuffer term = e.getKey();
            var expected = e.getValue();
            assertEquals(execute("SELECT pk, value FROM %s WHERE value=?", term), expected);
        }
    });
}
```

# Bias

# Why Add Bias?

- Most types have a large domain and/or similar values
  - If you work with 1, you likely work with 2... but do you work with -1? 0?
- Relationships between data might not be visible without explicit bias
  - ipv4 can convert to ipv6; both addresses are equal... just not in C\*
- Edge cases are unlikely

# Back to RangeTree

Devils in the details...

- When small, basically a List
- Once it grows larger, it “splits”

# Back to RangeTree

Devils in the details...

```
enum Action { Create, Read, Update, Delete }
Gen<Action> ACTION_GEN = Gens.enums().all(Action.class);
qt().check(rs -> {
    TreeMap<Integer, Integer> model = new TreeMap<>();
    RangeTree<Integer, Integer, Integer> tree = intTree();
    for (int i = 0; i < 1000; i++) {
        Gen<Action> actionGen = model.isEmpty() ? constant(Action.Create) : ACTION_GEN;
        switch (actionGen.next(rs)) {
            case Create: doCreate(rs, model, tree); break;
            case Read:   doRead(rs, model, tree); break;
            case Update: doUpdate(rs, model, tree); break;
            case Delete: doDelete(rs, model, tree); break;
        }
    }
});
```

# Back to RangeTree

Devils in the details...

```
enum Action { Create, Read, Update, Delete }
Gen<Gen<Action>> ACTION_GEN = Gens.enums().allMixedDistribution(Action.class);
qt().check(rs -> {
    Gen<Action> gen = ACTION_GEN.next(rs);
    TreeMap<Integer, Integer> model = new TreeMap<>();
    RangeTree<Integer, Integer, Integer> tree = intTree();
    for (int i = 0; i < 1000; i++) {
        Gen<Action> actionGen = model.isEmpty() ? constant(Action.Create) : gen;
        switch (actionGen.next(rs)) {
            case Create: doCreate(rs, model, tree); break;
            case Read:   doRead(rs, model, tree); break;
            case Update: doUpdate(rs, model, tree); break;
            case Delete: doDelete(rs, model, tree); break;
        }
    }
});
```

# INET Type

Equals isn't always Equals...

- Supports IPV4 and IPV6
- IPV4 can convert to IPV6
  - IPV6 address is the same as the IPV4 address; they are functionally equal!



# INET Type

Equals isn't always Equals...

```
@Test
public void ipv4overlap() {
    test(InetAddressType.instance, rs -> {
        var uniqueIpv4 = Gens.lists(ipv4)
            .unique()
            .ofSizeBetween(5, 100)
            .next(rs);

        var uniqueIpv4AsIpv6 = uniqueIpv4.stream()
            .map(this::mapIpv4ToIpv6)
            .collect(Collectors.toList());

        return r -> r.pick(r.nextBoolean() ? uniqueIpv4 : uniqueIpv4AsIpv6);
    });
}
```

# INET Type

Equals isn't always Equals...

```
protected void test(AbstractType<?> type, Gen<Gen<ByteBuffer>> distribution) {
    createTable("CREATE TABLE %s (pk int PRIMARY KEY, value " + type.asCQL3Type() + ')');
    createIndex("CREATE INDEX ON %s(value) USING 'sai'");
    qt().check(rs -> {
        truncateTable();
        Gen<ByteBuffer> gen = distribution.next(rs);
        Map<ByteBuffer, IntArrayList> termIndex = new TreeMap<>();

        for (int i = 0; i < 1000; i++) {
            ByteBuffer term = gen.next(rs);
            execute("INSERT INTO %s (pk, value) VALUES (?, ?)", i, term);
            termIndex.computeIfAbsent(term, ignore -> new IntArrayList()).addInt(i);
        }

        for (var e : termIndex.entrySet()) {
            ByteBuffer term = e.getKey();
            var expected = e.getValue();
            assertEquals(execute("SELECT pk, value FROM %s WHERE value=?", term), expected);
        }
    });
}
```

# Bringing it all together

Stateful edition

```
stateful()
```

# Bringing it all together

Stateful edition

```
stateful()  
  .check(commands(() -> State::new, Sut::new)  
    ...  
    .build());
```

# Bringing it all together

## Stateful edition

```
stateful()  
.check(commands(() -> State::new, Sut::new)  
  .add(this::create)  
  .add(this::read)  
  .add(this::readByKey)  
  .add(this::readByRange)  
  .add(Iterate.instance)  
  .add(Clear.instance)  
  .addAllIf(state -> !state.isEmpty(),  
    b -> b.add(this::readExisting)  
      .add(this::readKeyFromRangeExisting)  
      .add(this::readRangeExisting)  
      .add(this::updateExisting)  
      .add(this::delete))  
.build());
```

# Bringing it all together

## Stateful edition

```
record RangeRead(Range range) implements Command<State, Sut, Result> {
    @Override
    public Result apply(State state) {
        return state.scan(range);
    }
    @Override
    public Result run(Sut sut) {
        return sut.tree.search(range);
    }
    @Override
    public String detailed(State state) {
        return "Range Read(" + range + ")";
    }
    @Override
    public void checkPostconditions(State state, Result expected,
                                    Sut sut, Result actual) {
        assertThat(actual).isEqualTo(expected);
    }
}
```

# Bringing it all together

## Stateful edition

