## Code Reviews

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Advisor: Fernando Castor (fjclf@cin.ufpe.br)

Co-Advisor: Alexander Serebrenik (a.serebrenik@tue.nl)

# Understanding Confusion in Code Reviews

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## Code Review



## Who is doing Code Review?

















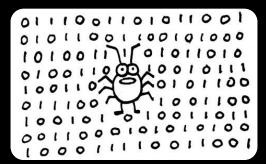




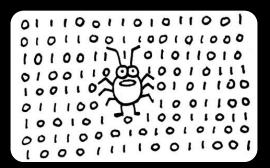








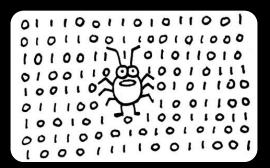
**Find Defects** 



**Find Defects** 



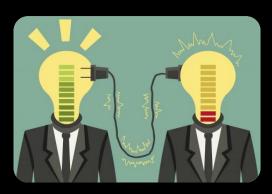
Code Improvement
Alternative Solutions



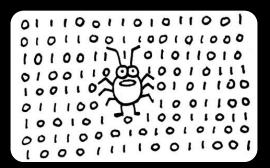
**Find Defects** 



Code Improvement
Alternative Solutions



**Knowledge Transfer** 



**Find Defects** 



**Knowledge Transfer** 



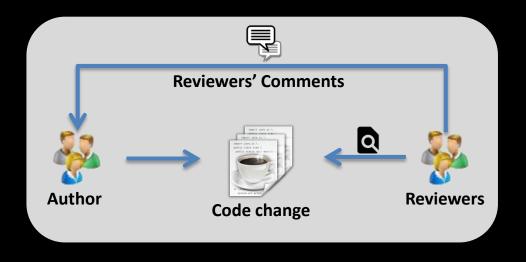
**Code Improvement Alternative Solutions** 



**Team Awareness** 



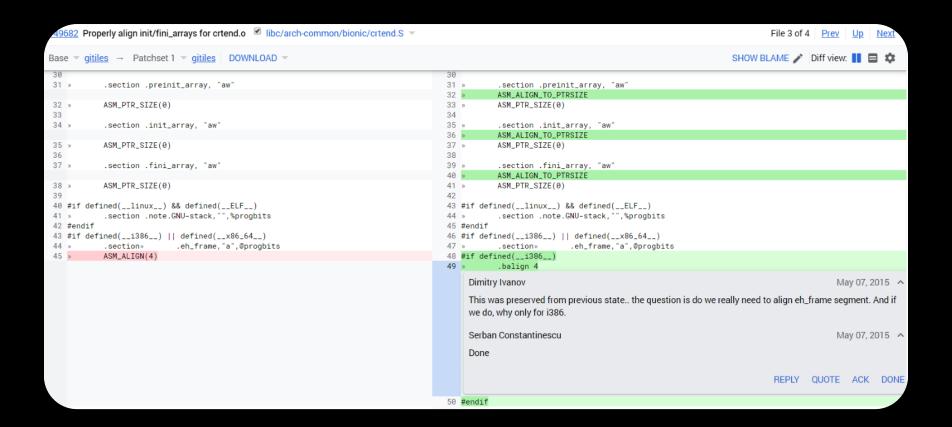


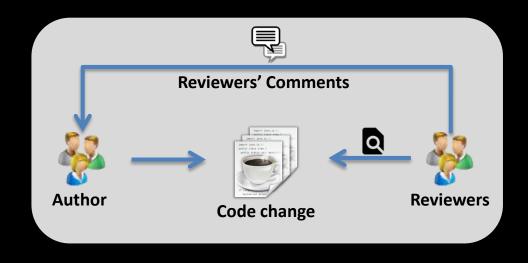


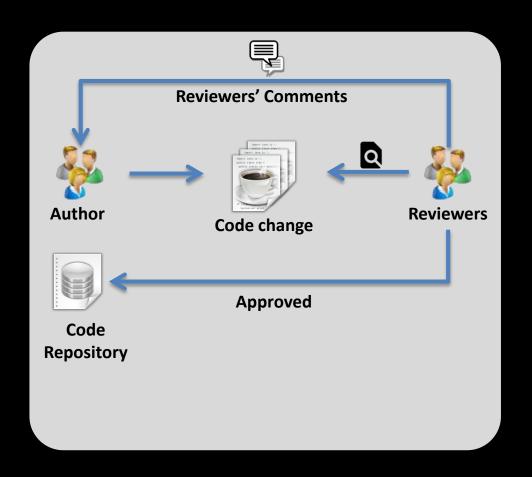
#### **General Comment**

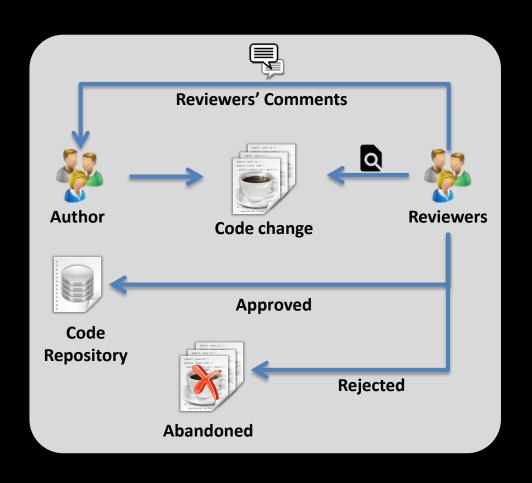
Dimitry Ivanov	Uploaded patch set 2.	Patchset 2	May 07, 2015 7:33 PM	√ V
Dimitry Ivanov	1 comment	Patchset 1	May 07, 2015 7:36 PM	√ V
Elliott Hughes	Code-Review +2	Patchset 2	May 07, 2015 7:37 PM	√l <b>∨</b>
Serban Constantines	cu Added to reviewer. Serban Constantinescu		May 07, 2015 7:45 PM	√l <b>∨</b>
Serban Constantines	Patchset 2	May 07, 2015 7:45 PM	√ N	
	ar with this code. But the code that walks the init_array and fini_array seems stic. Thus I would be in favour of removing the ifndefARM			
	ic was added there for marking the end of the init/fini_array. But now we seem to nd init array sizes using:			
init_array_count_ =	static_cast <uint32_t>(d-&gt;d_un.d_val) / sizeof(ElfW(Addr));</uint32_t>			
fini_array_count_ =	static_cast <uint32_t>(d-&gt;d_un.d_val) / sizeof(ElfW(Addr));</uint32_t>			
Snippets from link	er/linker.cpp			

