

# Mining Questions About Software Energy Consumption

Gustavo Pinto<sup>1,2</sup>, Fernando Castor<sup>1</sup>, Yu David Liu<sup>2</sup>

<sup>1</sup>Federal University of Pernambuco  
Recife, Brazil

<sup>2</sup>SUNY Binghamton  
Binghamton, US

# The Problem

- Energy efficiency is becoming a key design consideration.
- A large body of work in hardware/architecture, operating systems, runtime systems.



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- Energy efficiency is becoming a key design consideration.
- A large body of work in hardware/architecture, operating systems, runtime systems.
- But...
  - what about the application level?
  - what do programmers *think* about this problem?

# The Goal

1. Whether application programmers are interested in software energy consumption, and, if so
2. How they are dealing with energy issues?



2M+ Users

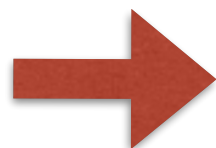
5M+ Questions

10M+ Answers

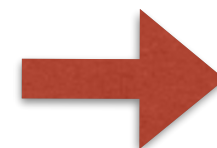
50GB+ of data



5M Questions



Automatic Filter



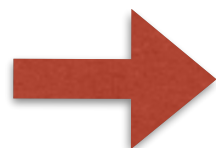
Manual Filter



Final Data

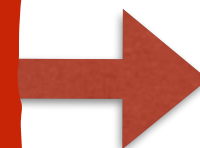


5M Questions



Automatic Filter

615 Questions  
1,197 Answers



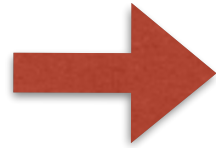
Manual Filter



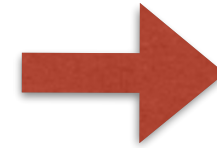
Final Data



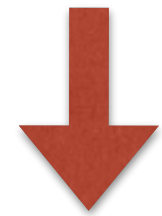
5M Questions



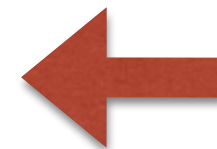
Automatic Filter



Manual Filter



