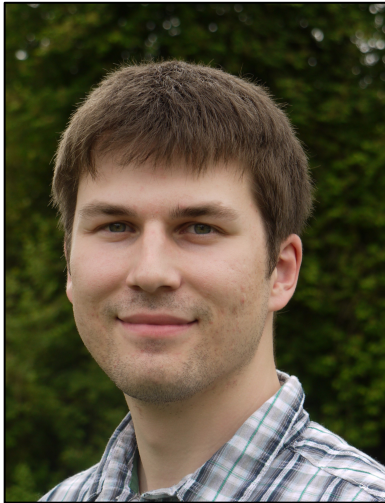


Mining Build Changes to Automatically Repair Build Breakage



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Motivation

Motivation



Motivation



Jenkins



Travis CI

Motivation



Jenkins



Travis CI

- Teams gather immediate feedback on changes
- Improve productivity



**“there’s
no such thing
as a free
lunch.”**

Motivation

- CI Trade-offs
 - Increase of maintenance
- Includes maintenance of build specifications
- Neglected maintenance
 - Build breakage



Motivation

- Developers need to fix the breakage
→ blocked
- Large SW company
 - 900 man hours fixing build breakage



Motivation

- Build Breakage
 - Tests
 - Compiling
 - Dependencies
- Reports of dependency-related breakage
 - 39% - 65%

H. Seo et al., "Programmers' build errors: a case study (at google)", ICSE 2014
M. Sulir et al., "A quantitative study of Java software buildability", *PLATEAU* 2016,
M. Tufano et al., "There and back again: Can you compile that snapshot? ", JSS vol 29/4, 2017

How to repair?



Research Questions

Research Questions

(RQ1)
Strategies?



**How do developers repair
dependency-related build
breakage?**

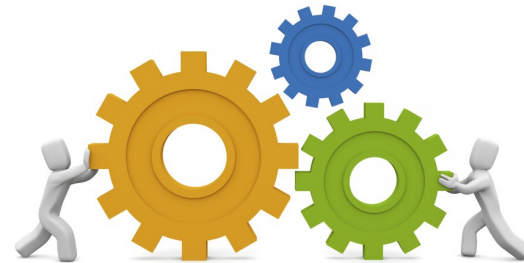
Research Questions

(RQ1) Strategies?



**How do developers repair
dependency-related build
breakage?**

(RQ2) Automation?

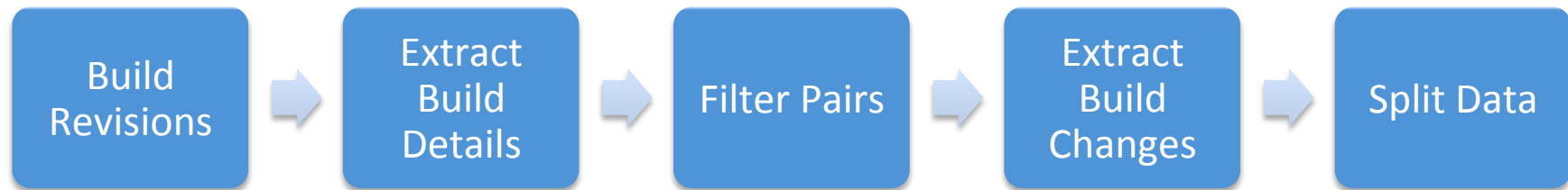


**To what extent can we
automatically repair
dependency-related build
breakage?**

Data Preparation – Projects

- GitHub projects (top-1000 stars)
 - Maven
 - >500 commits
 - actively developed
 - build without manual setup/intervention
- → 23 projects
 - different sizes, vendors, and purposes

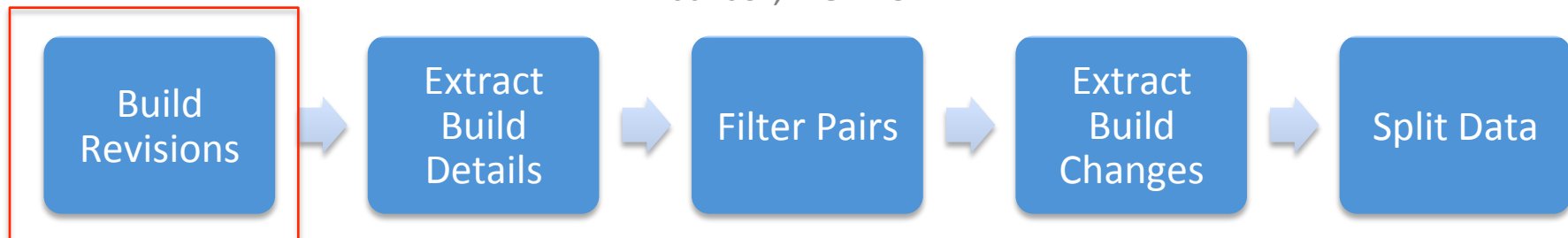
Data Preparation – Process



Data Preparation – Build Revisions

- December 2014 > commit date > July 2017
- Mitigate ecosystem-related build failures
- But TravisTorrent?
- Yes – but
 - Build results can be unreliable
 - Depend on the environment
- → Build in our environment