#### Inline Comment

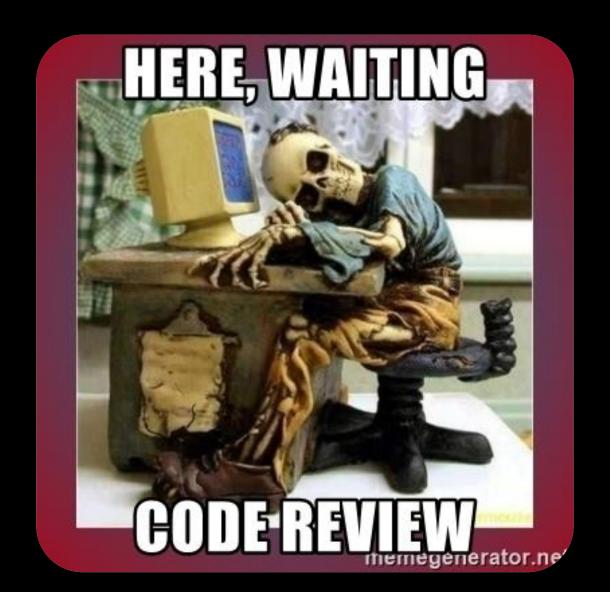








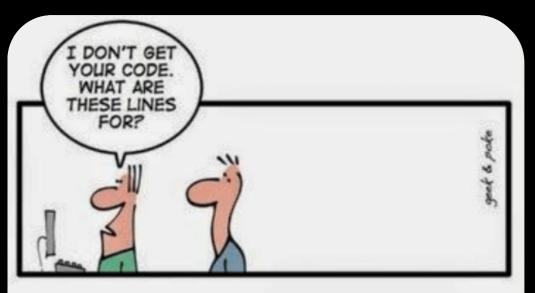
#### Code Reviews Are Not Free!!!



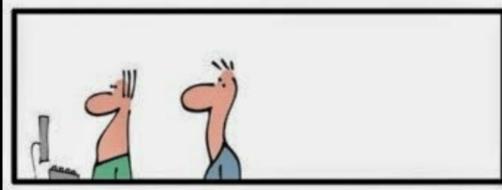
## To study confusion in code reviews, its manifestations, causes, and impacts



- > Lack of knowledge
- > Lack of tools



## Why confusion?!





#### What is confusion?!

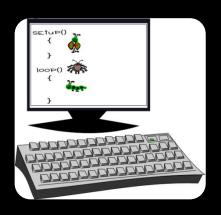
a situation where a person is uncertain about or unable to understand something

## The impacts of confusion!



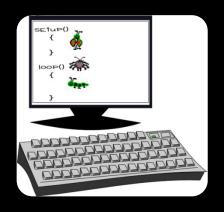
## The impacts of confusion!



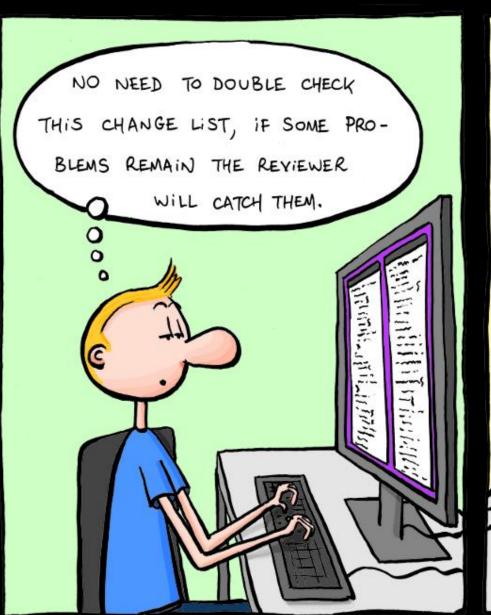


## The impacts of confusion!

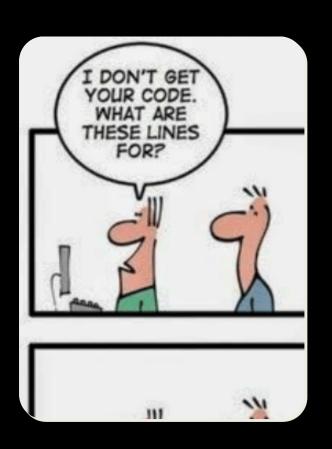












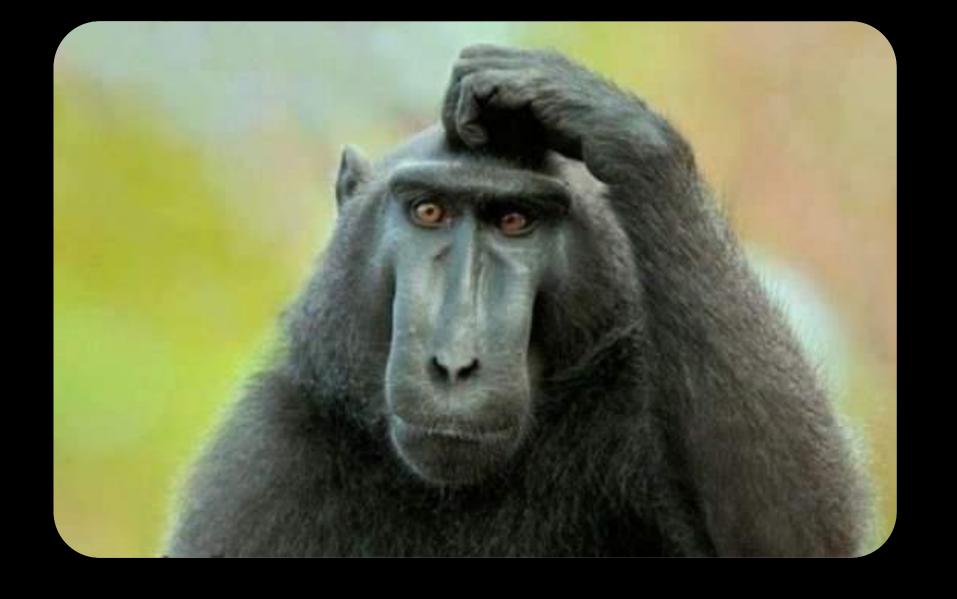
I'm unsure as to whether the loop is necessary here for the same reason as above, or whether the array actually needs to be reset to handle disk changes.

