



Montréal, Quebec, Canada

March 3 - 6, 2015

## Who Should Review My Code?

A File Location-Based Code-Reviewer Recommendation Approach for Modern Code Review



Patanamon (Pick) **Thongtanunam** 



Chakkrit **Tantithamtavorn** 



Raula G. Kula



Norihiro Yoshida



Hajimu lida



Ken-ichi Matsumoto









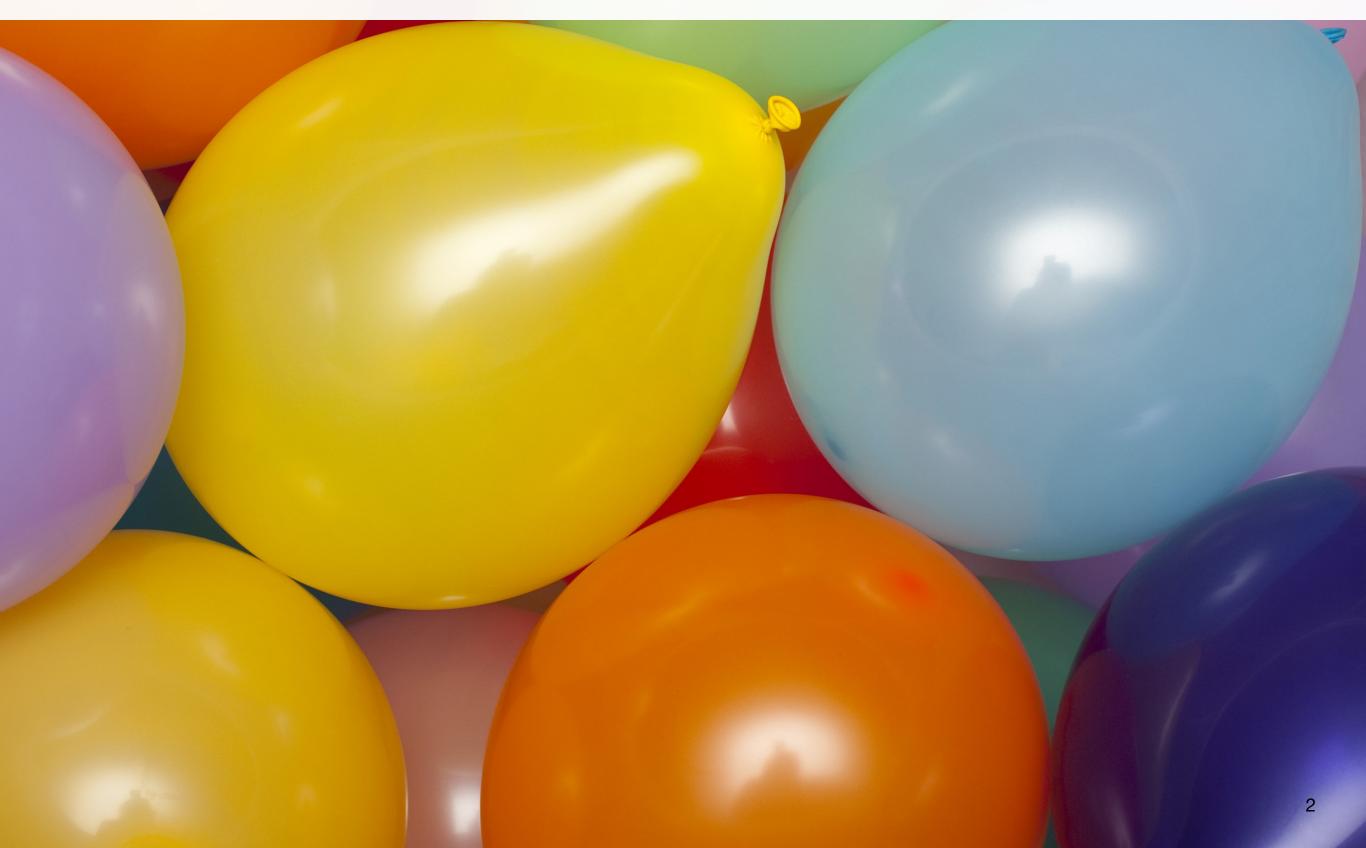




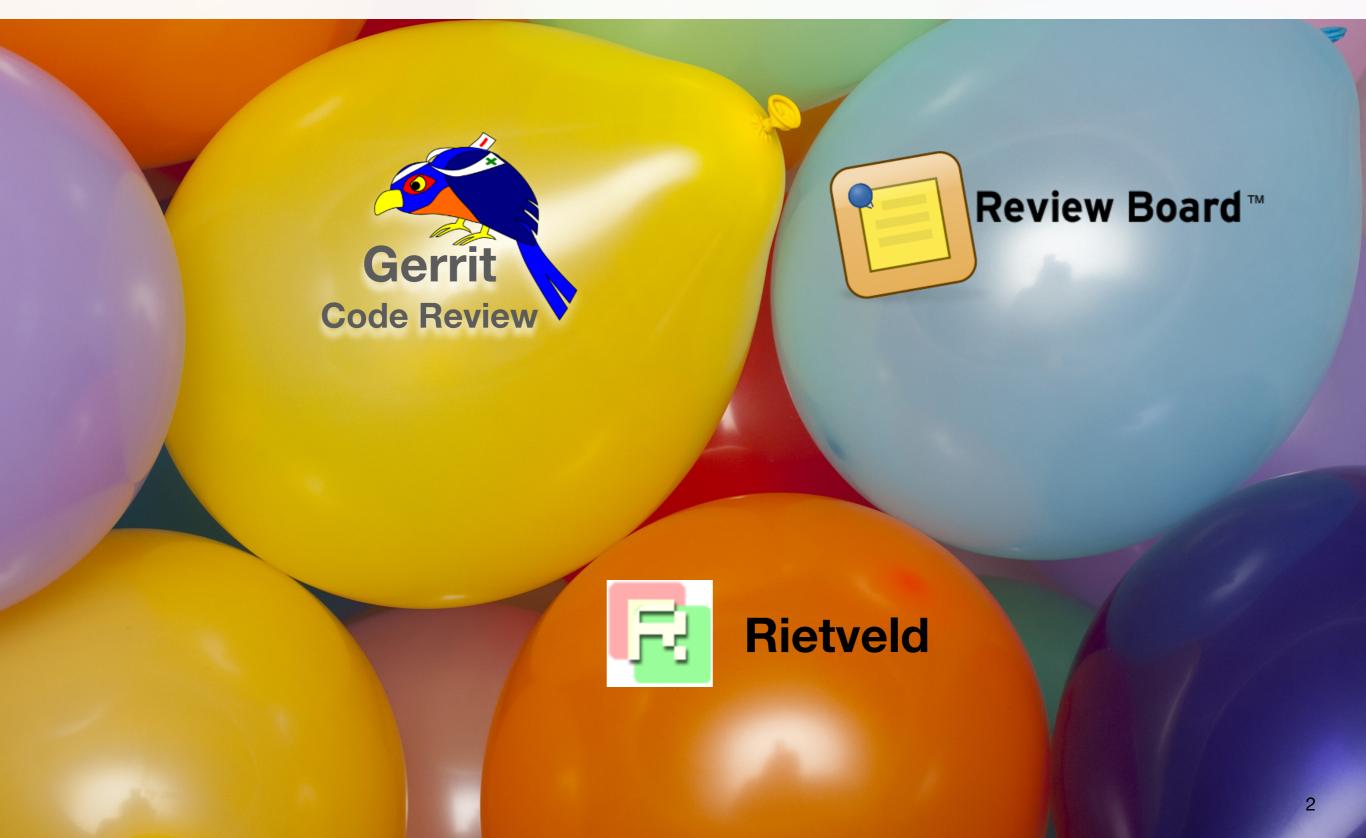




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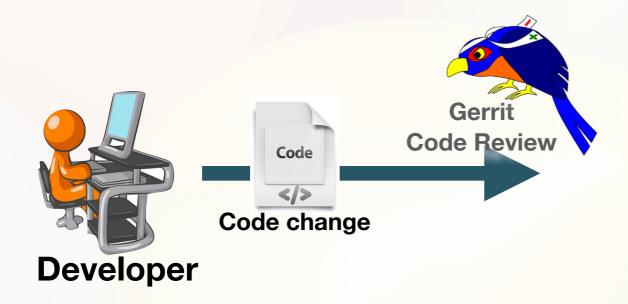
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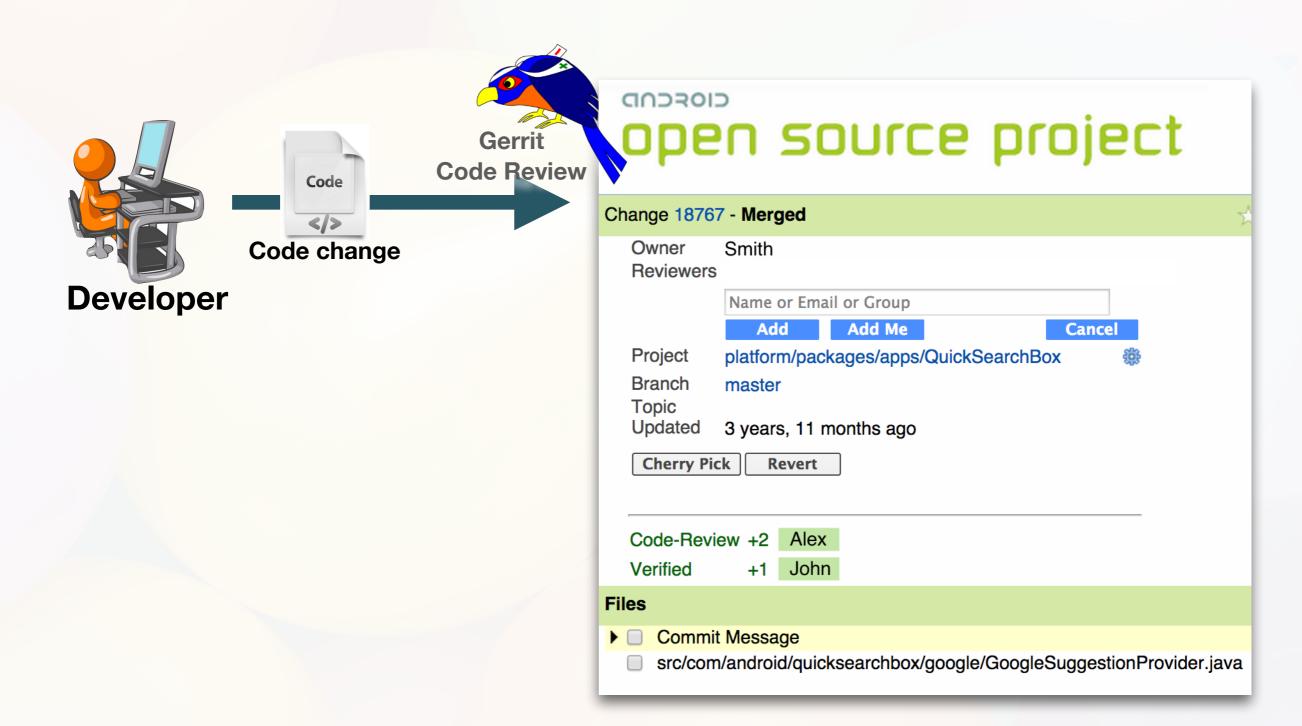