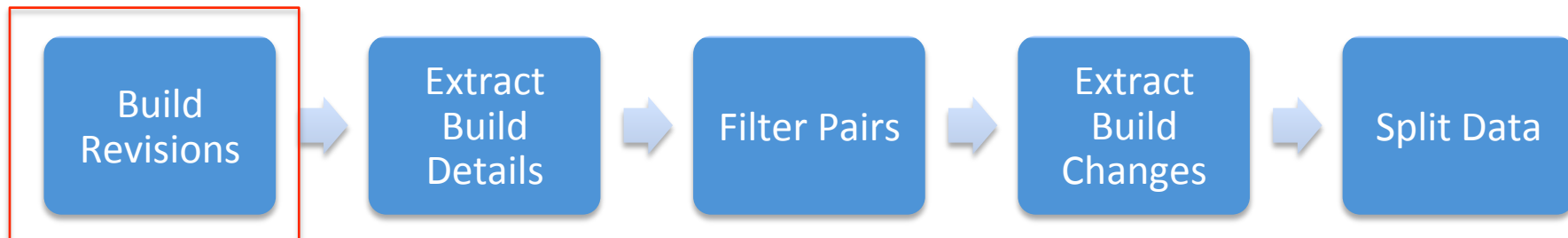
M. Zolfagharinia et al., "Do not trust build results at face value: an empirical study of 30 million CPAN builds", MSR 2017



Data Preparation – Build Revisions

- `mvn -U clean package -DskipTest=true`
 - Force check for update
 - Ignore tests → focus on build errors

```
[INFO] hazelcast-jca-rar ..... SKIPPED
[INFO] hazelcast-build-utils ..... SKIPPED
[INFO] -----
[INFO] BUILD FAILURE
[INFO] -----
[INFO] Total time: 11.363 s
[INFO] Finished at: 2017-07-07T03:29:37+02:00
[INFO] Final Memory: 41M/1441M
[INFO] -----
```



Data Preparation – Build Details

- MavenLogAnalyzer (MLA)
- Build result taxonomy

SUCCESS
DEPENDENCY_RESOLUTION_FAILED
TEST_EXECUTION_FAILED
COMPILATION_FAILED



Data Preparation – Build Details

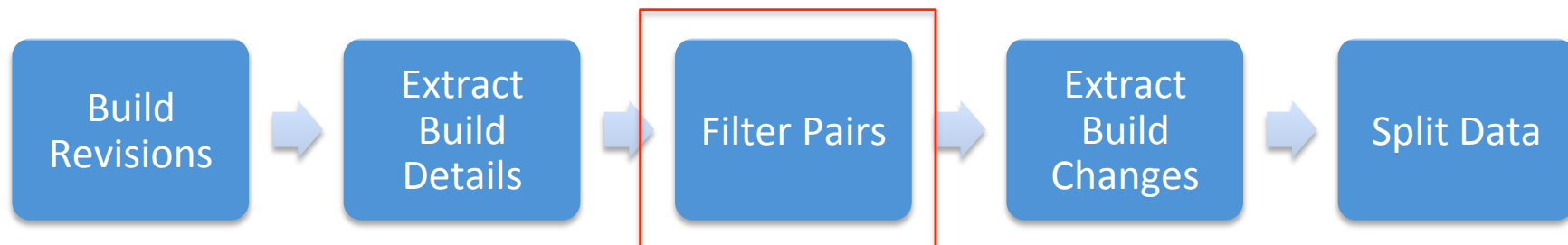
- MavenLogAnalyzer (MLA)
- Build result taxonomy

SUCCESS
DEPENDENCY_RESOLUTION_FAILED
TEST_EXECUTION_FAILED
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Data Preparation – Filter Pairs