Patch Set 2: Code-Review+2

Though **I don't really understand** why ValueObject moved to runtime...

#### Patch Set 1:

What's the context? Is this fixing/improving existing code? Could you use the assembler tests for it?



How to identify confusion?

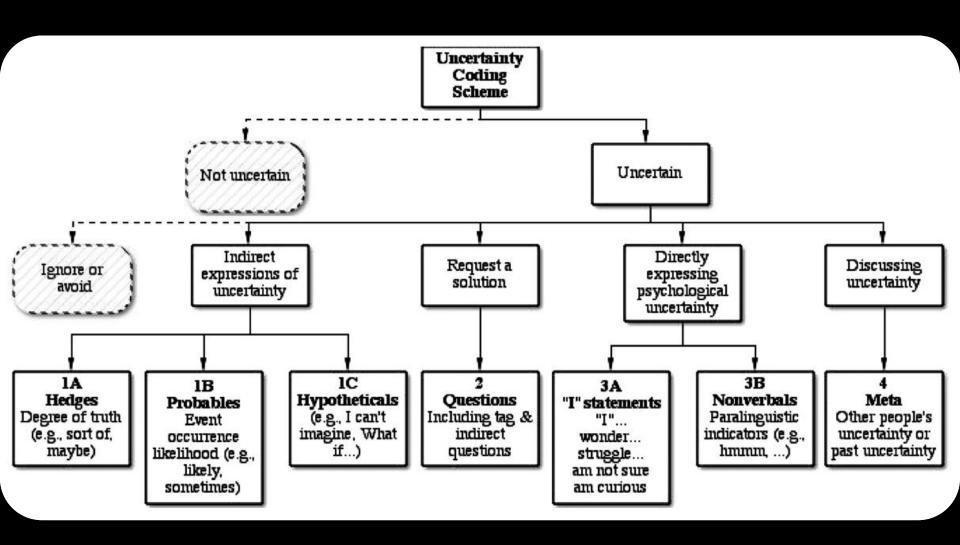
# Confusion Detection in Code Reviews

#### 1<sup>st</sup> Study

#### Research Questions

 RQ1: Can human raters agree on the presence of confusion in code review comments?

 RQ2: Is it possible to design a tool to recognize confusion in developers' comments?



Michelle E. Jordan et al., "Expressing uncertainty in computer-mediated discourse: Language as a marker of intellectual work," Discourse Processes, vol. 49, no. 8, pp. 660–692, 2012.

#### Gerrit Code Review

← → C 🛍 android-review.googlesource.com/q/status:open												☆	0							
pen Source Project CHANGES DOCUMENTATION BROWSE				Q status	s:open										Repositories Sign in					
ubject	Status	Owner	Assignee	Repo	Branch	Update	ed Size	e AAR	AR	Α	BCO	CR	GA	L	OSL	ORV	V PLV	PR	PV	1
end offload status changed callback	-	Mark Chien	-	/frameworks/base	master	09:00	M								+1			✓		
ethering: add isTetheringSupported with callerPkg parameter	-	Mark Chien	-	/frameworks/base	master	09:00	S		<b>√</b>			✓			+1			✓		
upport static address configuration	-	Mark Chien	-	/frameworks/base	master	08:59	M								+1			✓		
erge remote-tracking branch 'aosp/upstream-mirror' into aosp-master	-	Geoff Lang	-	/external/angle	master	08:58	XL							+1				✓		
dd explicit state for heapprofd hooking.	WIP	Florian Mayer	-	platform/bionic	master	08:58	M													
ifi: Stop using NetworkAgent.setIsAvailable()	-	Chalard Jean	-	/net/wifi	master	08:57	XS					✓		+1	+1			✓		
low libstatssocket to be dynamically loaded	-	Ruchir Rastogi	-	/modules/DnsResolver	master	08:55	XS					✓		+1	+1			✓		
minijail: refresh lib{syscalls constants}gen.c for linux-x86 host		Steve Kim	Steve Kim	/external/minijail	master	08:53	XL					+1		+1					✓	
et bpmodify usage function	-	Yo Chiang	-	/build/blueprint	master	08:49	XS								+1					+
ts] Add kernel_net_tests to vts-core test suite	-	Kelly Hung	-	kernel/tests	master	08:49	XS					+1						✓		
dd hashes	-	Paul Trautrim	-	/system/netd	master (aidl_update_hashes)	08:49	XS	✓				1		+1	+1					
dd hashes, remove trailing dash	-	Paul Trautrim	-	/modules/NetworkStack	master (aidl_update_hashes)	08:49	S	✓				1		+1	+1					

#### Table of Contents

Endpoints

Protocol Details

Authentication

**CORS** 

Preconditions

Output Format

Input Format

Timestamp Encoding

Response Codes

Request Tracing

#### Gerrit Code Review - REST API

Version V3.1.3-1828-G9eb72e8526 |

Gerrit Code Review comes with a REST like API available over HTTP. The API is suitable for automated tools to build upon, as well as supporting some ad-hoc scripting use cases.

See also: REST API Developers' Notes.