Final Data



325 Questions  
558 Answers

**Base Group**

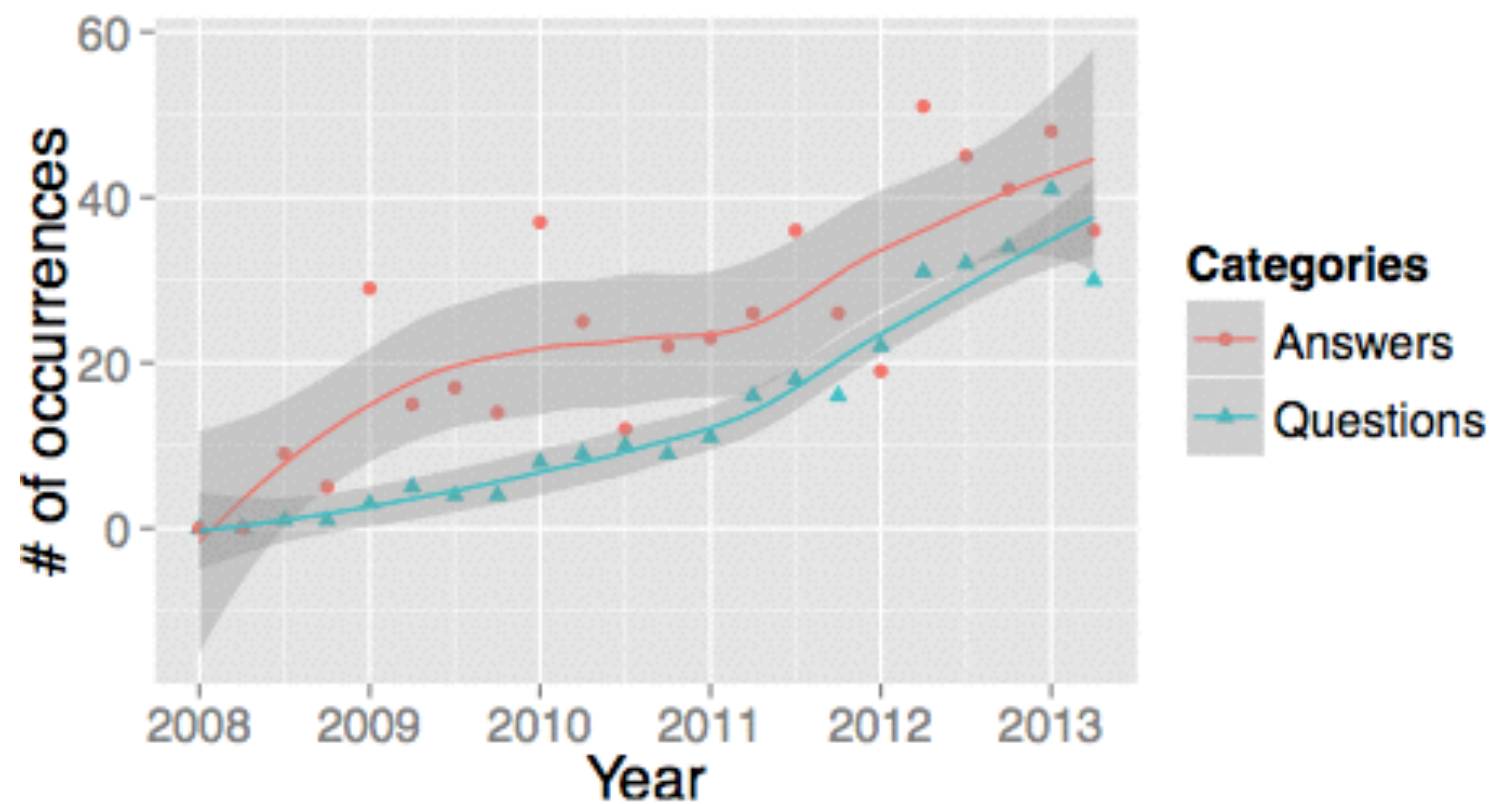
from 2008 to 2013



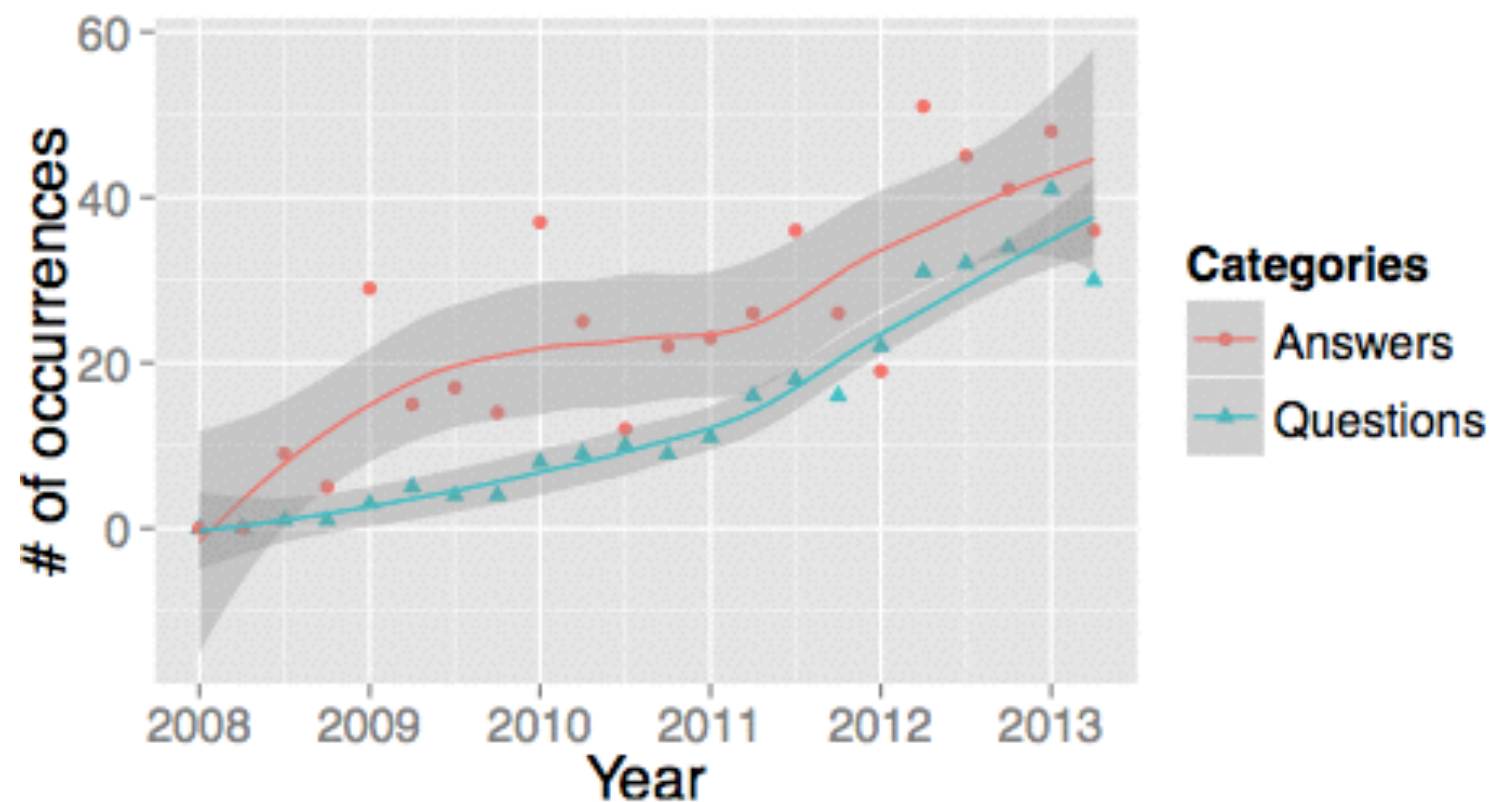
# Research Questions

- **RQ1:** What are the distinctive **characteristics** of energy-related questions?
- **RQ2:** What are the most common energy-related **problems** faced by software developers?
- **RQ3:** What are the main **causes** for software energy consumption problems?
- **RQ4:** What **solutions** do developers employ or recommend to save energy?

# RQ1: Characteristics



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85% of Q. have A.  
(45% are answered  
successfully)

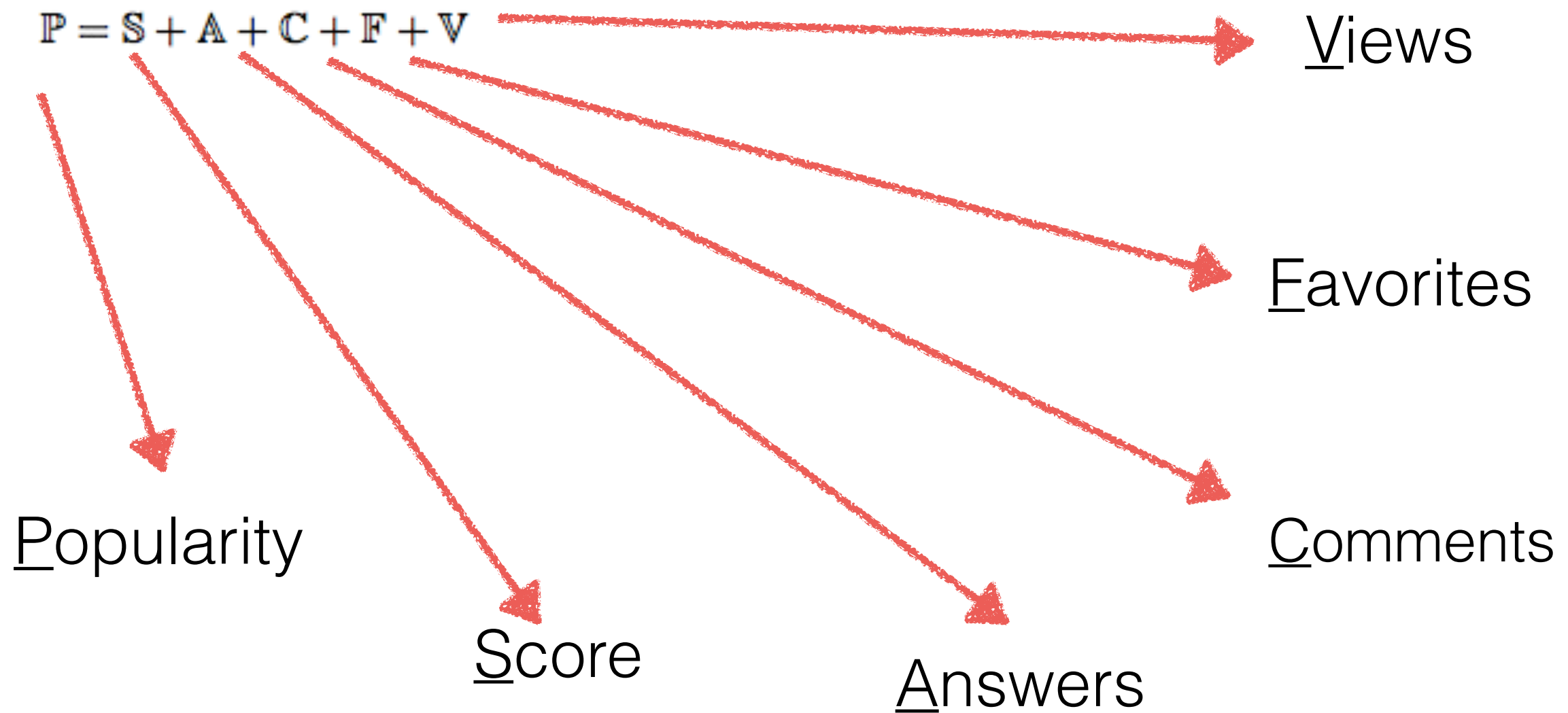
No obvious “energy  
expert”