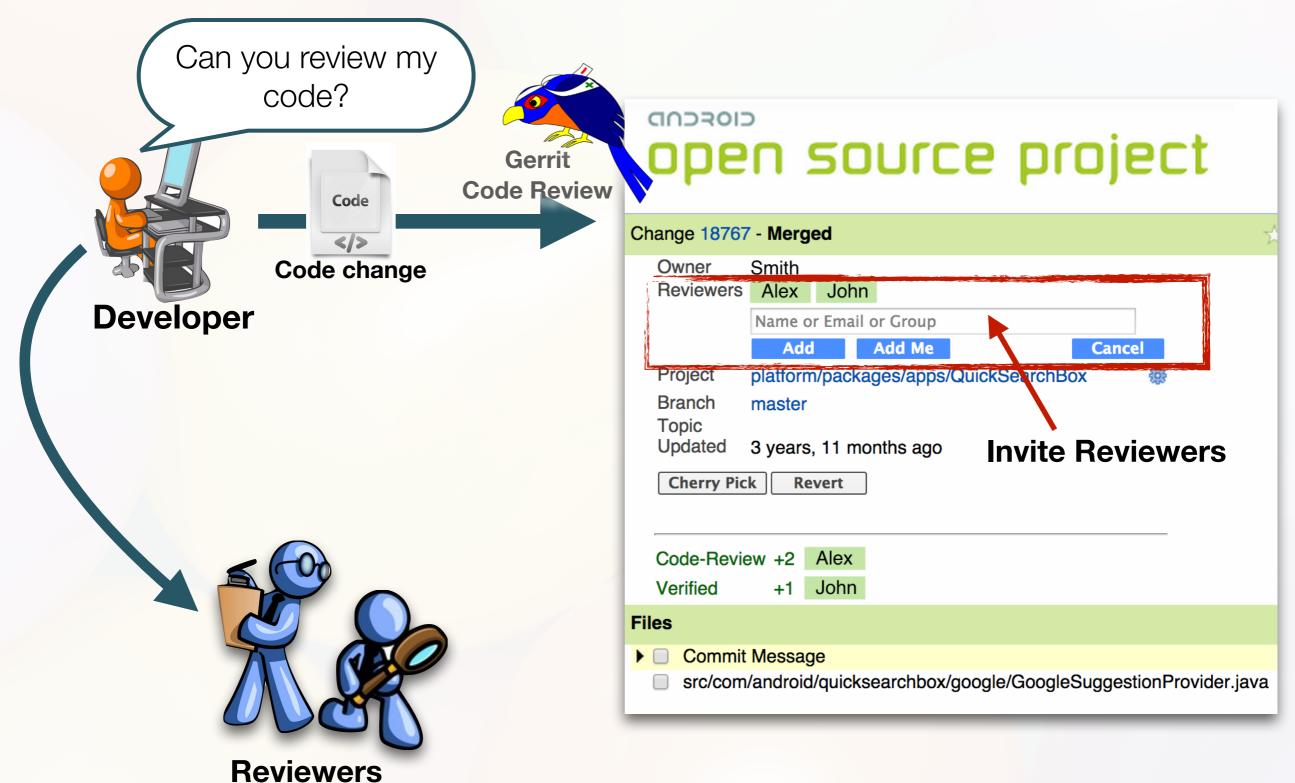
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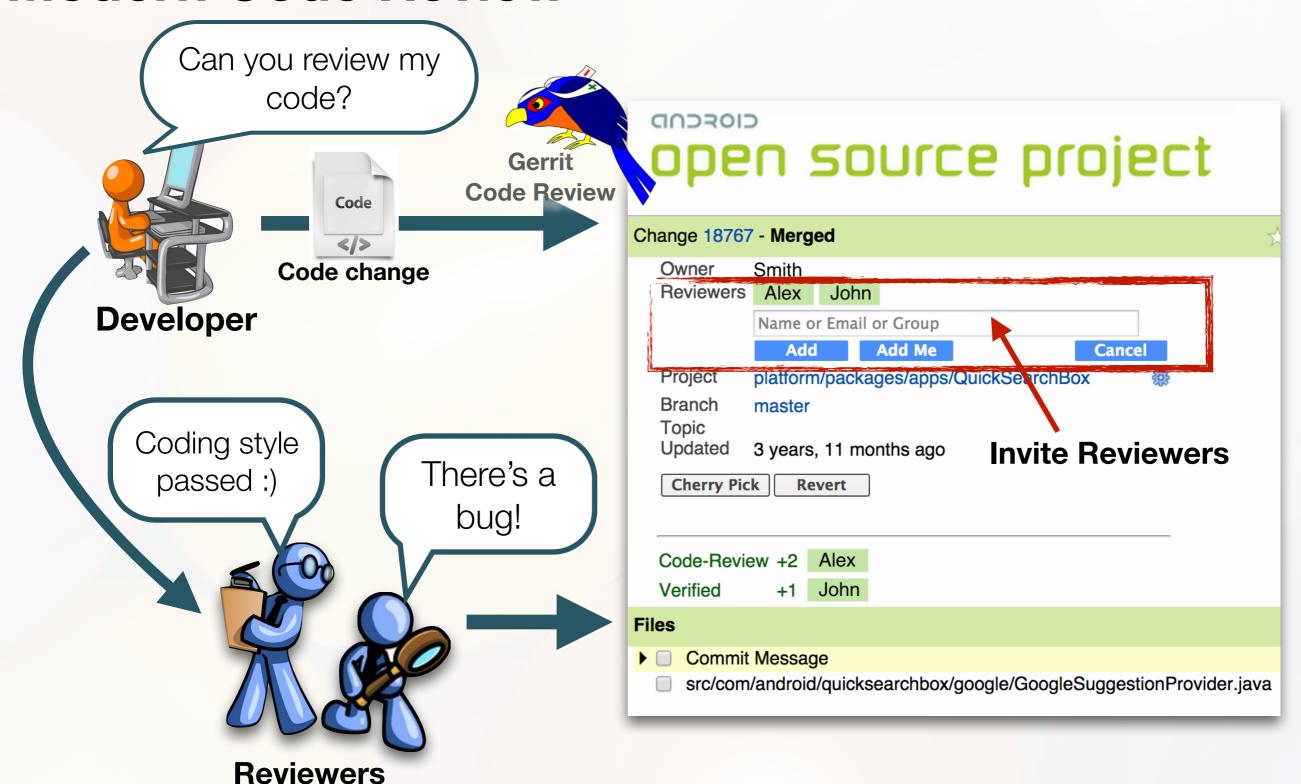