```
accord.utils.Property$PropertyError: Property error detected:
Seed = 3448148273639475646
Examples = 500
Pure = true
Error:

    expected: []
    but was: [(37492,37803)=5]
Steps: 1000
Values:
State: State{sizeTarget=389, numChildren=5}: StatefulRangeTreeTest.State
History:
    1: Create((14490,14554], 0)
    2: Token Read(46197)
    3: Clear(size=1)
    4: Create((37492,37803], 5)
    5: Range Read((37492,37803])

Expected :[]
Actual   :[(37492,37803)=5]
<Click to see difference>
    at StatefulRangeTreeTest.test(StatefulRangeTreeTest.java:72)

Caused by: org.opentest4j.AssertionFailedError:
expected: []
but was: [(37492,37803)=5]
    at StatefulRangeTreeTest$RangeRead.checkPostconditions(StatefulRangeTreeTest.java:188)
    at StatefulRangeTreeTest$RangeRead.checkPostconditions(StatefulRangeTreeTest.java:173)
```

# Simulation Property



# Simulation Property

- The test controlling running of one or more systems
  - Thread scheduling, message delivery, time, etc.
- Can simulate as much as you need, or as little
  - Need all of Cassandra? The Simulator is your friend
  - Need just messaging? Thread scheduling? There are cheaper options

# Simulation Property

## Repair Happy Path

```
qt().check(rs -> {  
    // creates a multi-node C* mock cluster with simulated threads/messaging  
    Cluster cluster = new Cluster(rs);  
    for (int example = 0; example < 100; example++) {  
        Cluster.Node coordinator = cluster.nextCoordinator(rs);  
        RepairCoordinator repair = coordinator.repair(repairOption(rs, coordinator));  
        // start the repair, this enqueues threads/messages  
        repair.run();  
        cluster.processAll(); // simulate all tasks until done  
        assertSuccess(repair);  
    }  
});
```

# Simulation Property

## How is this done?

- Simulator changed many core systems to be interfaces...
- ExecutorFactory - interface for creating threads
  - SimulatedExecutorFactory enqueues all work into a PriorityQueue
- Clock - interface for accessing wall-time and progress ticks
  - SimulatedExecutorFactory defines time as the progress of work
- MessageDelivery - interface for sending internode messages
  - SimulatedMessageDelivery allows running with and without faults
- File - path within a FileSystem (interface) for disk access
  - ListenableFileSystem adds pre/post callbacks to all FileSystem methods

# Simulation Property

## Repair Happy Path

```
Cluster(RandomSource rs) {
    this.globalExecutor = new SimulatedExecutorFactory(rs.fork());
    IPartitioner partitioner = PARTITIONER_GEN.next(rs);
    this.tokenGen = CassandraGenerators.token(partitioner)
        .filter(t -> !tokens.contains(t));

    int numTokens = NUM_TOKEN_GEN.nextInt(rs);
    int numNodes = NUM_NODE_GEN.nextInt(rs);
    for (int i = 0; i < numNodes; i++) {
        InetAddressAndPort address = addressGen.next(rs);
        List<Token> tokens = Gens.lists(tokenGen)
            .unique()
            .ofSize(numTokens).next(rs);
        Node node = new Node(address, tokens, new Messaging(address))
        this.nodes.put(node.address, node);
    }
}
```

# Simulation Property

## Repair Happy Path

```
private class Messaging extends SimulatedMessageDelivery {
  private Messaging(InetAddressAndPort address) {
    super(address,
      Cluster.this::action, // What we can do to the msg: DELIVER/DROP
      SimulatedMessageDelivery.randomDelay(rs.fork()),
      (to, message) -> unorderedScheduled.execute(() -> nodes.get(to).receiver.receive(message)),
      unorderedScheduled::schedule,
      failures::add);
  }
}
```

# Faulty Simulation!

Why be happy when we can live with chaos?

- Scheduling
  - Can vary the delay between tasks, including short/long delays
  - Change ordering
- Messaging
  - Partition, Drop, and Delay messages
- Disk
  - Read-only, corrupt, delay

# Simulation Property

## Repair Slow Messages

```
qt().check(rs -> {
  // creates a multi-node C* mock cluster with simulated threads/messaging
  Cluster cluster = new Cluster(rs);
  enableMessageFaults(cluster);
  for (int example = 0; example < 100; example++) {
    Cluster.Node coordinator = cluster.nextCoordinator(rs);
    RepairCoordinator repair = coordinator.repair(repairOption(rs, coordinator));
    // start the repair, this enqueues threads/messages
    repair.run();
    cluster.processAll(); // simulate all tasks until done
    assertSuccess(repair);
  }
});
```

# Simulation Property

## Failed Repair Stages

```
qt().check(rs -> {
  // creates a multi-node C* mock cluster with simulated threads/messaging
  Cluster cluster = new Cluster(rs);
  enableMessageFaults(cluster);
  for (int example = 0; example < 100; example++) {
    Cluster.Node coordinator = cluster.nextCoordinator(rs);
    RepairCoordinator repair = coordinator.repair(repairOption(rs, coordinator));
    // start the repair, this enqueues threads/messages
    repair.run();
    InetAddressAndPort failingAddress = rs.pick(repair.participants);
    // adds repair specific faults in the different stages
    enableRepairFaults(failingAddress);
    cluster.processAll(); // simulate all tasks until done
    assertFailedassertSuccess(repair);
  }
});
```



# Closing remarks

- Not starting from scratch
  - a ton of resources already exist to help you
- You can replace your tests with property tests; it is not that scary
- Tests can evolve and grow with the system; not static snapshots
- “Model” isn’t scary... 80/20!

Q & A