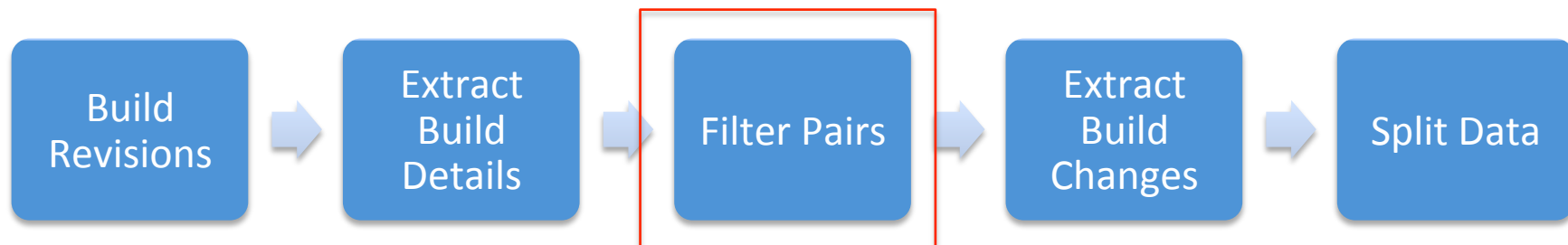
Old Commit ID	Old Build Result	New Commit ID	New Build Result
a34b2ad	DEP_FAILED	ef8ad8c	SUCCESS
...	TEST_FAILED	...	TEST_FAILED
...	DEP_FAILED	...	DEP_FAILED
...	SUCCESS	...	DEP_FAILED
...	DEP_FAILED	...	SUCCESS



Data Preparation – Filter Pairs

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a34b2ad	DEP_FAILED	ef8ad8c	SUCCESS
...	TEST_FAILED	...	TEST_FAILED
...	DEP_FAILED	...	DEP_FAILED
...	SUCCESS	...	DEP_FAILED
...	DEP_FAILED	...	SUCCESS

→ Filter repairing commits

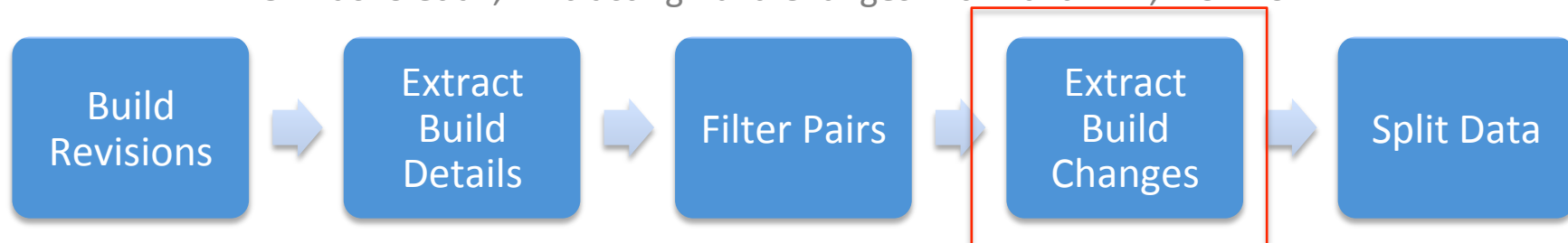


Data Preparation – Build Changes

- BuildDiff
 - Transform `pom.xml` into two trees
 - Extend GumTree algorithm
 - Only match nodes of same type (e.g. dependency)
 - Maven triplet (`groupId`, `artifactId`, `version`)
 - Use `Id` tag
 - Levenshtein similarity $> t$ (best: $t = 0.65$)
 - Output: edit operations (add/del/upd/mv)

J.-R. Falleri et al., "Fine-grained and accurate source code differencing", ASE 2014

C. Macho et al., "Extracting Build Changes with BuildDiff", MSR 2017



Data Preparation – Build Changes

- Map changes
 - Edit operation → Build Change and Build Change Category (Taxonomy, available online)



Taxonomy - Example

```
<dependency>  
  <groupId>org.springframework</groupId>  
  <artifactId>spring-core</artifactId>  
  <version>4.2.5.RELEASE</version>  
</dependency>
```

```
<dependency>  
  <groupId>org.springframework</groupId>  
  <artifactId>spring-core</artifactId>  
  <version>4.2.6.RELEASE</version>  
</dependency>
```