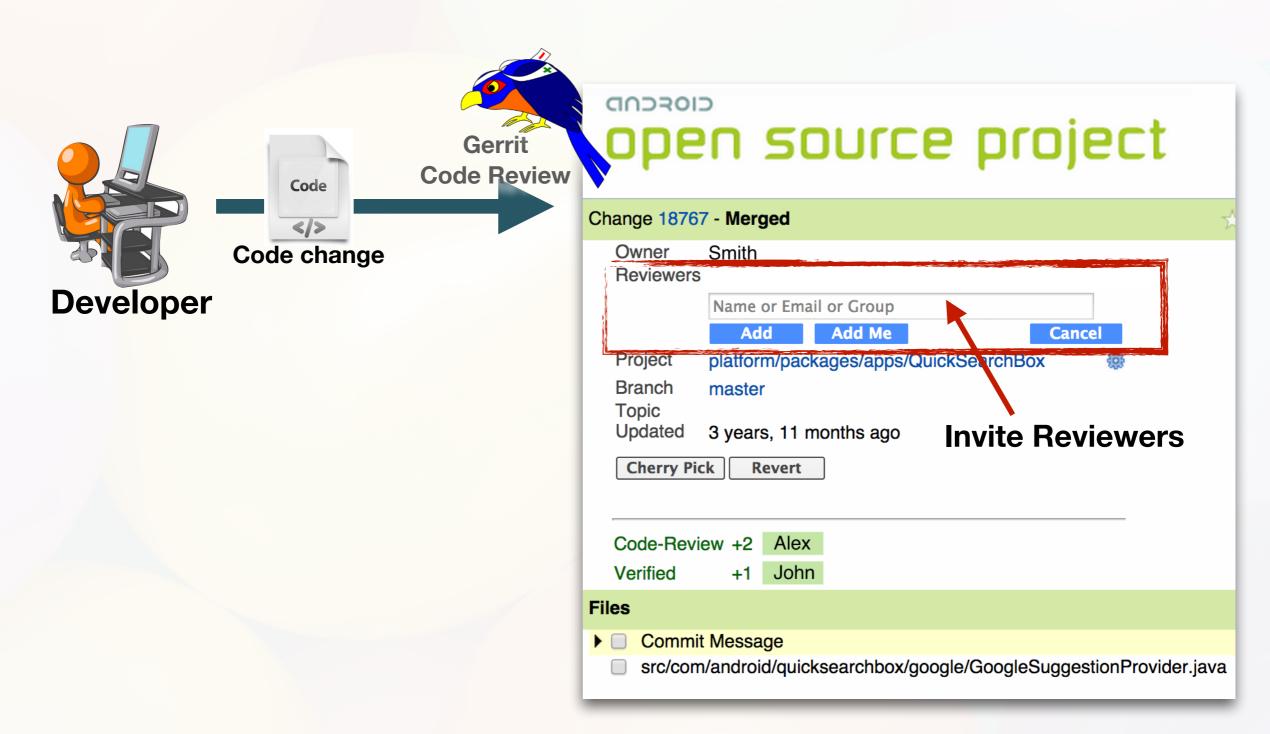




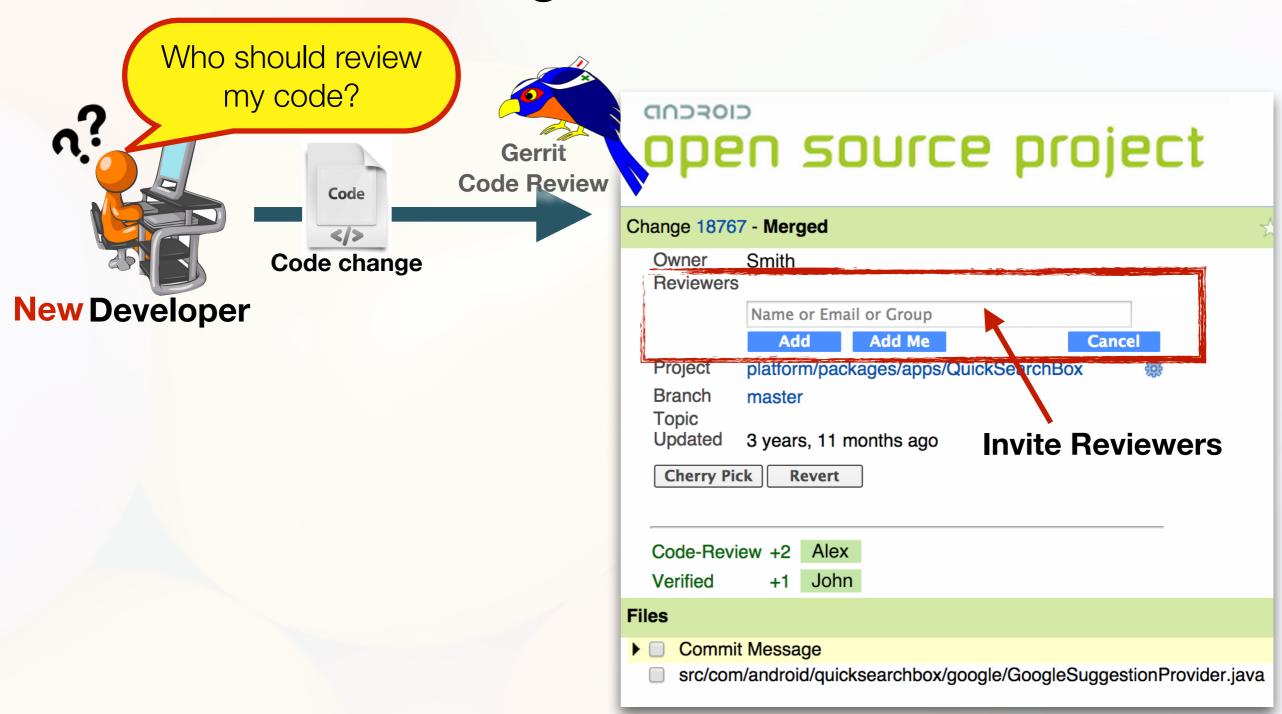




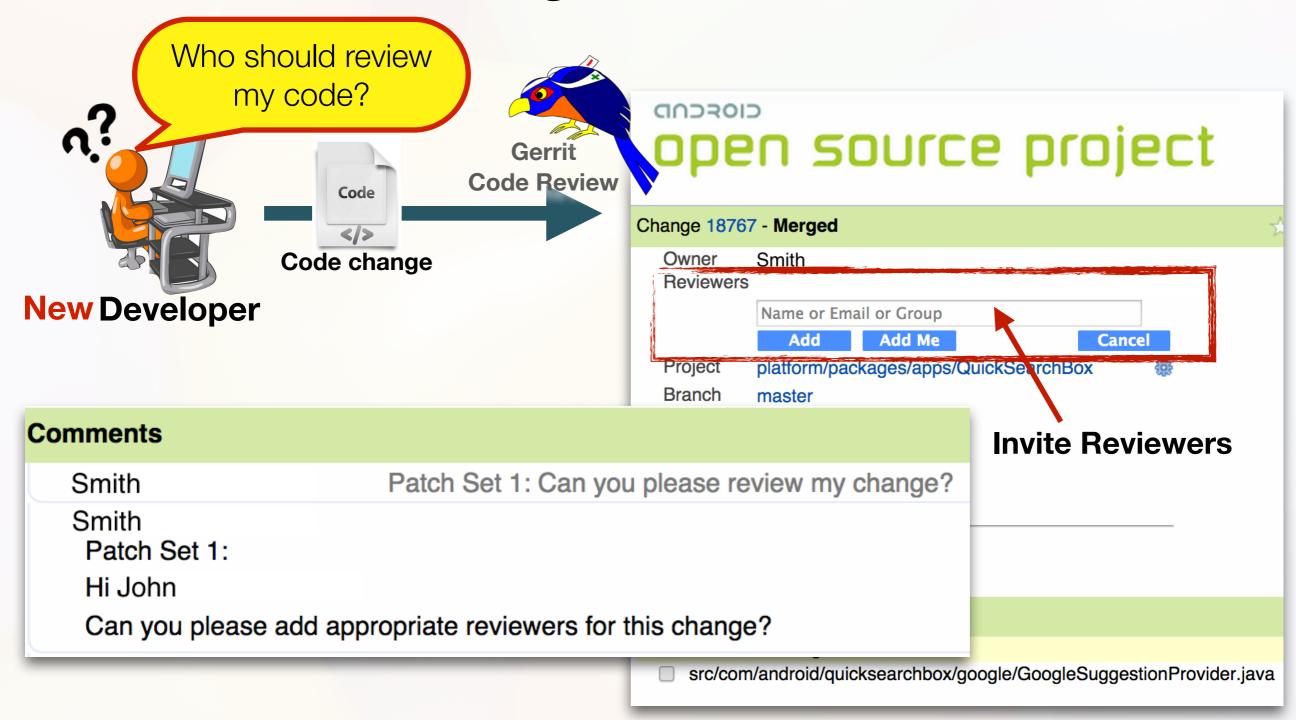
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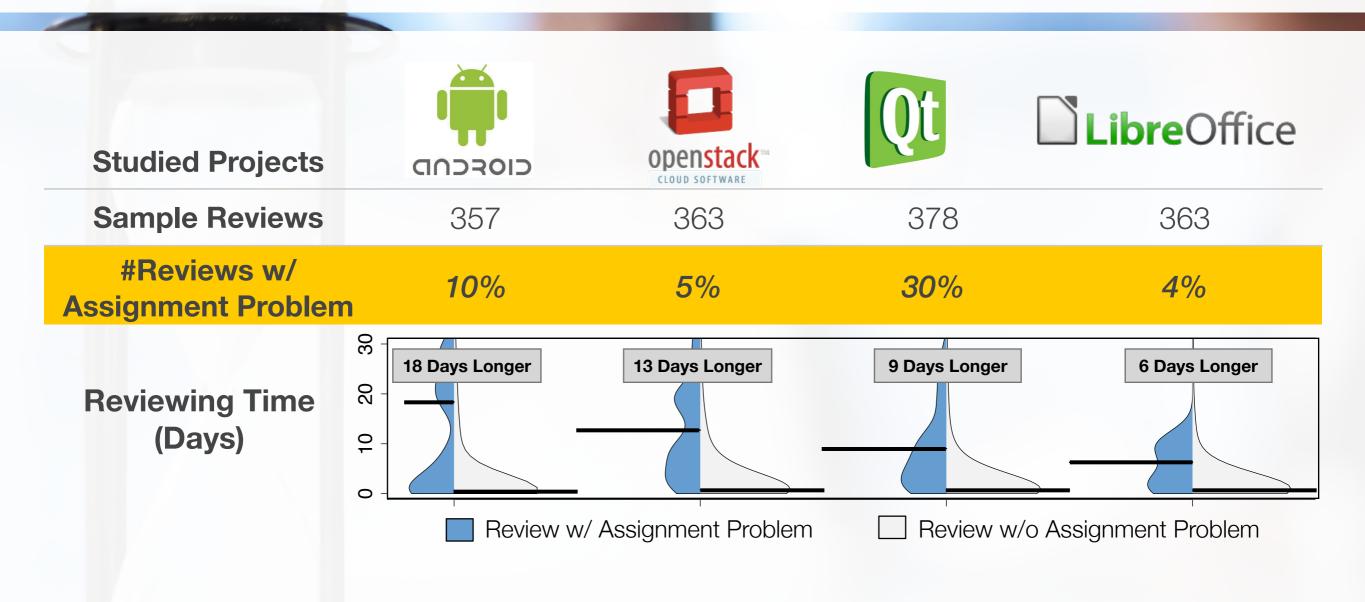


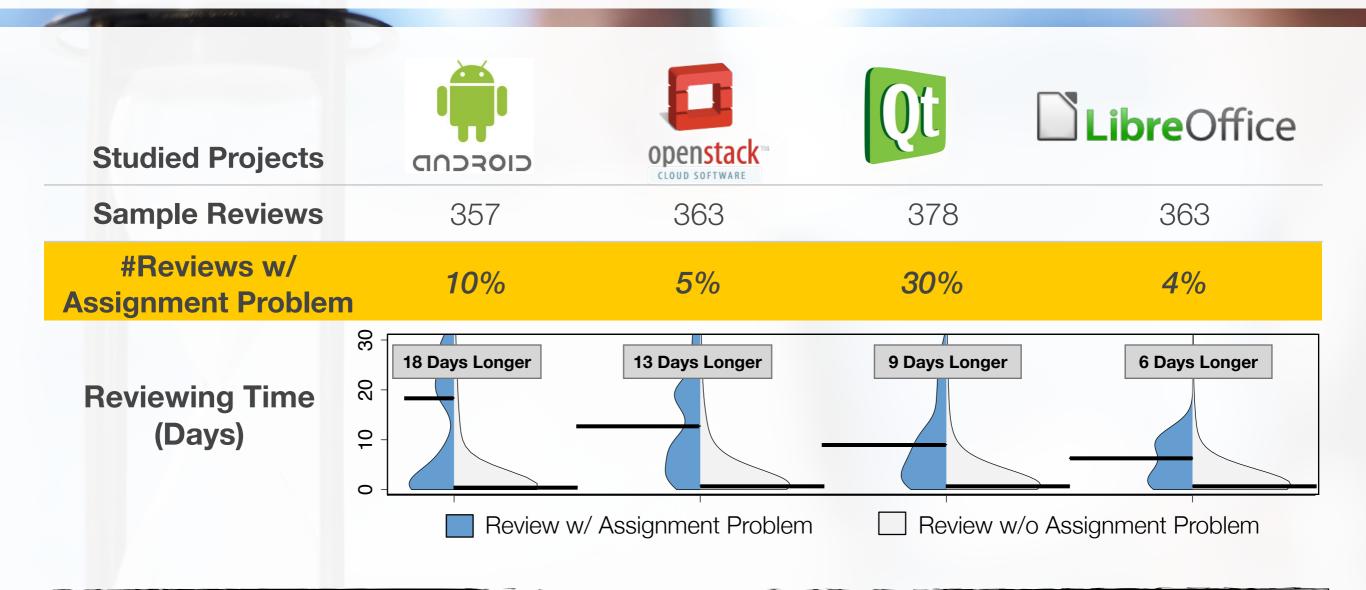




Studied Projects	CIOSCOD	openstack The CLOUD SOFTWARE	Qt	LibreOffice
Sample Reviews	357	363	378	363

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#Reviews w/ Assignment Problem	10%	5%	30%	4%





Reviews with code-reviewer assignment problem significantly take 12 days longer to approve a code change.

**Bojan Petrovic** 

Patch Set 3:



You might want to add some approvers to the reviewers list if you want it reviewed/approved.

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Hi Jean,



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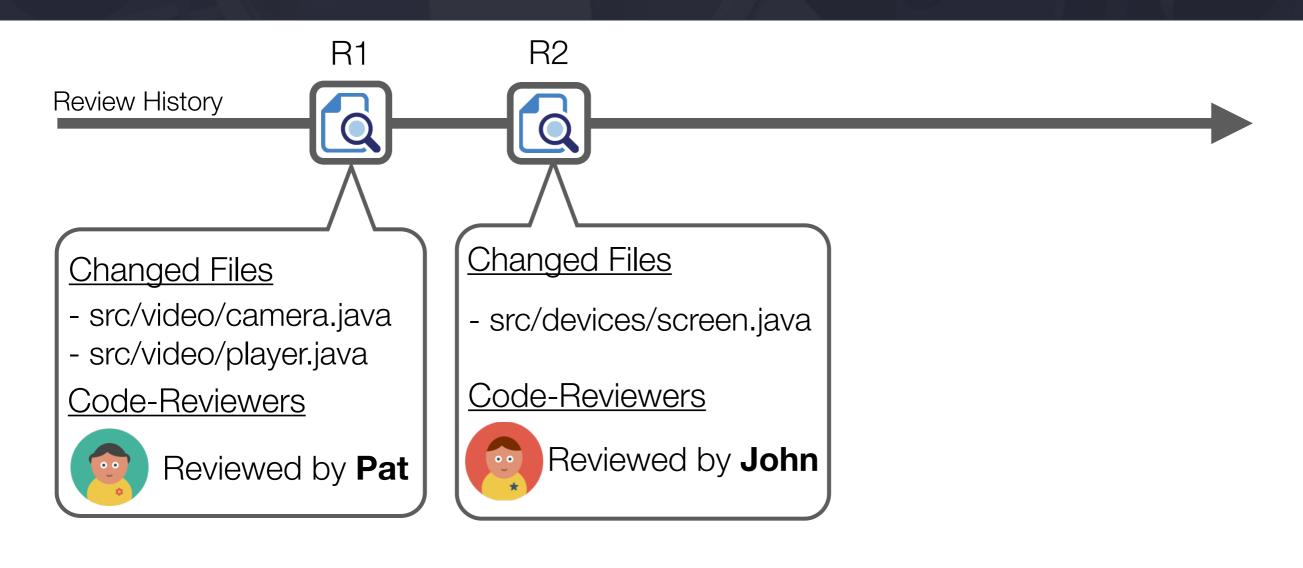


