# Investigating Code Review Quality: Do People and Participation Matter?

Oleksii Kononenko, Olga Baysal, Latifa Guerrouj, Yaxin Cao, Michael W. Godfrey

Presented by: Zhaoyi Ge



- ► A standard in modern software engineering workflow
- ► Goals:
  - ► Ensure maintainability
  - ► Finding defects





#### Code Review

- ► A standard in modern software engineering workflow
- ► Goals:
  - ► Ensure maintainability
  - ► Finding defects
- ► Factors:
  - Personal factors
  - Participation
- ► Research Questions
  - ► Do code reviewers miss many bugs?
  - ▶ Do personal factors affect the quality of code reviews?
  - ▶ Does participation in code review influence its quality?

#### Mozilla

► Core, Firefox, and Firefox for Android

Mozilla Data Extraction

- ► Core, Firefox, and Firefox for Android
- ► Two-tiered code review process
  - ► Review (162, 25, 11)
  - ► Super-review (30)
- ► Bugzilla

Version Extract commits Assign bug IDs control and their metrics sysytem Get review-Bugzilla Get bug metrics related information 6 Find commits Link commits Final that missed and patches dataset bugs (SZZ)



## **Explanatory Factors**

- ► Technical
  - ► LOC
  - Module
  - Super-review

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  - ► Reviewer experience
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  - ► LOC
  - ► Module
  - Super-review
- Personal
  - ► Reviewer experience
  - ▶ Writer experience
- Participation
  - Number of comments
  - ► Number of developers on CC

### Model Construction and Analysis

- Multiple Linear Regression (MLR):  $y = \beta_0 + \beta_1 x_1 + \beta_2 x_2 + ... + \beta_n x_n$
- ▶ y: Code review quality (Buggy or not)
- $\triangleright x_i$ : Explanatory Factors





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- $\triangleright$   $x_i$ : Explanatory Factors
- ► Transformations:
  - Outliers
  - ► Categorical variables

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- $\triangleright$   $x_i$ : Explanatory Factors
- ► Transformations:
  - Outliers
  - Categorical variables
- ► Collinearity
  - Use VIF Score

#### Result

#### RQ1: Do code reviewers miss many bugs?

System	# Reviews	# Buggy Reviews	% Buggy Reviews
Mozilla-all	28,127	15,188	54.0 %
Core	18,759	10,184	54.3 %
Firefox	2,668	1,447	54.2 %
Firefox4Android	2,160	1,210	56.0 %



#### Result

RQ2: Do personal factors affect the quality of code reviews?

(a) Technical and personal factors.

	Mozilla	Core	Firefox	FF4A
Adjusted R <sup>2</sup>	0.128	0.123	0.173	0.138
Size (LOC)	0.102***	0.098 ***	0.108***	0.115***
Chunks	†	†	†	l †
Number of files	0.058***	0.059 ***	0.109***	0.062*
Module	*	n/a	n/a	n/a
Priority	*	*	<b>‡</b>	
Severity	‡	‡		ļ ‡
Super review	-0.139**	-0.177***		n/a
Review queue	0.017***	0.0204***	0.038**	0.045**
Reviewer exp.	-0.013***	-0.012***	-0.029***	-0.041**
Reviewer exp. (mod.)	†	†	<b>‡</b>	0.018*
Writer exp.		-0.004*	İ ‡	‡
Writer exp. (module)	†	†	ļ ‡	
# prev patches	†	l †	l †	-0.045**
# writer patches	-0.012***			†

Review Queue

Reviewer Exp.



#### Result

RQ3: Does participation in code review influence its quality?

(b) Technical and participation metrics.

	Mozilla	Core	Firefox	FF4A
Adjusted R <sup>2</sup>	0.134	0.128	0.173	0.147
Size (LOC)	0.105***	0.103***	0.105***	0.117***
Chunks	†	†	†	†
Number of files	0.060***	0.059***	0.090***	0.067***
Module	*	n/a	n/a	n/a
Priority	‡	*	‡	*
Severity	*	‡	*	<b>‡</b>
Super review	-0.124***	-0.160***	‡	n/a
# of devs on CC	0.053***	0.056***	‡	0.049*
# comments	†	†	l †	†
# commenting devs	-0.124***	-0.102***	-0.075***	-0.176***
# comments/ # dev	-0.039***	-0.029**	‡	<b>‡</b>
# reviewer comments	0.010**	‡	0.026*	‡
# writer comments				-0.047**

<sup>▶ #</sup> Devs on CC

#### Positive Points

- ► Comprehensive empirical methodology
- ► Insights for everyone

<sup>†</sup>Disregarded during VIF analysis (VIF coefficient > 5).

<sup>\* &</sup>quot;It's complicated": for categorical variables see explanation of the results in Section IV.

FF4A = Firefox for Android.

<sup>▶ #</sup> Reviewer Comment

<sup>‡</sup>Disregarded during stepwise selection. Statistical significance: '\*\*\*' p < 0.001; '\*' p < 0.05; '·'  $p \ge 0.05$ .

## **Negative Points**

#### **Future Work**

- ► Multiple Linear Regression
- ► Lack of actionable items
- ► Is catching bug a good indicator of the quality of code reviews?

Investigations that aims to capture the social context, communication patterns, and interpersonal dynamics that influence review effectiveness.



## Rating

#### **Discussions**

3.5/5. Very approachable paper for outsiders.

- ► What are your explanations for the two surprising factors? Do you agree with the author or not?
- ► What are your takeaways from this paper? Would you do anything differently when doing code reviews after this paper?
- ► What are some of the factors that go beyond technical, people and participation?