Taxonomy - Example

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  <version>4.2.5.RELEASE</version>  
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</dependency>
```

Taxonomy - Example

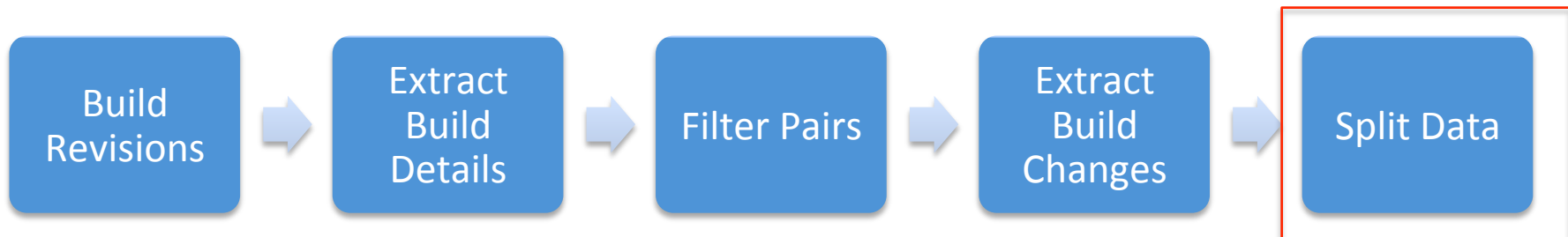
```
<dependency>  
  <groupId>org.springframework</groupId>  
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  <version>4.2.5.RELEASE</version>  
</dependency>
```

DEPENDENCY_VERSION_UPDATE