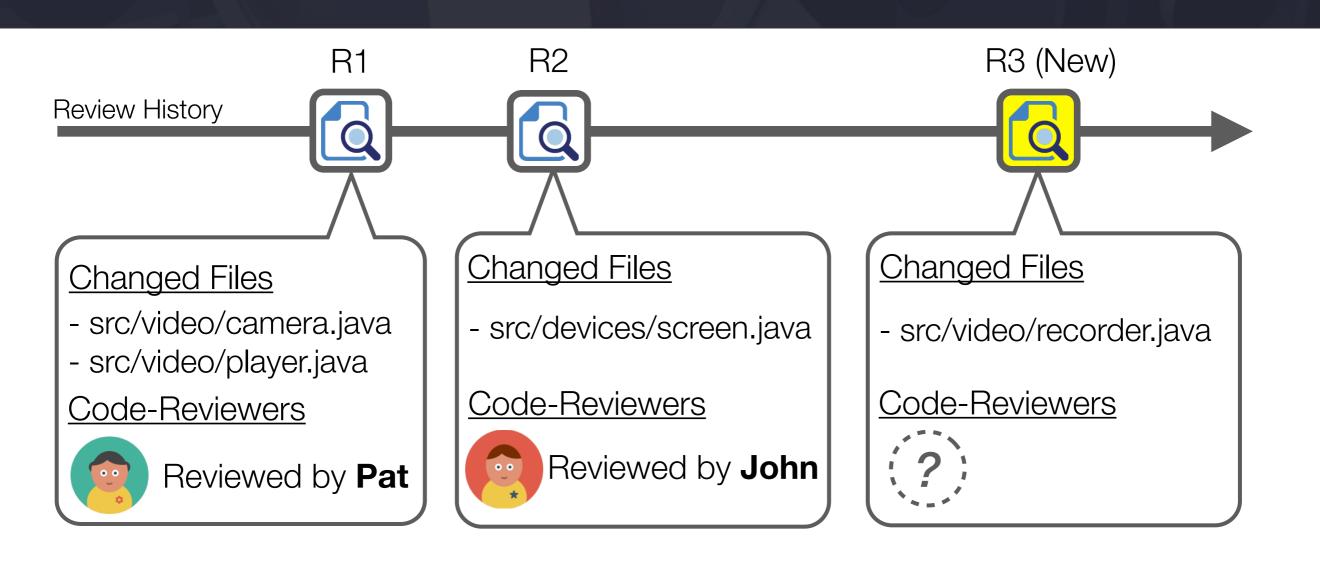
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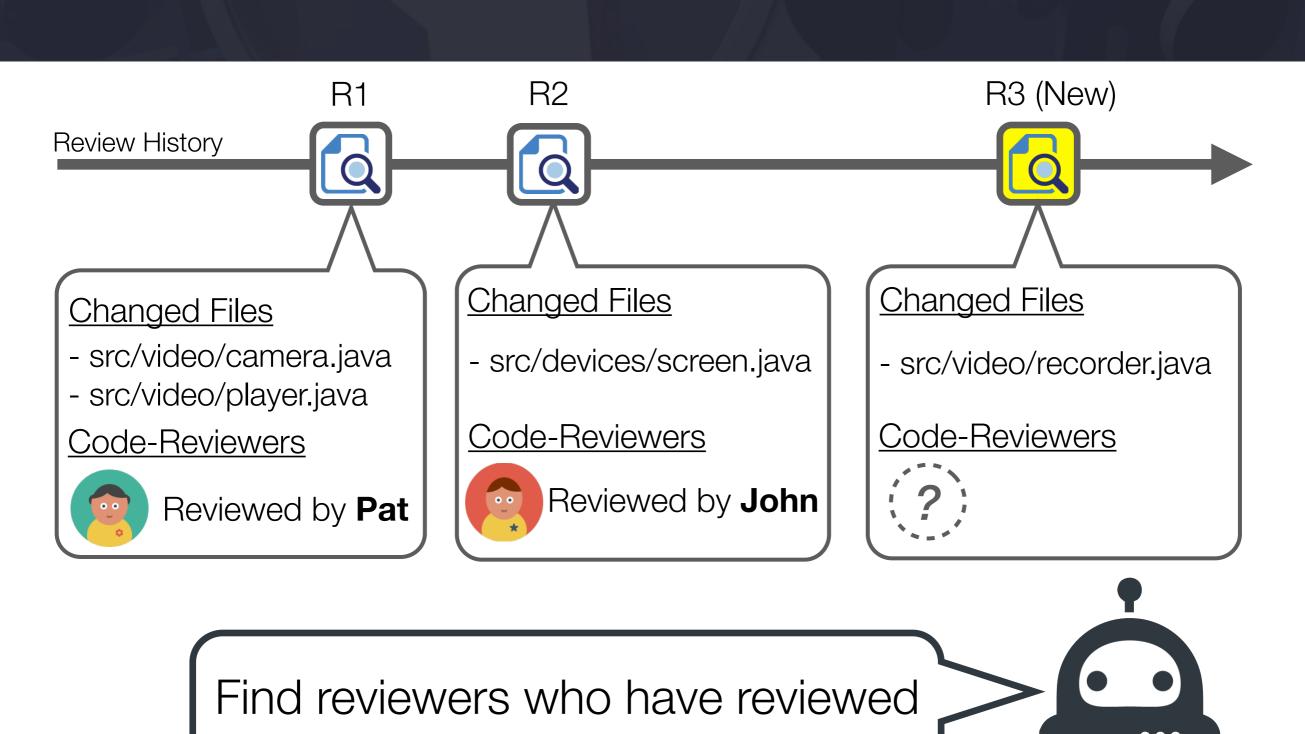
A code-reviewer recommendation tool will be useful in distributed software development to speed up the code review process.