#### /access/

Access Right related REST endpoints

#### /accounts/

Account related REST endpoints

#### /changes/

Change related REST endpoints

#### /config/

Config related REST endpoints

#### <u>/groups/</u>

Group related REST endpoints

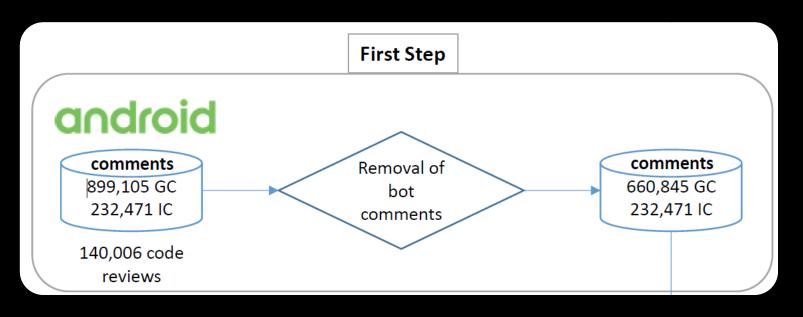
#### <u>/plugins/</u>

Plugin related REST endpoints

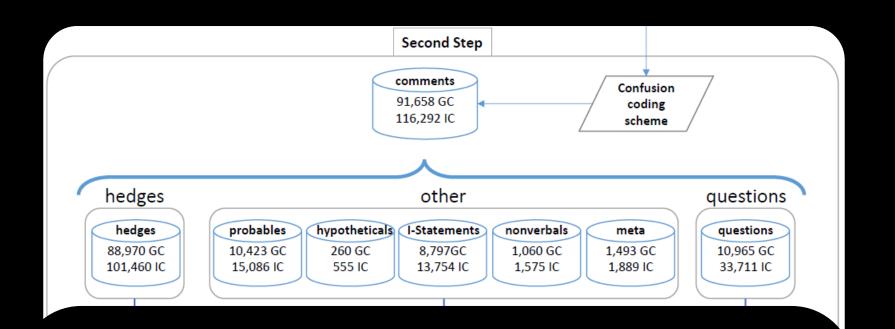
#### <u>/projects/</u>

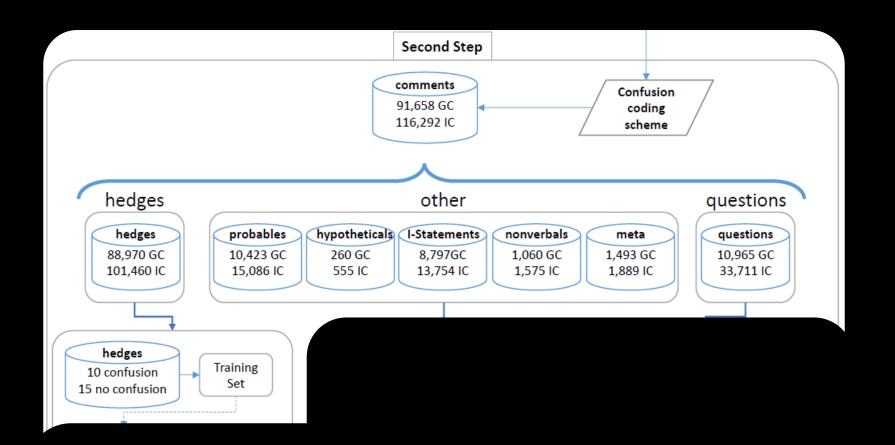
Project related REST endpoints

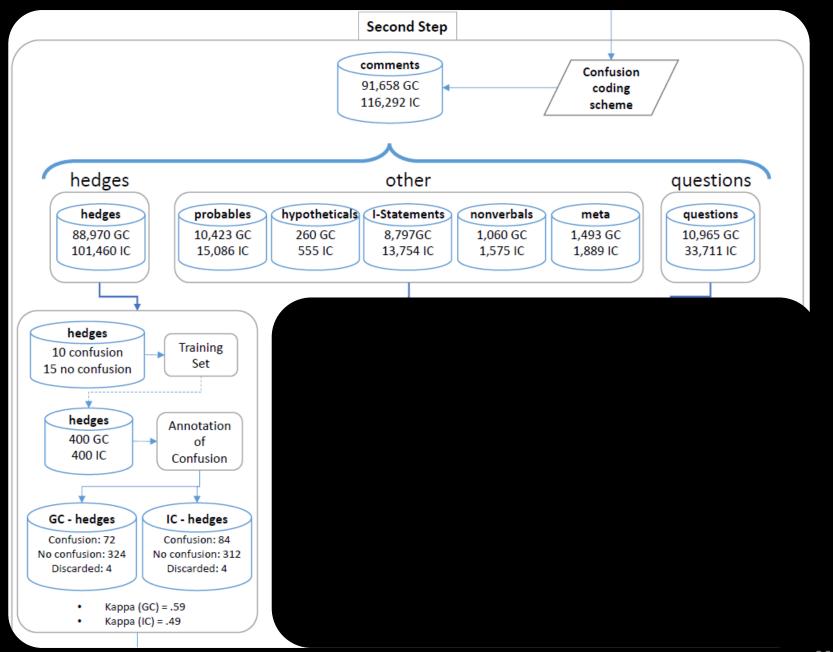
#### **Documentation**

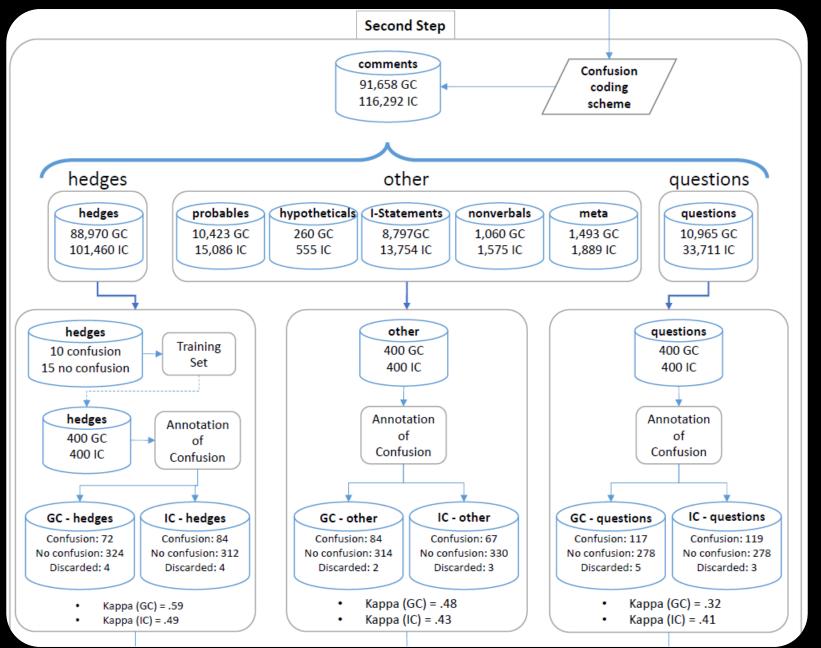


- GC general comment
- IC inline comment









#### **General Comments**

Confusion: 273

No confusion: 916

Total: 1,189

#### Datasets

comprising

1,136 code reviews

#### **Inline Comments**

Confusion: 270

No confusion: 920

Total: 1,190

# RQ1



Confusion: 72 No confusion: 324 Discarded: 4 IC - hedges

Confusion: 84 No confusion: 312 Discarded: 4

- Kappa (GC) = .59
- Kappa (IC) = .49

GC - other

Confusion: 84 No confusion: 314 Discarded: 2 IC - other

Confusion: 67 No confusion: 330 Discarded: 3

- Kappa (GC) = .48
- Kappa (IC) = .43

GC - questions

Confusion: 117 No confusion: 278 Discarded: 5 IC - questions

Confusion: 119 No confusion: 278 Discarded: 3

- Kappa (GC) = .32
- Kappa (IC) = .41



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#### Precision

		Р	R	F
OneR	GC	.875	.194	.318
	IC	.615	.095	.165

#### Recall

		Р	R	F
Multinomial Naive Bayes	GC	.209	.944	.342
ivalve bayes	IC	.234	.988	.378

#### Precision and Recall

		Р	R	F
JRip	GC	.696	.542	.609
Logistic	IC	.434	.583	.497



#### Precision

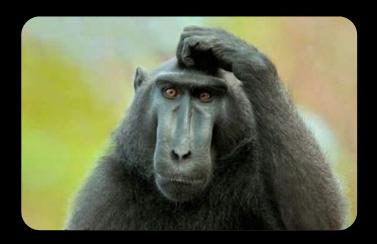
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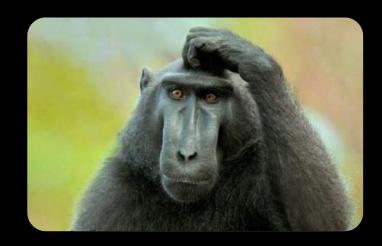
- Automatic detection of confusion:
  - Feasible task
  - Gold standard set



- Automatic detection of confusion:
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  - Gold standard set
- Harder to identify confusion:
  - Inline comments



- Automatic detection of confusion:
  - Feasible task
  - Gold standard set
- Harder to identify confusion:
  - Inline comments
- "no-confusion" comments:
  - Suggestions
  - Politeness



# Confusion in Context

Reasons, impacts, and coping strategies