```
<dependency>  
  <groupId>org.springframework</groupId>  
  <artifactId>spring-core</artifactId>  
  <version>4.2.6.RELEASE</version>  
</dependency>
```

Data Preparation – Build Changes

- 2 research questions
 - 30/70 data split
 - 37 pairs (RQ1) / 88 pairs (RQ2)



Research Questions

(RQ1) Strategies?



**How do developers repair
dependency-related build
breakage?**

(RQ2) Automation?

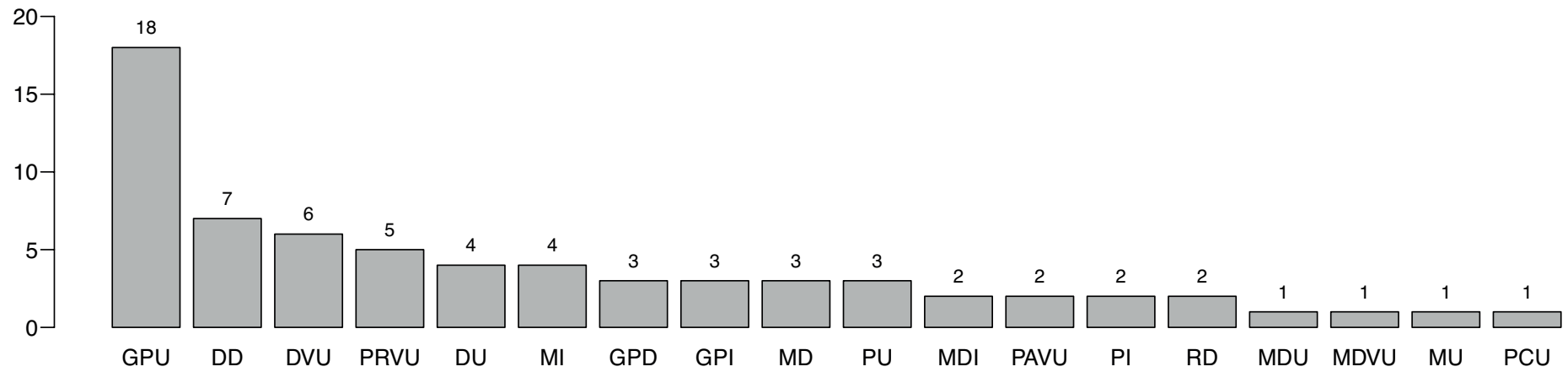


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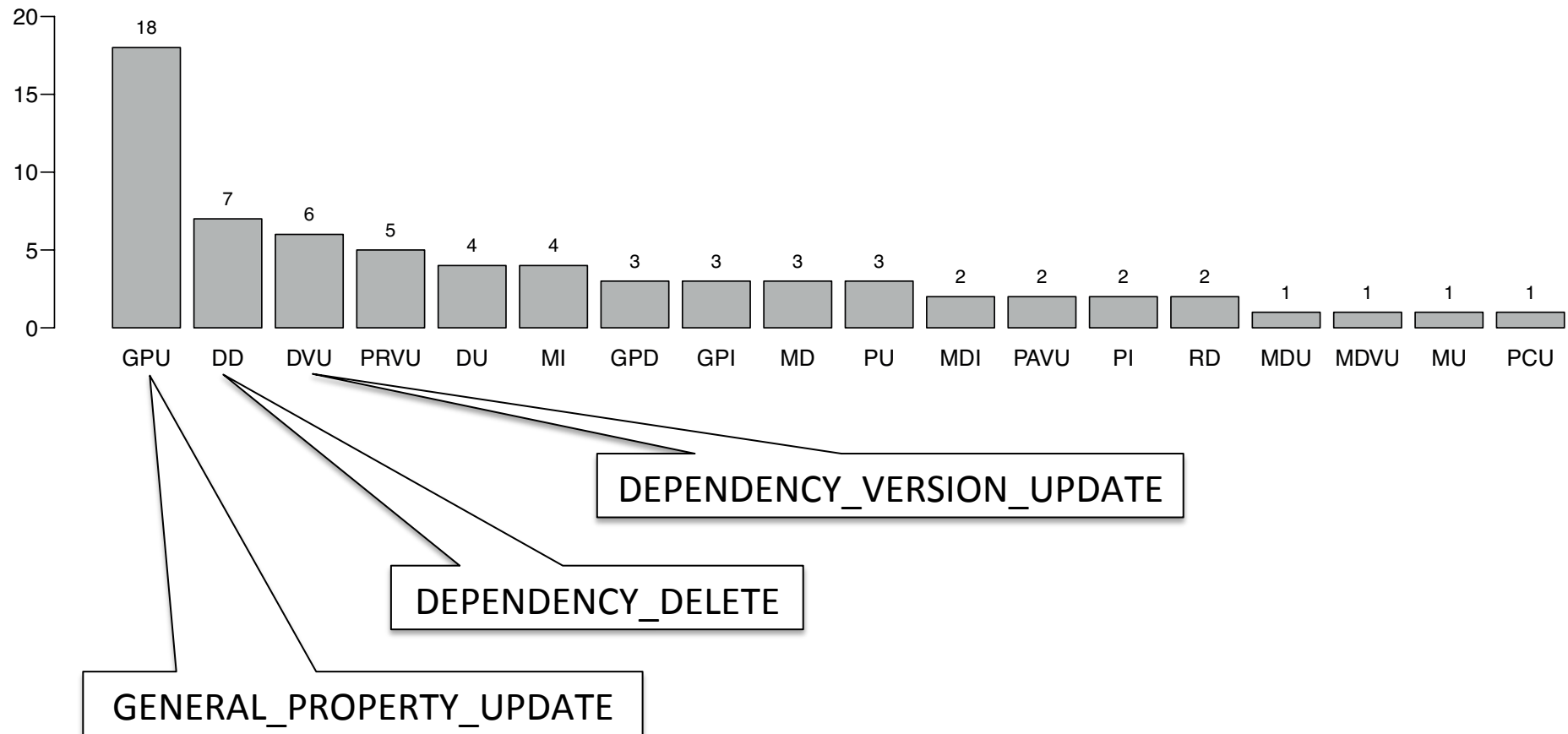
Approach

- Quantitative Analysis
 - Frequency of build changes (categories) involved in repairing pairs
 - Number of revisions
 - Categories according to the purpose of the change (e.g., property change)

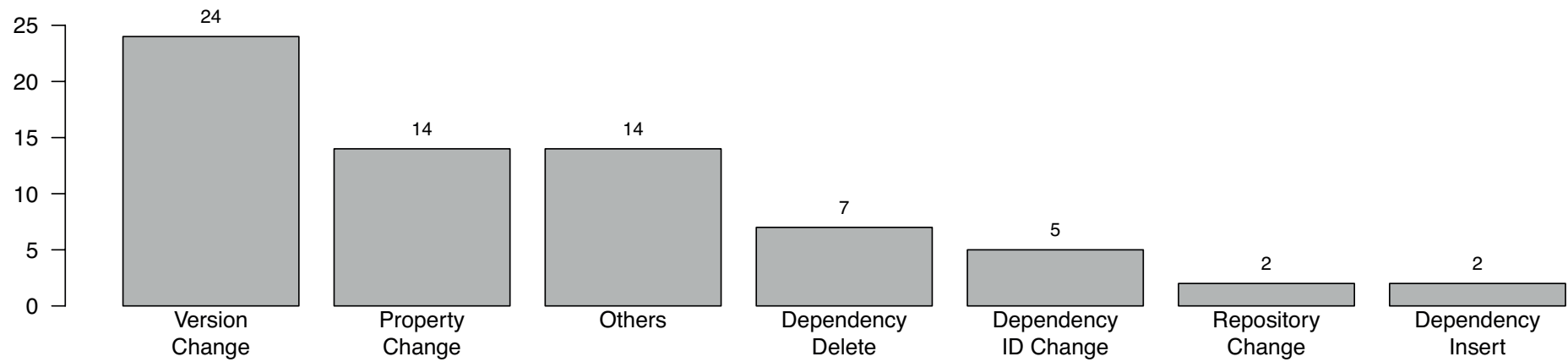
Results



Results



Results

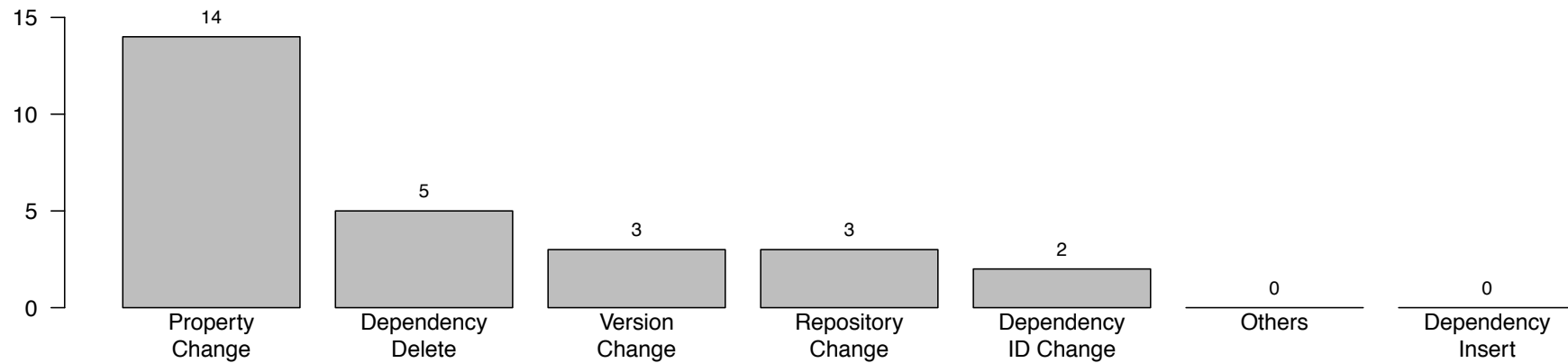


Approach

- Qualitative Analysis
 - Build changes (categories) actually repaired
 - Manually analyze the change(s) that repaired