**RevFinder**: A File Location-based Code-Reviewer Recommendation Approach

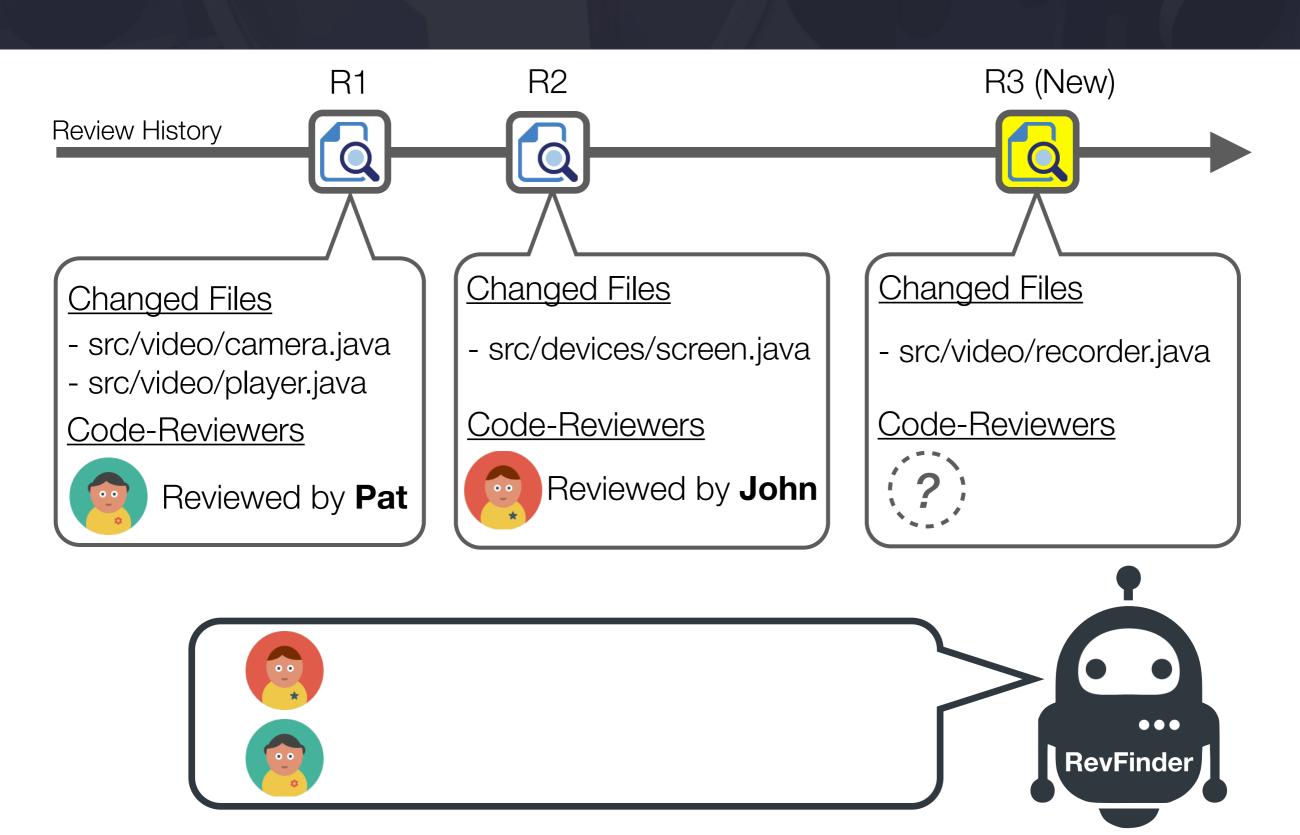


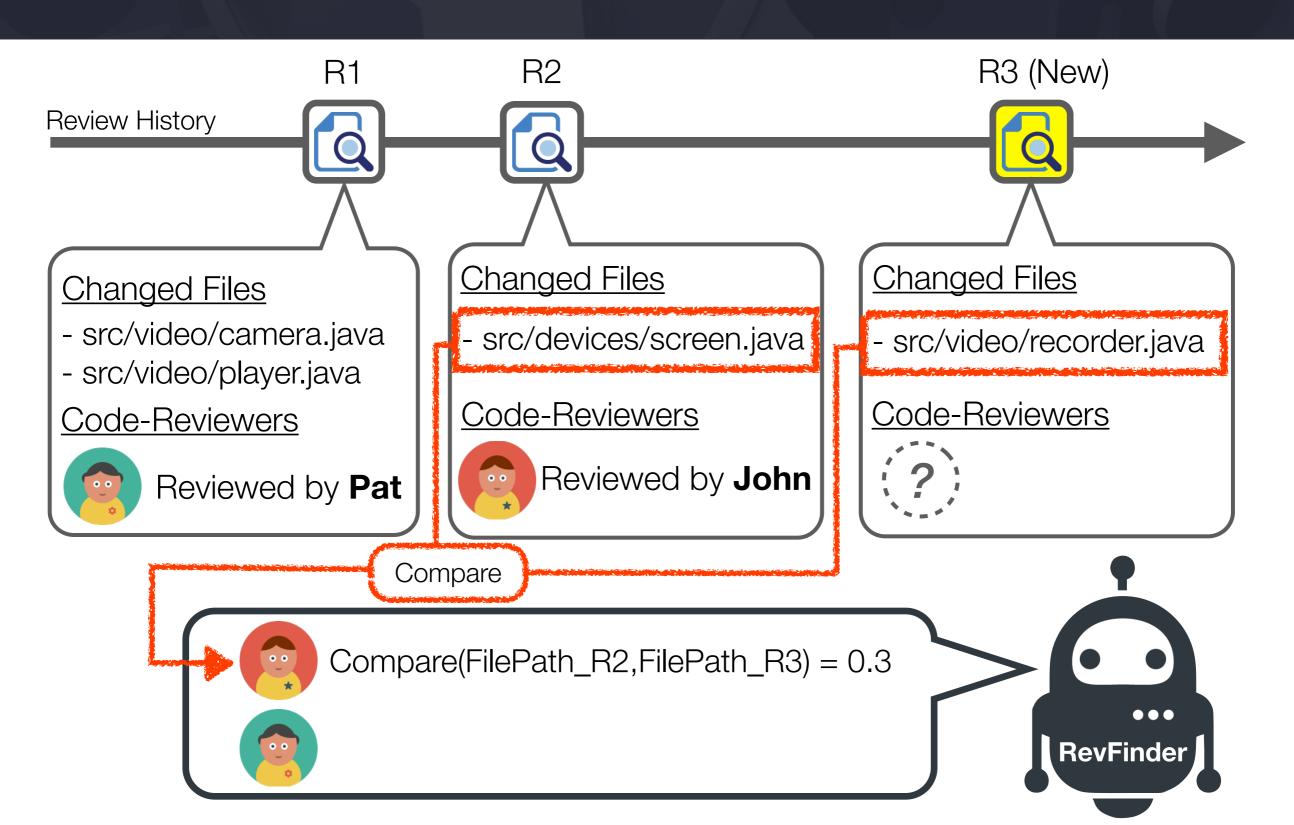


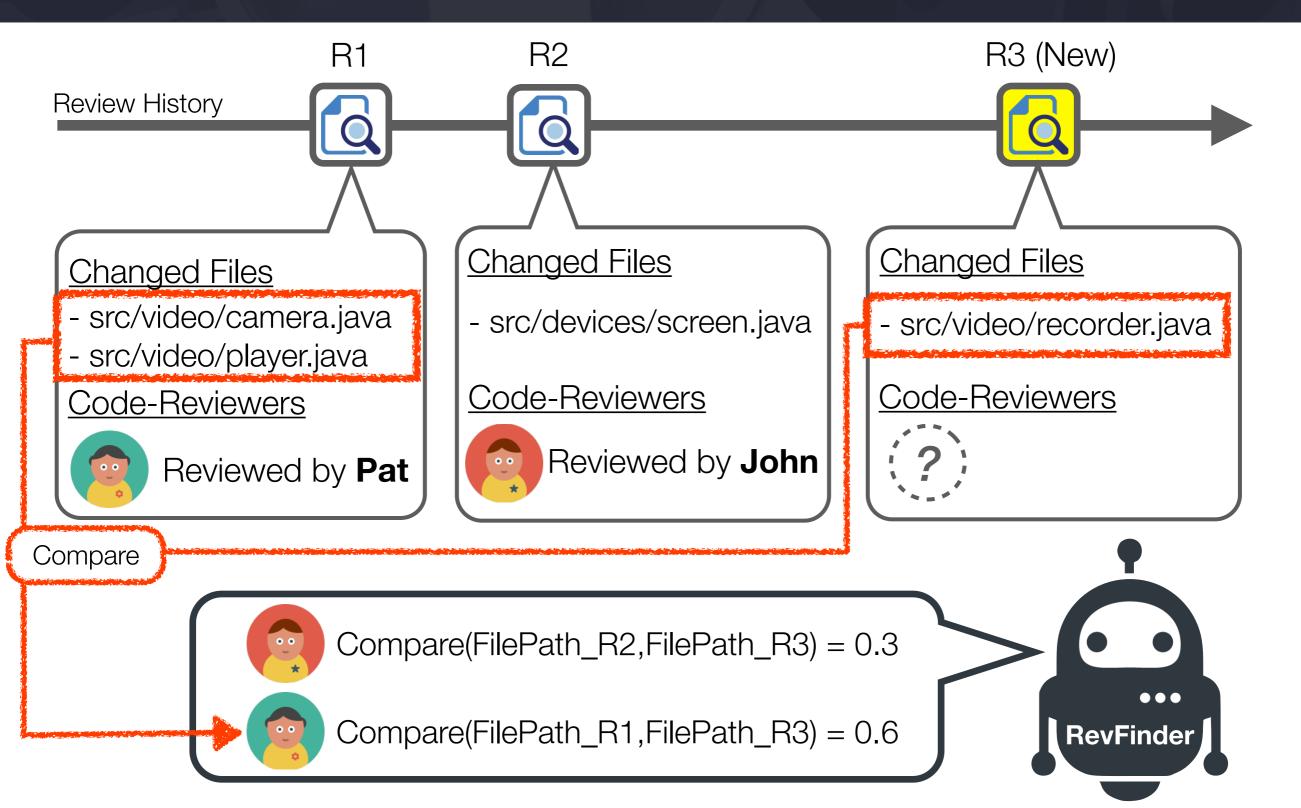


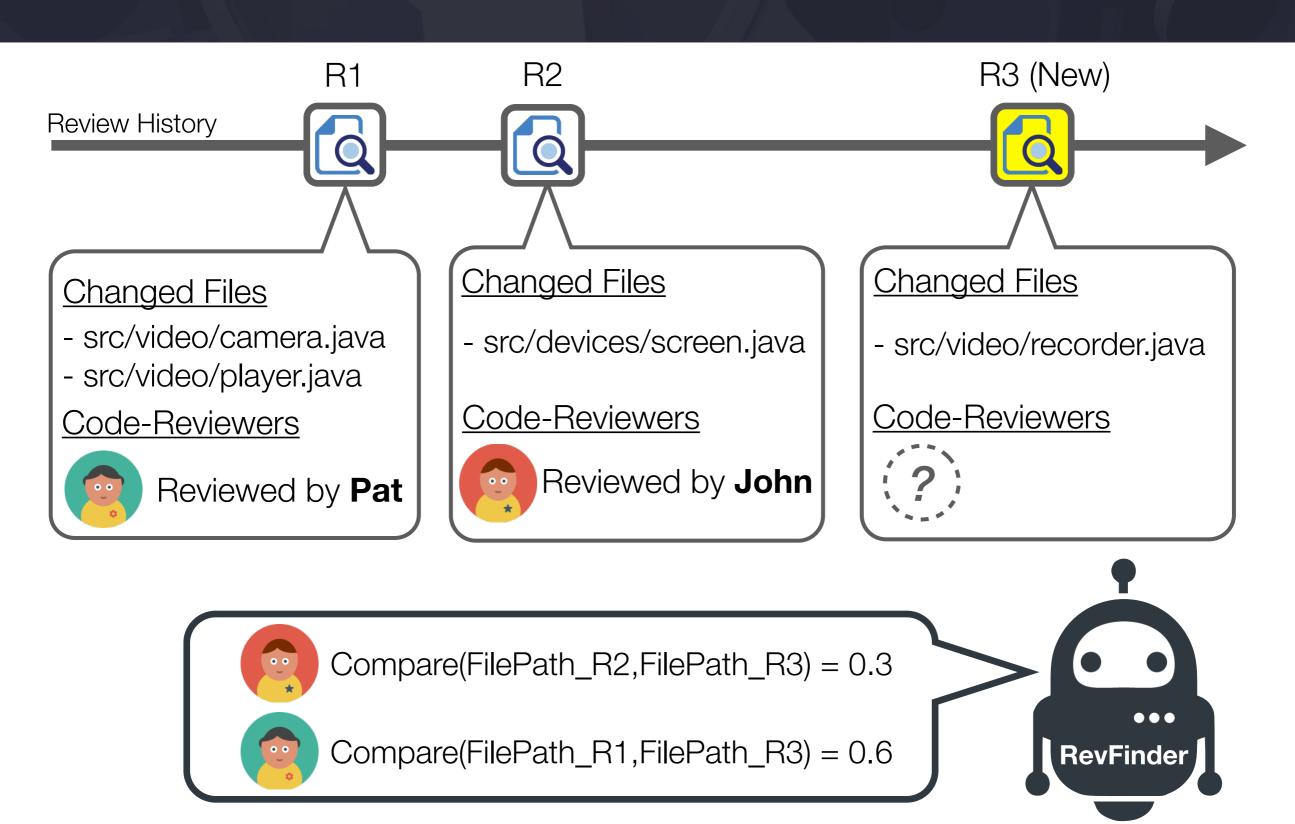
the most <u>similar file paths</u>

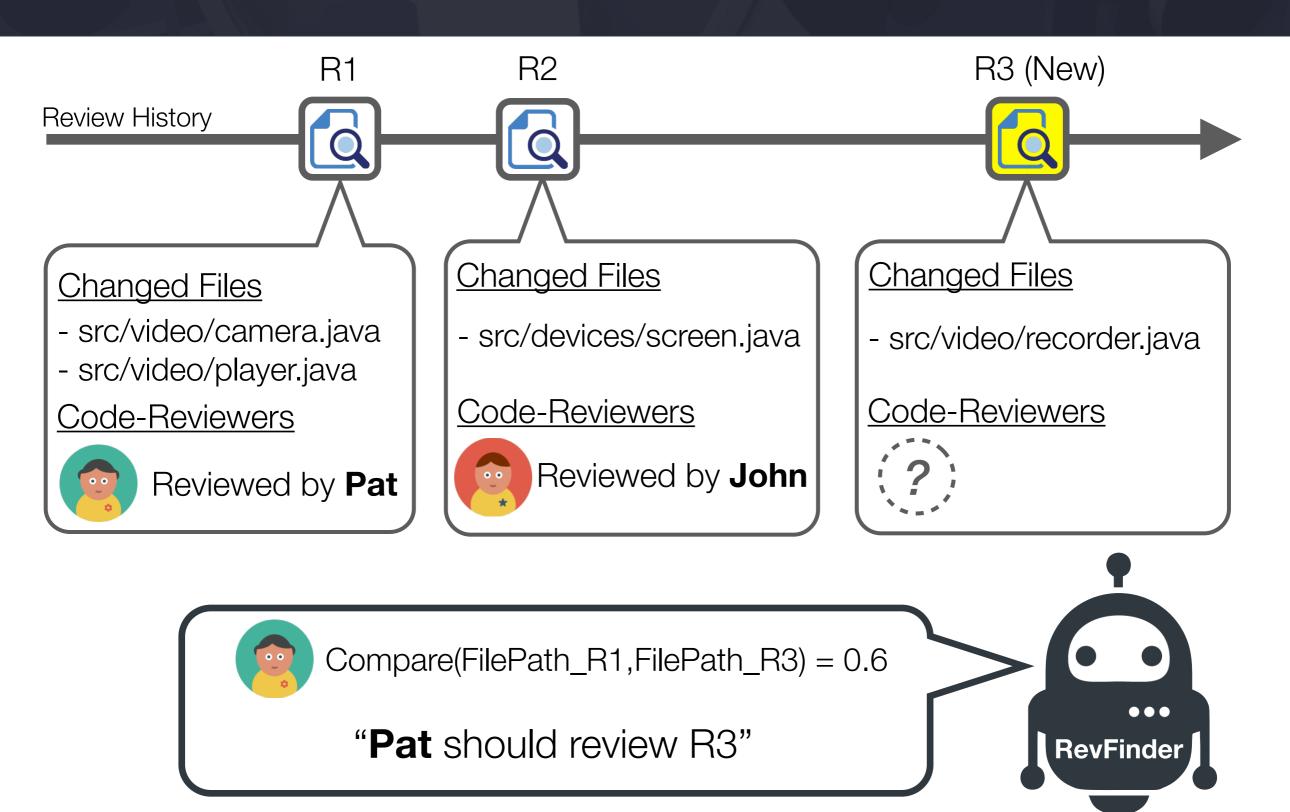
**RevFinder** 

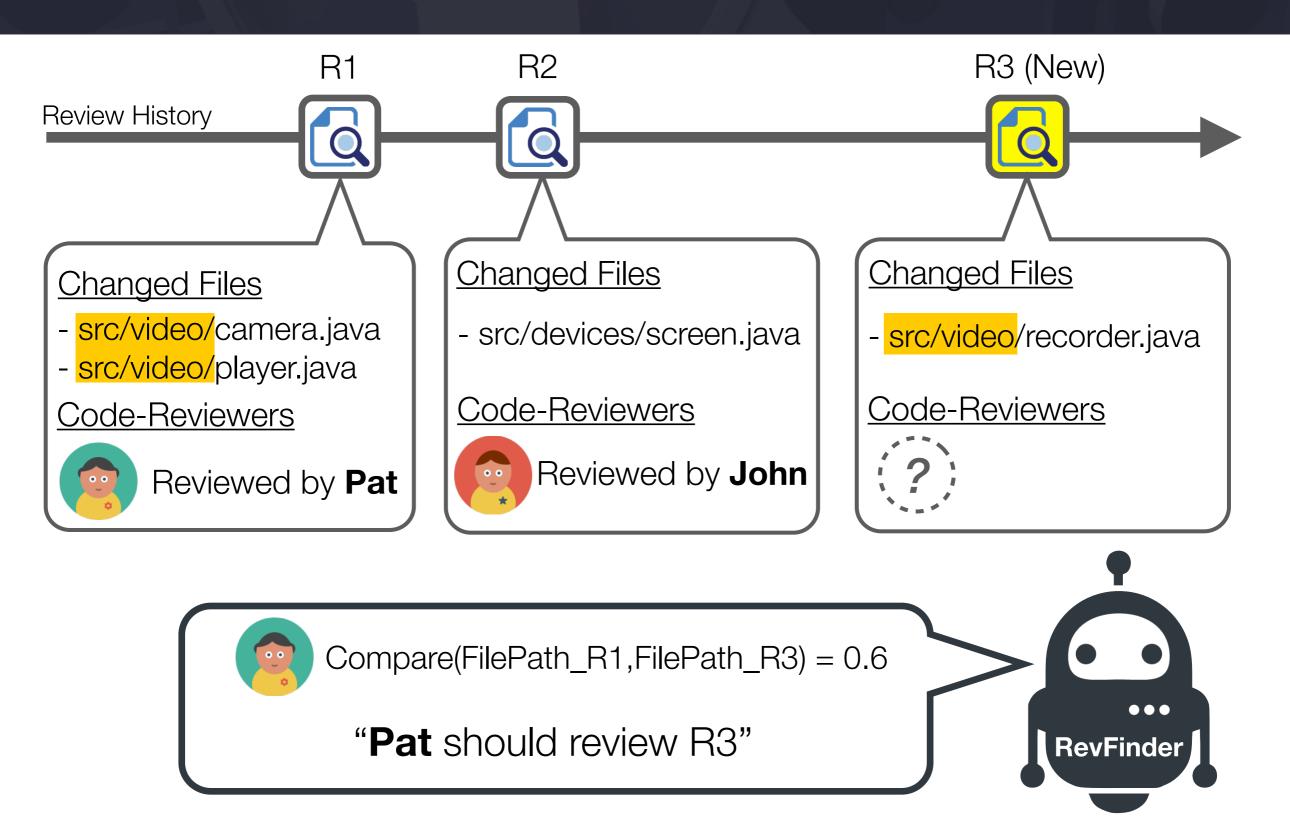












## RevFinder: FilePath Comparison Techniques

4 String Comparison Techniques

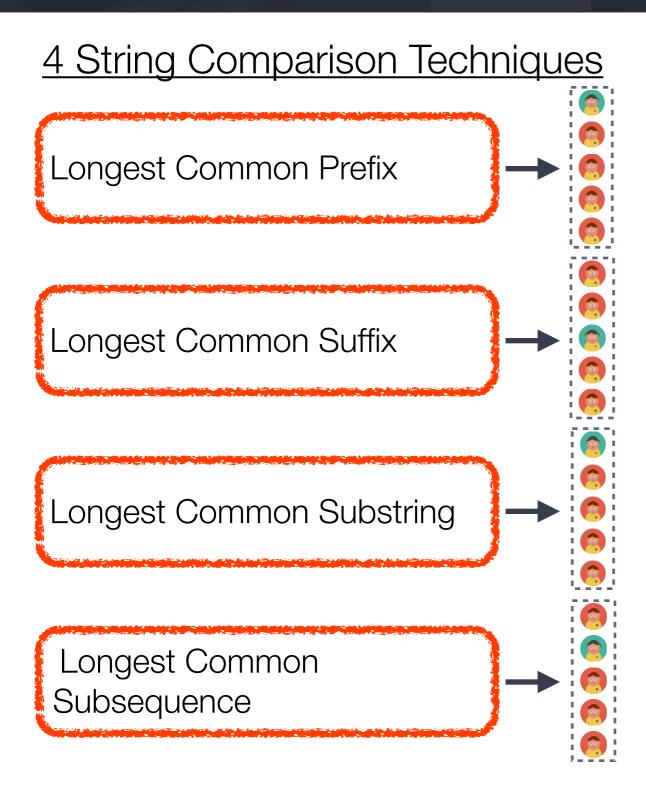
Longest Common Prefix

Longest Common Suffix

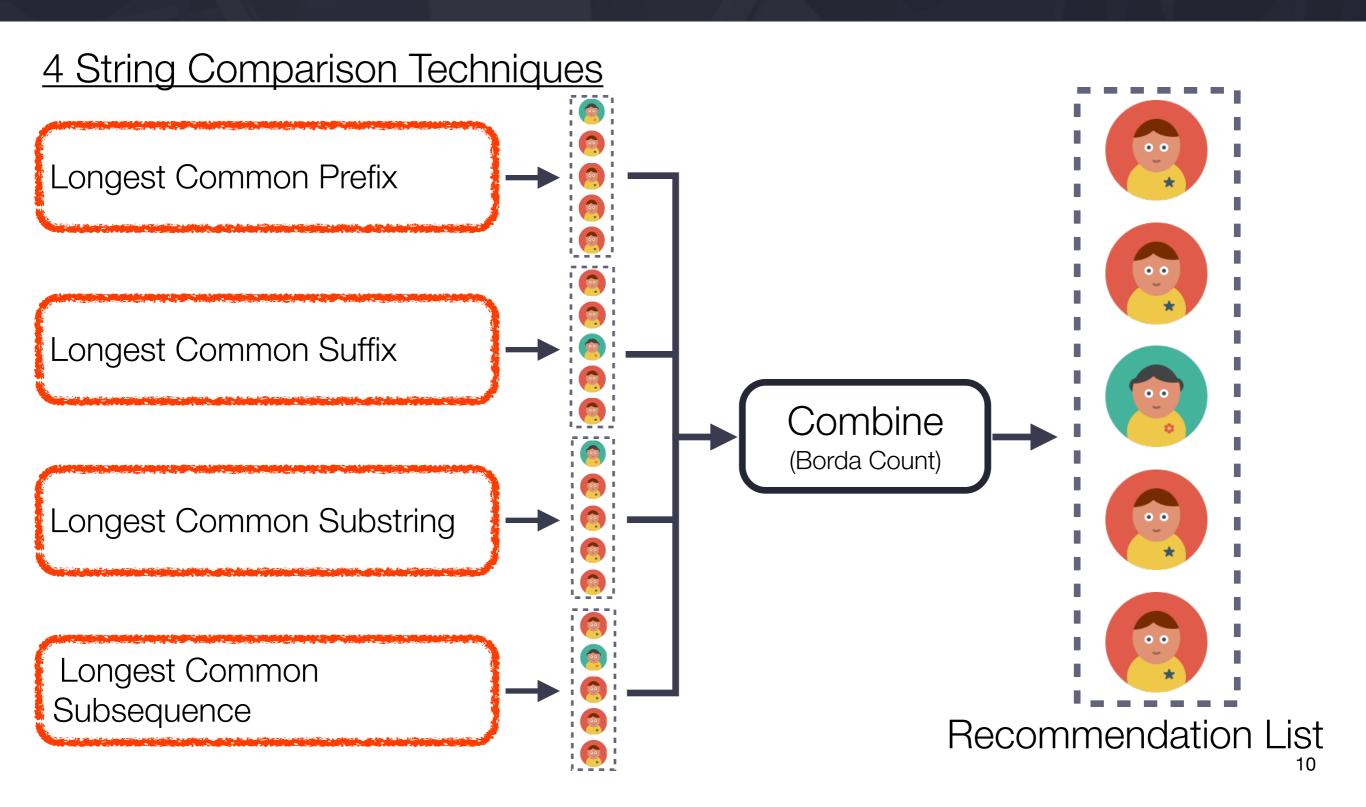
Longest Common Substring

Longest Common Subsequence

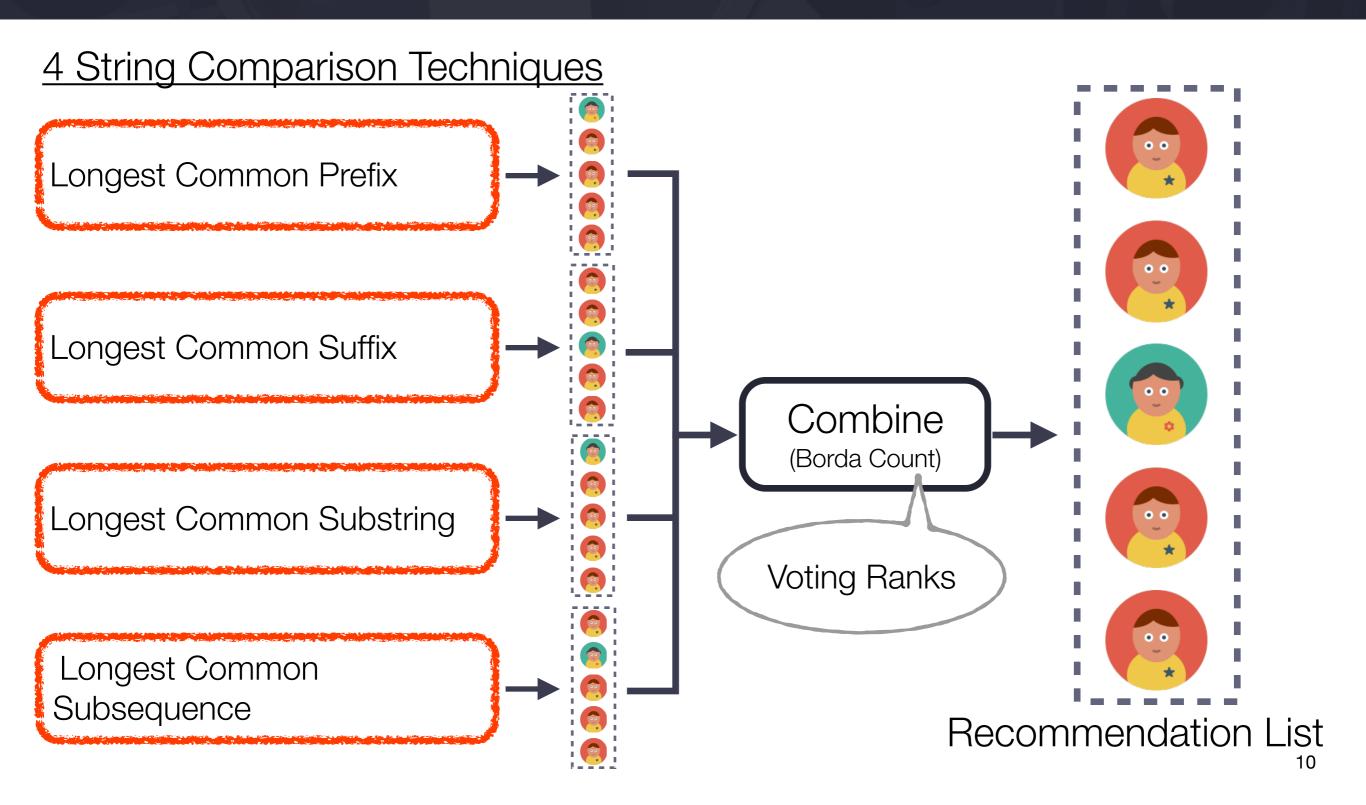
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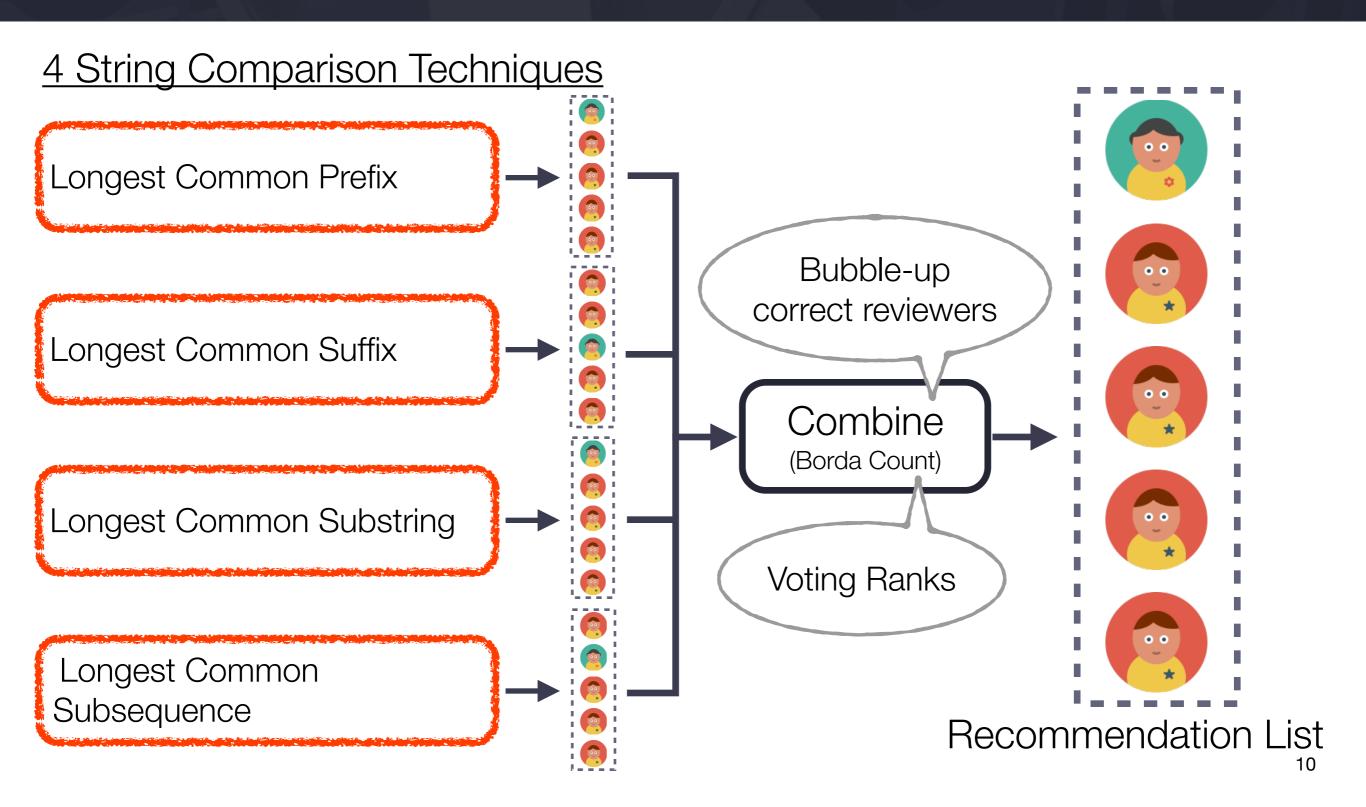