### 2<sup>nd</sup> Study

# Methodology



"what developers say"

//cluster/src/main/java/androidx/car/cluster/navigation/ProducerStatus.java:

Line 51: The purpose of this class (ProducerStatus) is to allow the producer to send a status to the consumer for it to be displayed. The consumer doesn't need to do anything special about any of these values. All it needs to do is to display this to the user in whichever way matches their UX design.

This class was the "Notice" string before (e.g. "Re-routing"). By making this an enum the consumer has better opportunity to understand what they mean and represent this signal in the most convenient way (or completely ignore it if they wish).

In any case: I agree with Harry, for the sake of speed I'm removing this enum from the CL.

car/cluster/src/main/java/androidx/car/cluster/navigation/Side.java:

Line 20: Moved inside LaneDirection.

car/cluster/src/main/java/androidx/car/cluster/navigation/StepCue.java:

Line 32: I would ask you to check this with Harry. I'm not sure what the examples would be and you guys are the domain experts here ;-).

In my opinion, this object is useless as is. The proto on path finder has a lot more interesting data for rendering:

https://cs.corp.google.com/piper///depot/google3/maps/pathfinder/client/step.proto?rcl=198890032&l=127.

Please let's take advantage that you and Harry are in the same timezone to set this questions within the same day.

Another class to drop until we have more details on what we want?

car/cluster/src/main/java/androidx/car/cluster/navigation/Time.java:

Line 37: Done

"what developers do"

# Survey

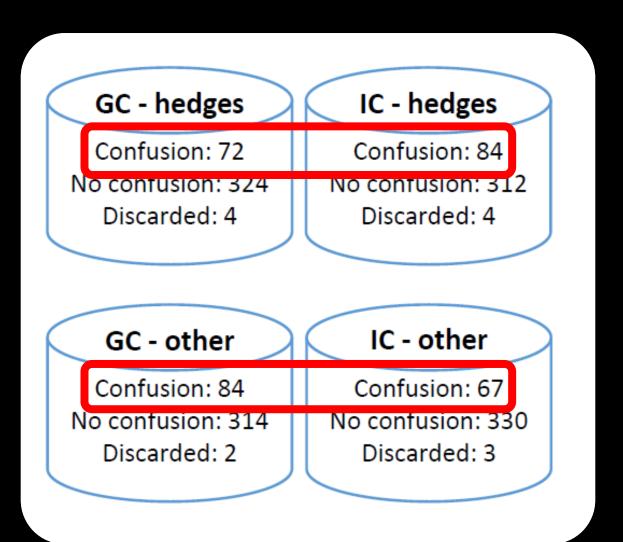
How often do you feel confused...?

What usually makes you confused...?

What is the impact of confusion...?

What do you usually do to overcome confusion...?

# **Code Review Comments**



# Card sorting! Card sorting! Card sorting!















# What Developers Say?

- 1<sup>st</sup> survey:
  - Android developers
  - 17 responses
  - Response rate: 0.45%

- 25 reasons
- 14 impacts
- 13 coping strategies

# What Developers Say?

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- 2<sup>nd</sup> survey:
  - Facebook & Twitter
  - 24 responses