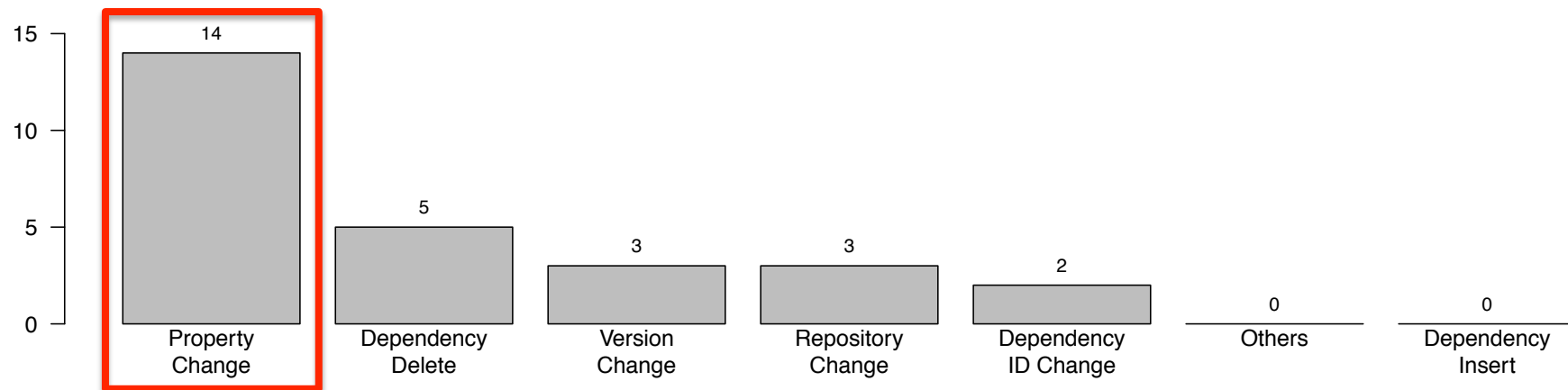
Results

- 27/37 revisions repaired with single change



Results

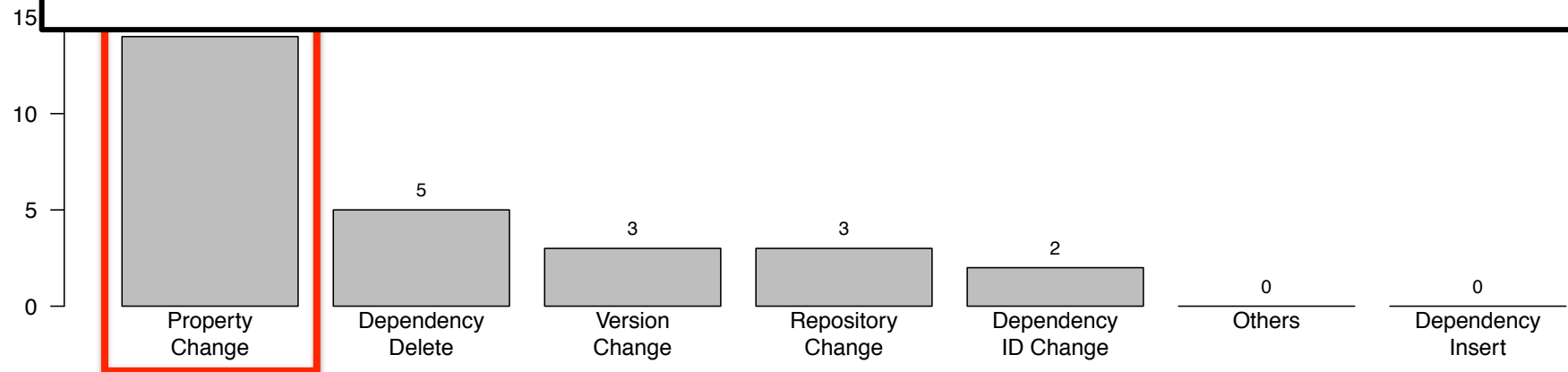
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- Property Change?
 - Refer to version changes



Results

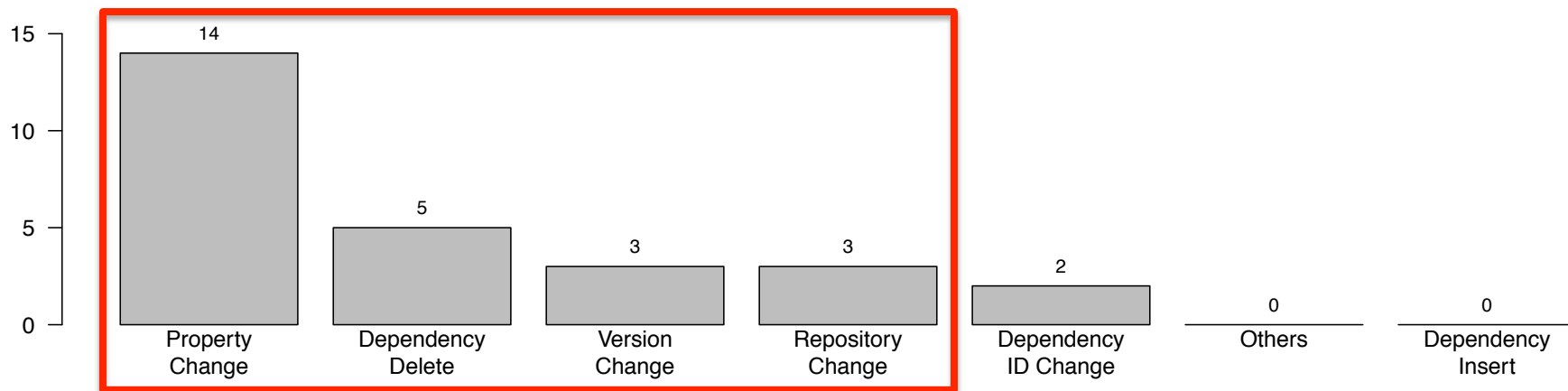
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→ Repair strategies!



Results

- 27/37 revisions repaired with single change
- Property Change?
 - Refer to version changes



Strategies

- Version Update
 - Identify failing dependency
 - Remove “-SNAPSHOT”
 - Update version (MAJOR.MINOR.PATCH)

$$distance = abs(10000 * (V1_{maj} - V2_{maj}) + 100 * (V1_{min} - V2_{min}) + (V1_{pat} - V2_{pat}))$$

- Dependency Delete
- Add Repository

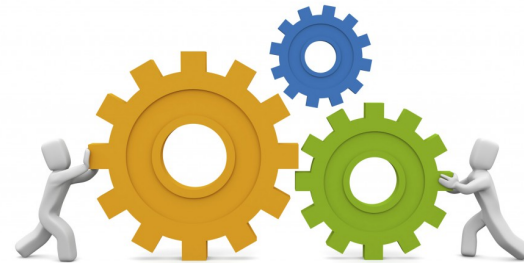
Research Questions

(RQ1)
Strategies?



How do developers repair
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breakage?

(RQ2)
Automation?