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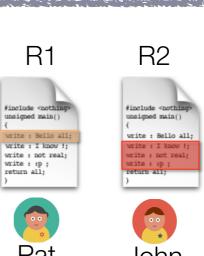


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Period	~4 years	~1year	~1 year	~2 year
#Reviews Q	5,126	6,586	23,810	6,523
#Reviewers	94	82	202	63

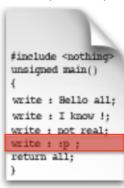
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Baseline Approach: ReviewBot (Balachandran ICSE'13)

"Recommend reviewers who have reviewed the same line of code changes"



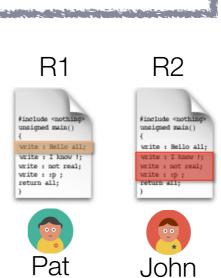
R3 (New)

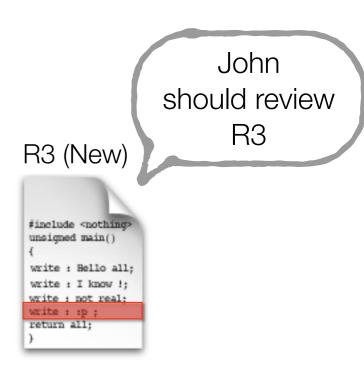


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"RQ2: Does RevFinder **accurately** recommend reviewers?"

# Accuracy



"RQ2: Does RevFinder **accurately** recommend reviewers?"

#### Ranking Performance



"RQ3: Does RevFinder provide **a better ranking** of correct reviewers?"