- 25 reasons
- 16 impacts
- 14 coping strategies

# What Developers Say?

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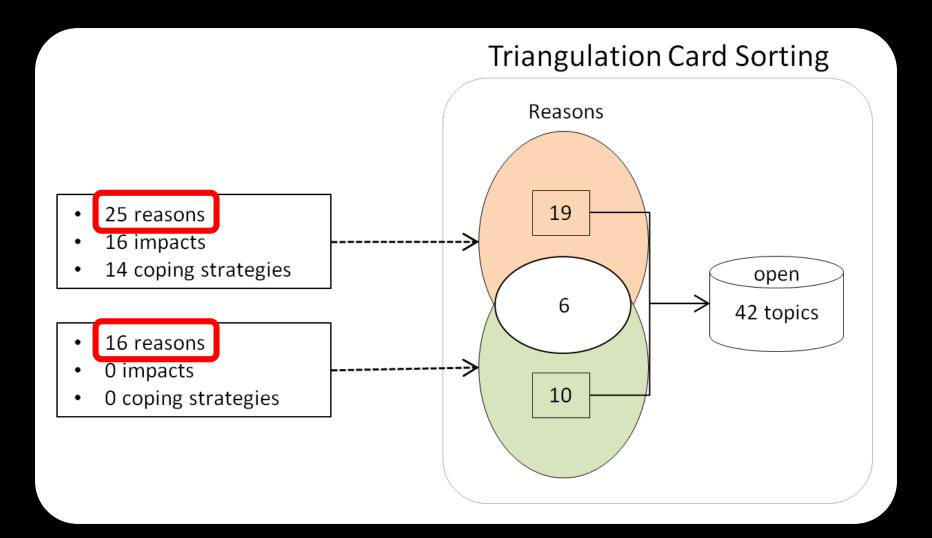
# What Developers Do?

• 156 General Comments

- 16 reasons
- 0 impacts
- 0 coping strategies

151 Inline Comments

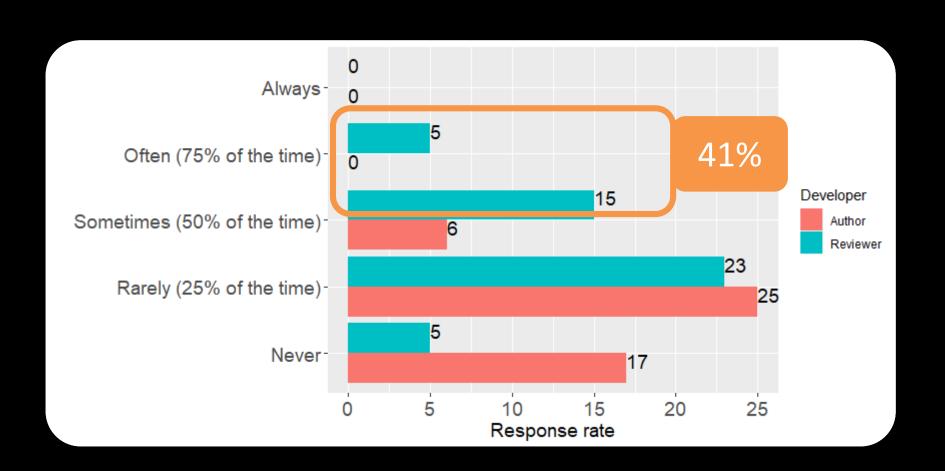
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- 0 coping strategies



# Confusion in Context Model Finalisation

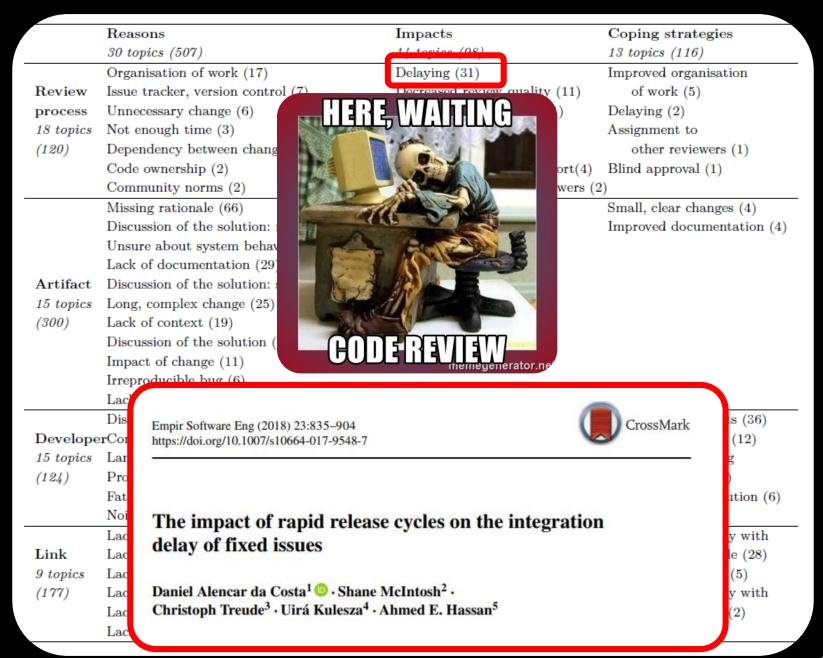
- 30 reasons
- 14 impacts
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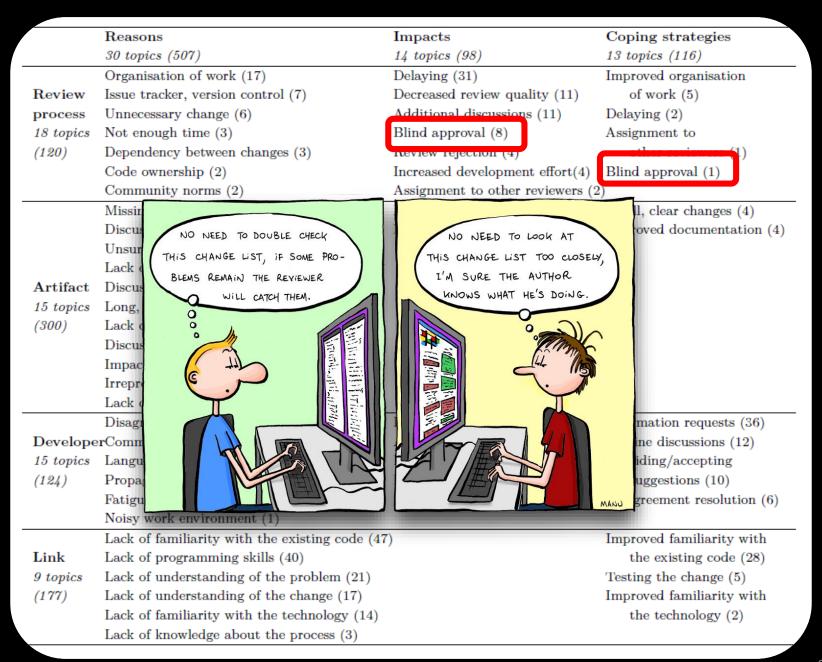
# Frequency of Confusion