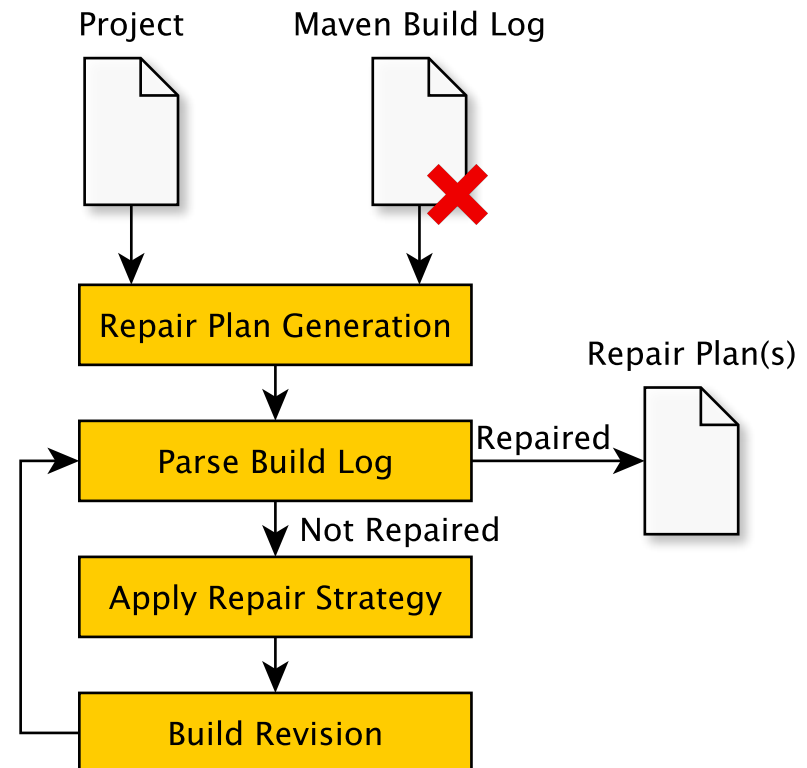


To what extent can we
automatically repair
dependency-related build
breakage?

Approach



BuildMedic



Results

Project	Fixed	Not Fixed	n=1	ID	SIM
async-http-client	1 (100%)	0 (0%)	0 (0%)	0 (0%)	0 (0%)
immutable	1 (100%)	0 (0%)	1 (100%)	1 (100%)	0 (0%)
closure-compiler	1 (100%)	0 (0%)	1 (100%)	1 (100%)	0 (0%)
symphony	4 (57%)	3 (43%)	4 (100%)	2 (50%)	2 (50%)
wildfly	0 (0%)	1 (100%)	- (-)	- (-)	- (-)
YCSB	1 (20%)	4 (80%)	1 (100%)	0 (0%)	1 (100%)
alluxio	10 (37%)	17 (63%)	3 (30%)	1 (10%)	7 (70%)
libgdx	5 (100%)	0 (0%)	5 (100%)	1 (20%)	3 (60%)
hazelcast	7 (50%)	7 (50%)	7 (100%)	7 (100%)	0 (0%)
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Total	45 (54%)	39 (46%)	34 (76%)	16 (36%)	20 (44%)

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Performance?

Performance

Total time: 4 – 61 minutes (22.8 average)

Overhead: 1.5 – 35 minutes (8.6 average)

Applications/Implications

- Build Breakage can often be repaired with a single change