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Measure: Top-k Accuracy

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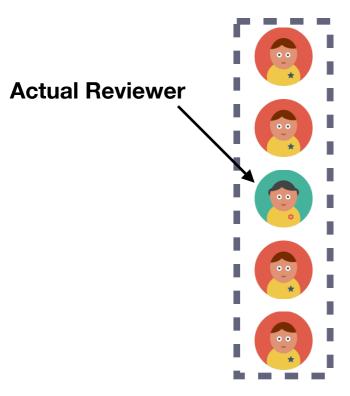






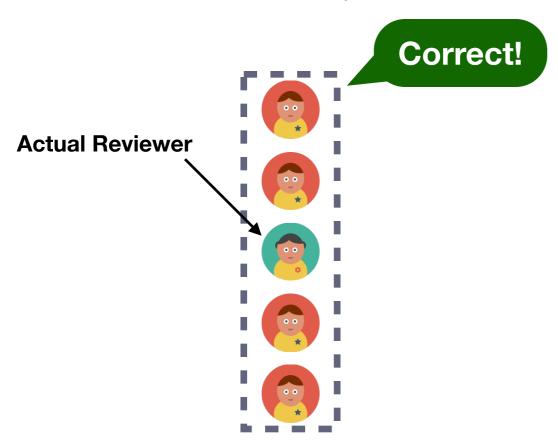
Top-5 Recommendation





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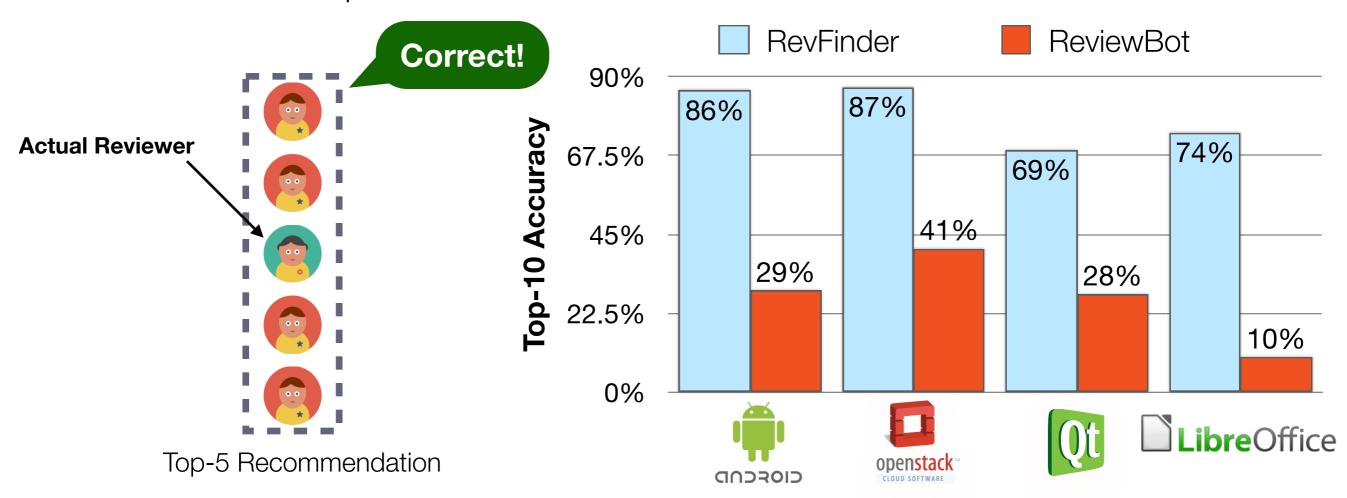




Top-5 Recommendation



<u>Top-k Accuracy</u> measures how many reviews does an approach can correctly recommend with a Top-k recommendation.



**RevFinder** can correctly recommended 69%-87% of reviews with a top-10 recommendation. **RevFinder** is 4 times more accurate than ReviewBot.



"Does RevFinder accurately recommend reviewers?"

Measure: Top-k Accuracy

#### Ranking Performance



"Does RevFinder provide a better ranking of correct reviewers?"



"Does RevFinder **accurately** recommend reviewers?"

On average, RevFinder can correctly recommend reviewers for 79% of reviews with a top-10 recommendation.

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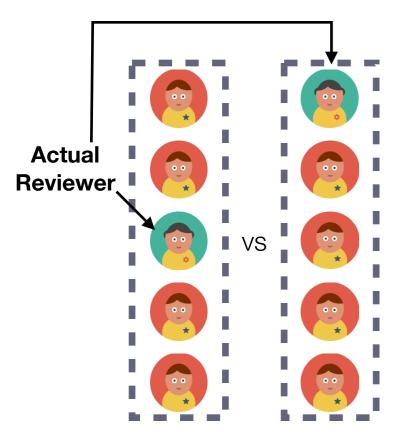


"Does RevFinder provide a better ranking of correct reviewers?"

Measure: Mean Reciprocal Rank (MRR)

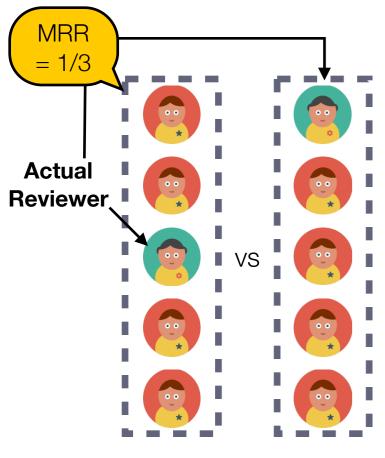






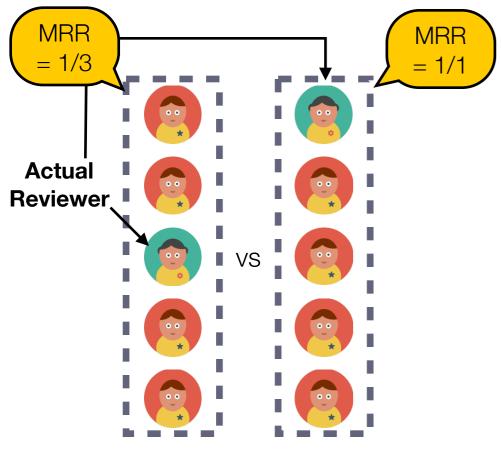
Recommendation Lists





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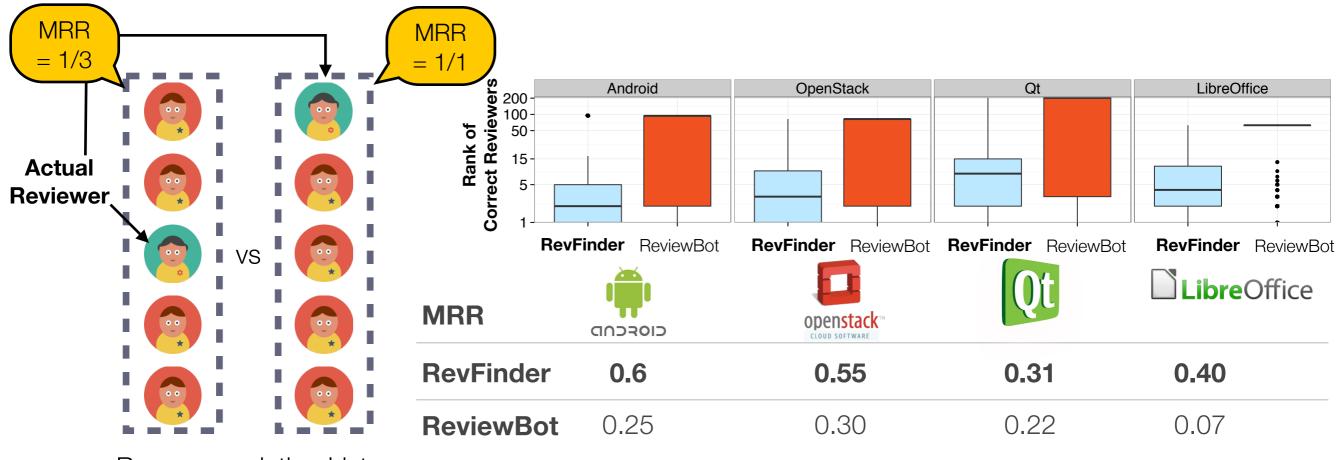




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Mean Reciprocal Rank measures an average rank of correct reviewer that an approach can recommend.

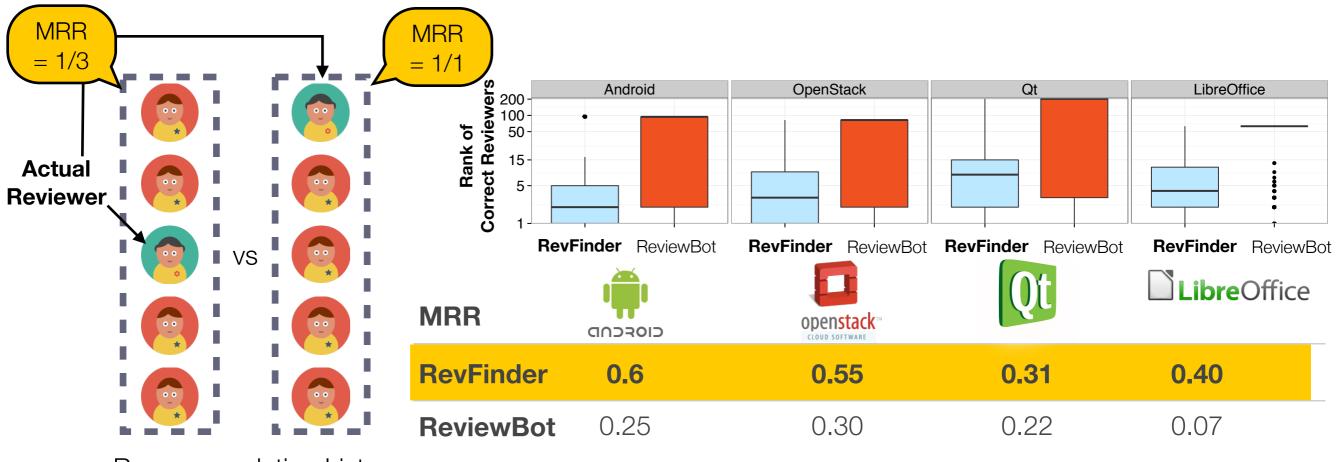


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RevFinder recommended the correct code-reviewers with a median rank of 2 - 8. The code-reviewers ranking of RevFinder is 3 times better than that of ReviewBot.



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"Does RevFinder provide a better ranking of correct reviewers?"

On average, RevFinder can recommend reviewers with a median rank of 4.



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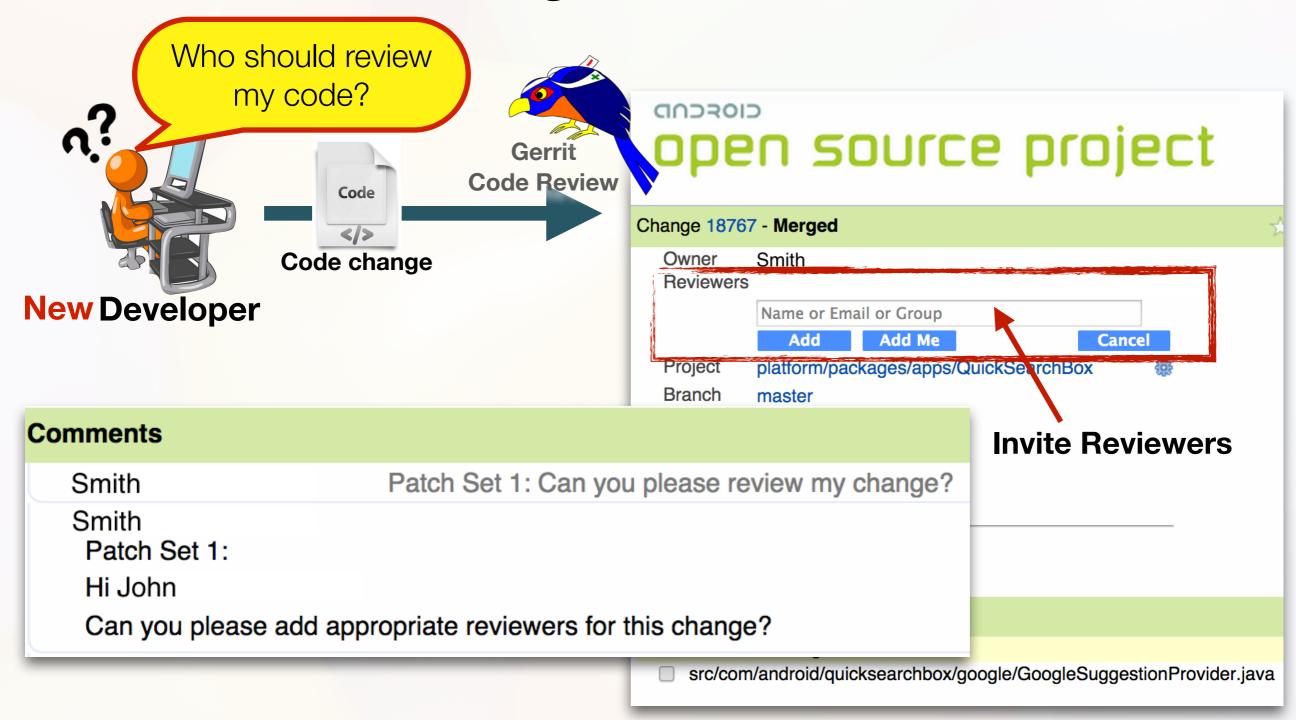