	Reasons	Impacts	Coping strategies
	30 topics (507)	14 topics (98)	13 topics (116)
	Organisation of work (17)	Delaying (31)	Improved organisation
Review	Issue tracker, version control (7)	Decreased review quality (11)	of work (5)
process	Unnecessary change (6)	Additional discussions (11)	Delaying (2)
$18\ topics$	Not enough time (3)	Blind approval (8)	Assignment to
(120)	Dependency between changes (3)	Review rejection (4)	other reviewers $(1)$
	Code ownership (2)	Increased development $effort(4)$	Blind approval (1)
	Community norms (2)	Assignment to other reviewers (2	2)
	Missing rationale (66)	Better solution (1)	Small, clear changes (4)
	Discussion of the solution: non-func. (49)	Incorrect solution (1)	Improved documentation (4)
	Unsure about system behavior (37)		
	Lack of documentation (29)		
Artifact	Discussion of the solution: strategy (29)		
$15\ topics$	Long, complex change (25)		
(300)	Lack of context (19)		
	Discussion of the solution (14)		
	Impact of change (11)		
	Irreproducible bug (6)		
	Lack of tests (5)		
	Disagreement (18)	Decreased confidence (10)	Information requests (36)
Developer	Communicative intention (9)	Abandonment (6)	Off-line discussions (12)
$15\ topics$	Language issues (3)	Frustration (5)	Providing/accepting
(124)	Propagation of confusion (3)	Propagation of confusion (2)	suggestions (10)
	Fatigue (1)		Disagreement resolution (6)
	Noisy work environment (1)		
	Lack of familiarity with the existing code (47	")	Improved familiarity with
Link	Lack of programming skills (40)		the existing code $(28)$
$9\ topics$	Lack of understanding of the problem (21)		Testing the change (5)
(177)	Lack of understanding of the change (17)		Improved familiarity with
	Lack of familiarity with the technology (14)		the technology (2)
	Lack of knowledge about the process (3)		

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Artifact	Di 2018 ACM/IEEE 11th International Workshop o	on Cooperative and Human Aspects of So.	ftware Engineering
$15\ topics$	Lo		
(300)	La		
	Di		
	In Co. 1 Co.		
	In The Structure of Soi	ftware Design Discuss	sions
	La Giovanni Viviani	Calaban Ianila	Ionas
	Di University of British Columbia	Calahan Janik University of To	
Developer		cal.janik.jones@mail.	
15 topics	La Milla Paradia	0.10.14	ng
(124)	Michalis Famelis Université de Montréal	Gail C. Mur University of British	
	Fa famelis@iro.umontreal.ca	murphy@cs.ul	
	Noisy work environment (1)	1,0	
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#### Writing Acceptable Patches: An Empirical Study of Open Source Project Patches

Yida Tao\*, DongGyun Han† and Sunghun Kim\* \*Department of Computer Science and Engineering The Hong Kong University of Science and Technology {idagoo, hunkim}@cse.ust.hk <sup>†</sup>KAIST Institute for IT Convergence Korea Advanced Institute of Science and Technology handk@kaist.ac.kr

Delaying (2) Assignment to other reviewers (1) Blind approval (1)

Coping strategies

Improved organisation

Small, clear changes (4)

of work (5)

13 topics (116)

ther reviewers (2)

pment effort(4)

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(8)

n (4)

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Discussion of the solution: non-func. (49) Unsure about system behavior (37) Lack of documentation (29)

Artifact 15 topics

(300)

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Lack of tests (5)

Disagreement (18)

Detter Sommoli

2015 IEEE/ACM 37th IEEE International Conference on Software Engineering

#### Helping Developers Help Themselves: Automatic Decomposition of Code Review Changesets

Mike Barnett Microsoft Research Redmond, WA, USA mbarnett@microsoft.com

Christian Bird Microsoft Research Redmond, WA, USA cbird@microsoft.com

João Brunet Federal University of Campina Grande Campina Grande, Paraíba, Brazil joao.arthur@computacao.ufcg.edu.br

Shuvendu K. Lahiri Microsoft Research Redmond, WA, USA shuvendu@microsoft.com

Decreased confidence (10)

2015 12th Working Conference on Mining Software Repositories

#### Partitioning Composite Code Changes to Facilitate Code Review

Yida Tao and Sunghun Kim The Hong Kong University of Science and Technology Department of Computer Science and Engineering {idagoo, hunkim}@cse.ust.hk

Information requests (36)

Off-line discussions (12) Providing/accepting

suggestions (10)

Disagreement resolution (6)

Improved familiarity with the existing code (28)

Testing the change (5)

Improved familiarity with

the technology (2)

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- Confusion is present!
  - "Developers said!" (survey)
  - "Developers did!" (code review comments)

- Confusion is present!
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- Confusion in context:
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  - 14 impacts
  - 13 coping strategies

- Confusion is present!
  - "Developers said!" (survey)
  - "Developers did!" (code review comments)

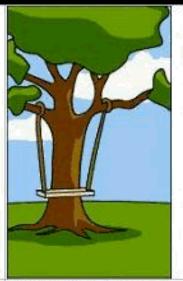
- Confusion in context:
  - 30 reasons
  - 14 impacts
  - 13 coping strategies
- Topics not studies yet!