- Version Update most frequent change
- Build Medic can support developers
 - Post build action
 - Standalone tool

Motivation



- Teams gather immediate feedback on changes
- Improve productivity

B. Vasilescu et al., "Quality and productivity outcomes relating to continuous integration in github", ESEC/
FSE 2015.

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Research Questions

(RQ1)
Strategies?



**How do developers repair
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breakage?**



(RQ2)
Automation?



**To what extent can we
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(RQ1)
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**How do developers repair
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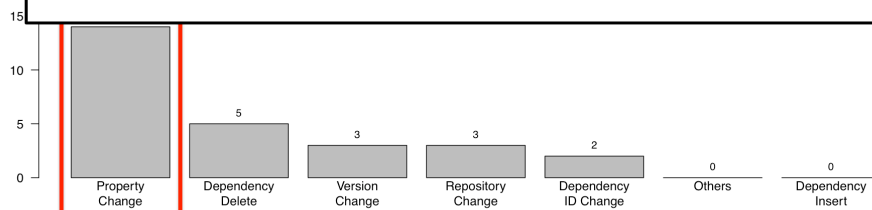


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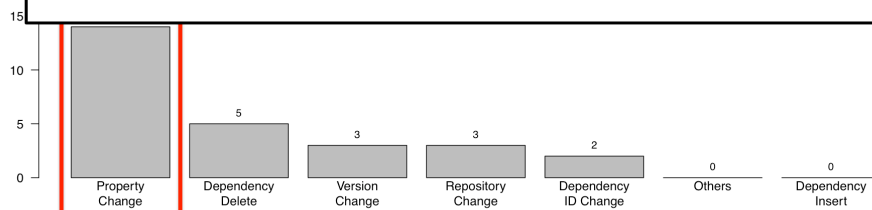


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