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# Summary

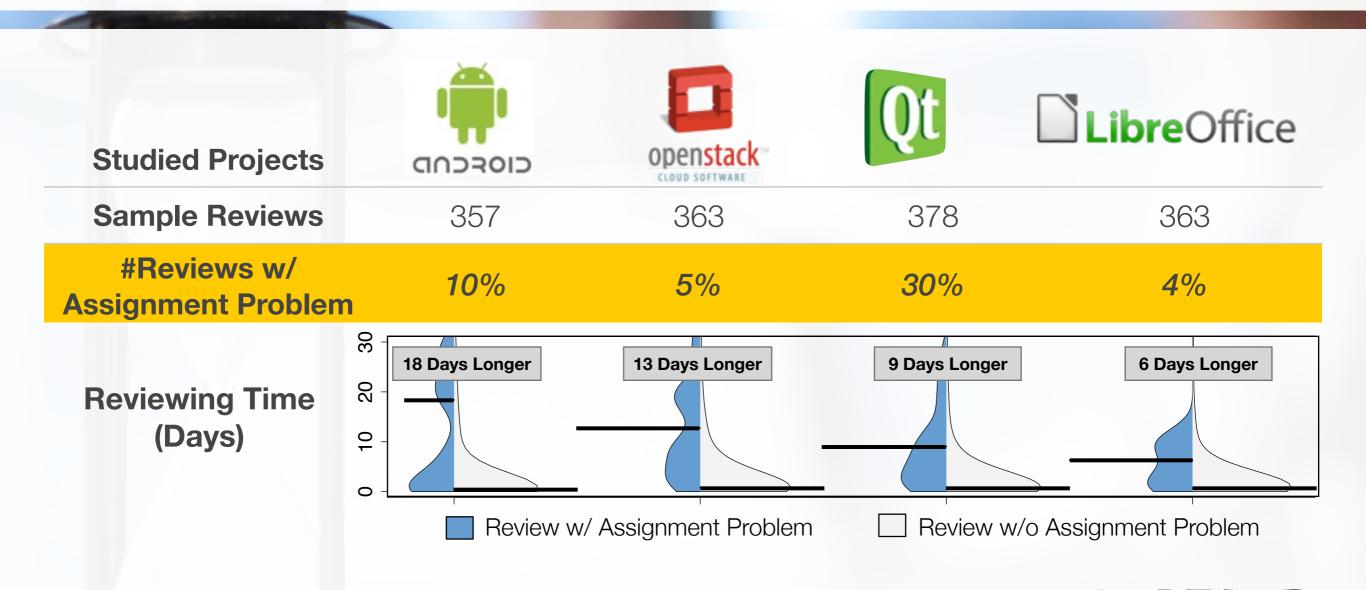
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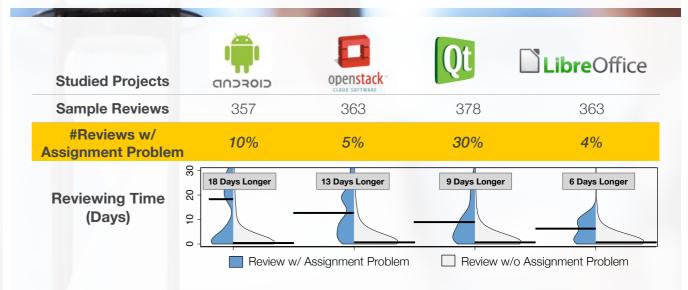
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Reviews with code-reviewer assignment problem significantly take 12 days longer to approve a code change.

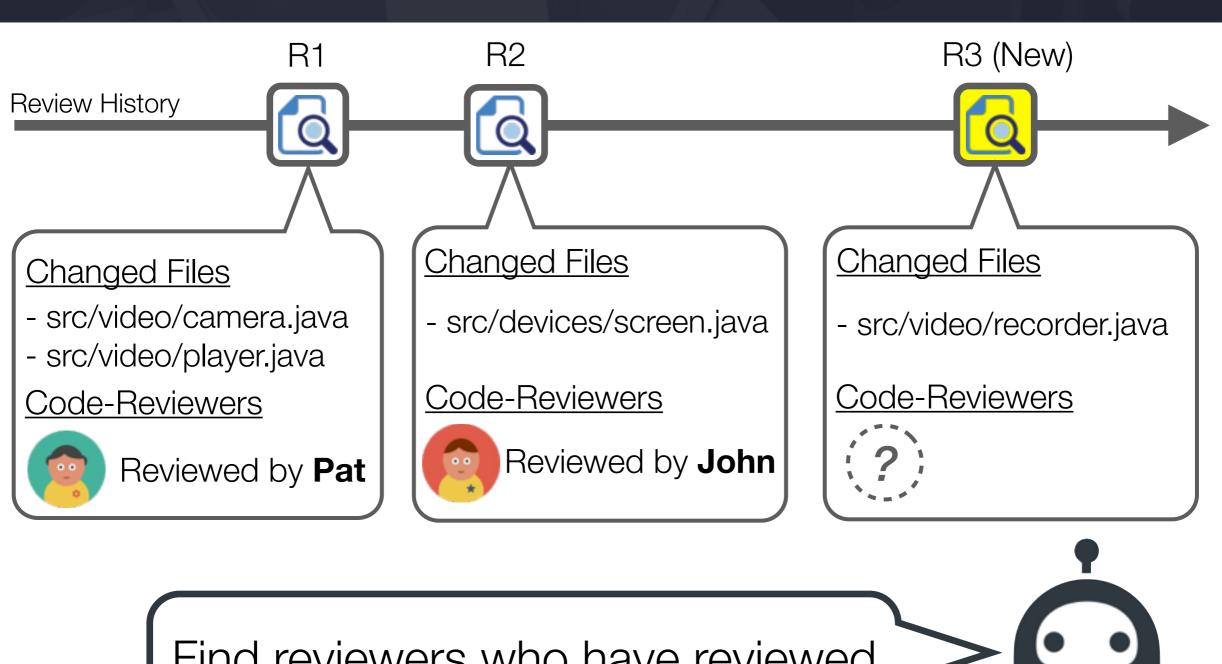
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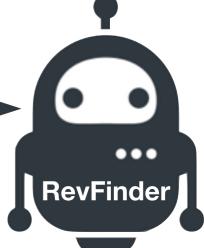


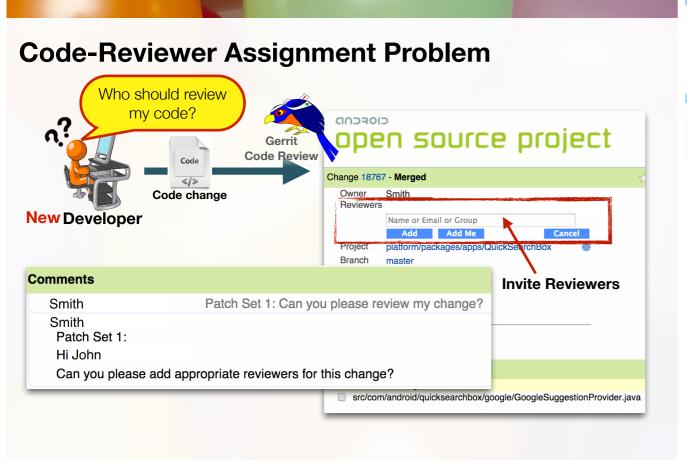
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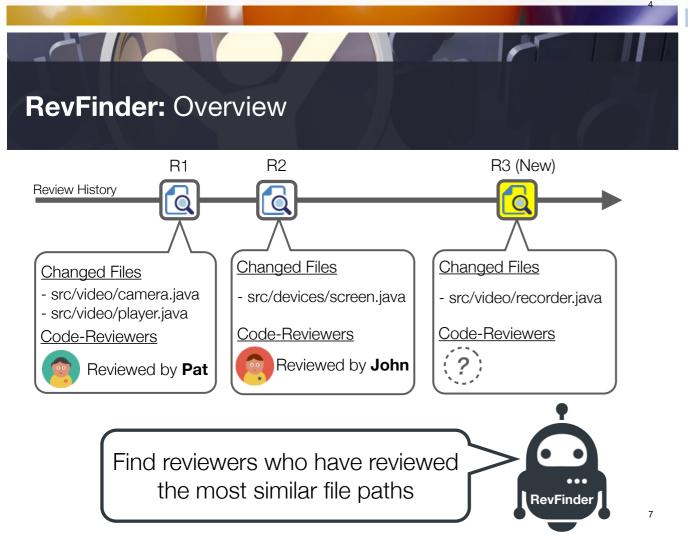
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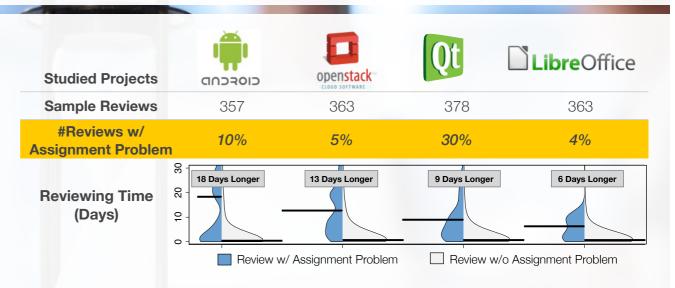
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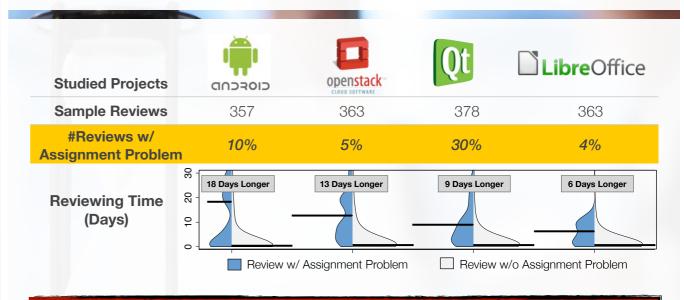


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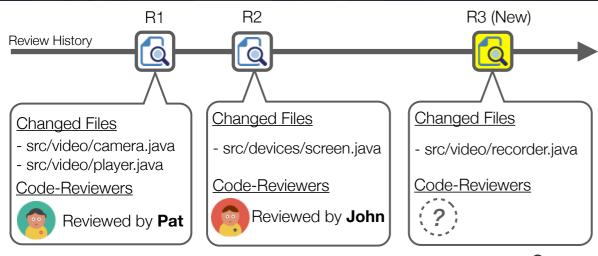
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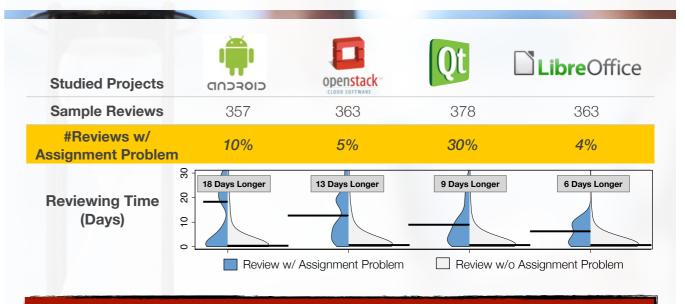


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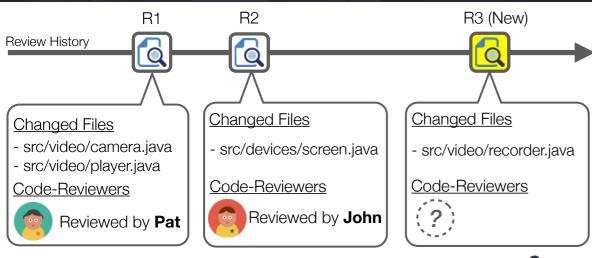
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