# Communicative Intentions of Questions

# 3<sup>rd</sup> Study



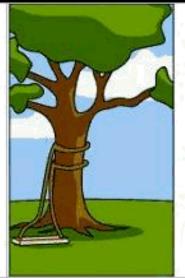
How the customer explained it



How the project leader understood it



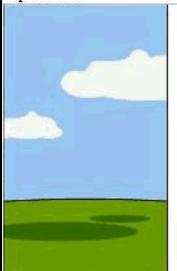
How the analyst designed it



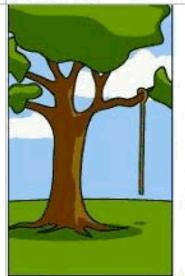
How the programmer wrote it



How the sales executive described it



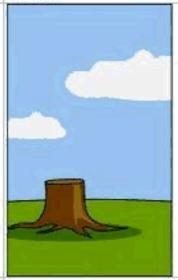
How the project was documented



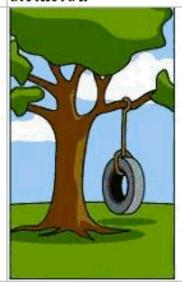
What operations installed



How the customer was billed



How the helpdesk supported it



What the customer really needed



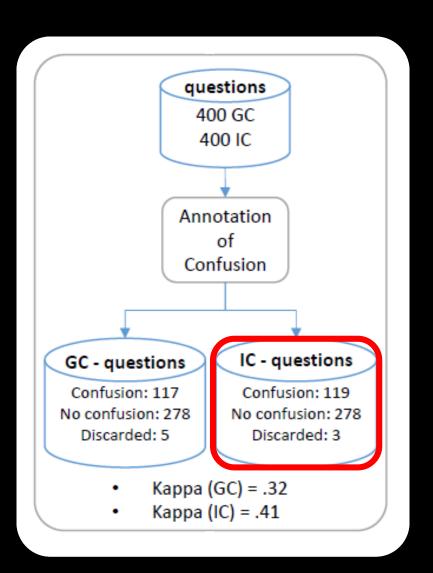
What do you mean when you ask a question?

# Communicative Intentions of Questions

 RQ1: How frequent are questions in code reviews?

 RQ2: What are the communicative intentions expressed in the developers' questions in code reviews?

# Dataset



# **Exploratory Case Study**

- First step:
  - 25 comments -> 49 questions
  - 11 categories

# **Exploratory Case Study**

- First step:
  - 25 comments -> 49 questions
  - 11 categories

- Second step:
  - 400 comments -> 499 questions
  - 12 categories

# How frequent are questions in code reviews?

	Number of questions
General comments	12,686 (25%)
Inline comments	37,712 (75%)
Total	50,398

# How frequent are questions in code reviews?

	Number of questions
General comments	12,686 (25%)
Inline comments	37,712 (75%)
Total	50,398

	General comments	Inline comments
With at lest one Question	10,965 (1,65%)	33,711 (14,50%)
Without any Questions	649,880 (98%)	198,760 (85%)
Total	660,845	232,471

# Soliciting an action

Suggestion

"Maybe introduce an additional line between 'abc' and 'def'?"

Request for action

"Can you make these different?"

# Information seeking

Information

"When can this be null?"

Confirmation

"Shouldn't this just be a failure?"

Rationale

"Why is this included?"

Clarification

"Can you clarify what you mean?"

Opinion

"Which name do you suggest?"

# **Attitudes and Emotions**

### Criticism

"Do you really want to return the address of a local variable here?"

# Anger

"wtf? you really want reflection here?"

# Surprise

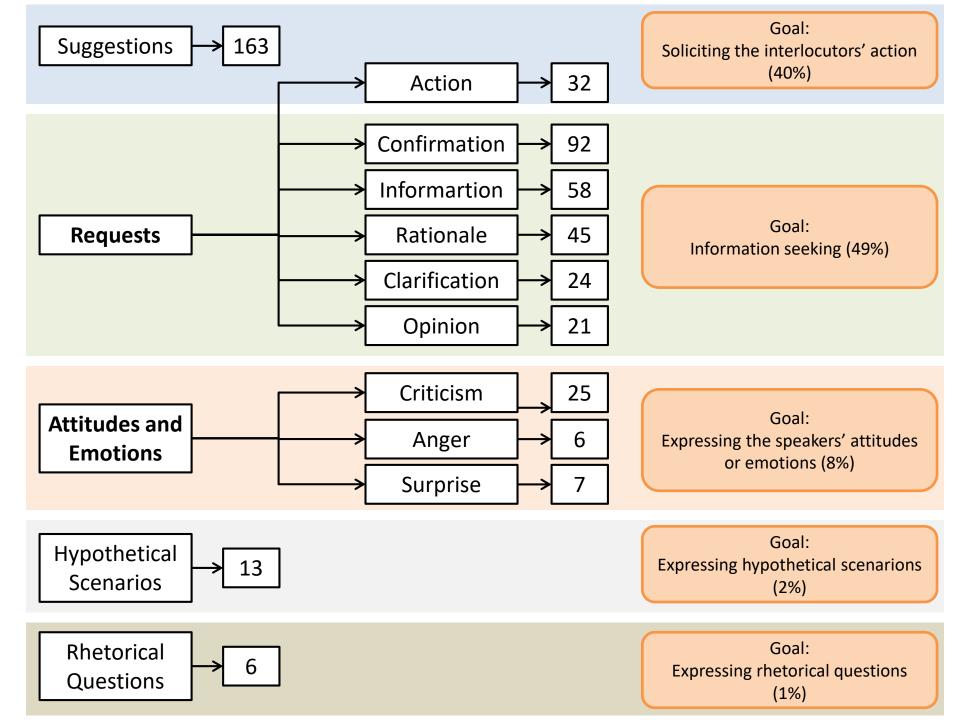
"Is this true? That seems mildly surprising"

# Hypothetical scenarios

"What about if an already Jack server is running?"

# Rhetorical questions

"Isn't the case that you illustrated (0.9ms being decremented as 0) applicable in both solutions? Yes"



Questions are more present in the IC than GC

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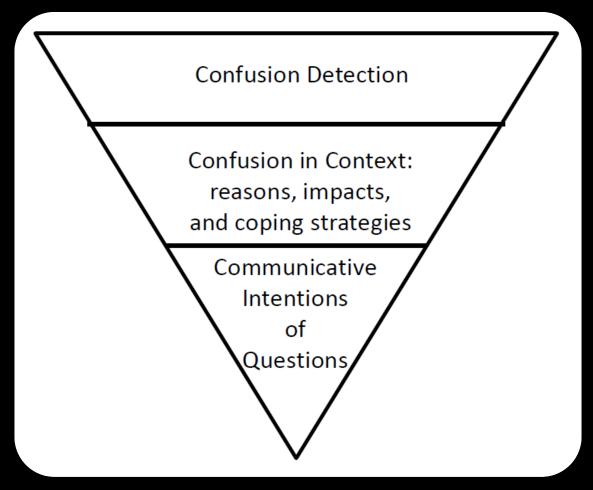
Questions:

Not only information seeking

Suggestions

Attitude and emotions

# **Understanding Confusion in Code Reviews**



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