1/4 of questions are  
from mobile dev.

# RQ1: Characteristics

$$P = S + A + C + F + V$$

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$$\mathbb{P} = S + A + C + F + \mathbb{V}$$

Normalized as



$$\mathbb{V} = \text{questionsViews} / \text{stackoverflowViews}$$

StackOverflow  $\mathbb{P}$  is 5

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$$P = S + A + C + F + V$$

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	Studied Questions	Median
S	1.10	1.00
A	2.67	1.00
C	1.11	1.00
F	3.89	0.00
V	1.68	1.00
P	10.45	—

StackOverflow  $\mathbb{P}$  is 5

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More  
*interesting* than  
the average  
SO questions

StackOverflow  $\mathbb{P}$  is 5



# RQ2: Problems

- Measurements  
(59/97 — Q/A)
- General  
Knowledge  
(40/84 — Q/A)
- Code design  
(36/133 — Q/A)
- Context-specific  
(83/110 — Q/A)
- Noise (107/134 — Q/A)

*“I want to measure the energy consumption of my own application (which I can modify) [...] on Windows CE 5.0 and Windows Mobile 5/6. Is there some kind of API for this?”*

- Measurements (59/97 — Q/A)
- General Knowledge (40/84 — Q/A)
- Code design (36/133 — Q/A)
- Context-specific (83/110 — Q/A)
- Noise (107/134 — Q/A)

*“Can a code optimized for least MCPS be guaranteed to have least power consumption as well?”*

- Measurements (59/97 — Q/A)
- General Knowledge (40/84 — Q/A)
- Code design (36/133 — Q/A)
- Context-specific (83/110 — Q/A)
- Noise (107/134 — Q/A)

*“Are there any s/w high level design considerations [...] to make the code as power efficient as possible?”*

- Measurements (59/97 — Q/A)
- General Knowledge (40/84 — Q/A)
- Code design (36/133 — Q/A)
- Context-specific (83/110 — Q/A)
- Noise (107/134 — Q/A)

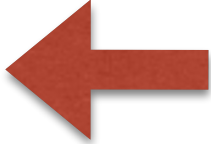
*“I want to prevent the monitor from going to sleep. [...] What call do I make?”*

- Measurements (59/97 — Q/A)
- General Knowledge (40/84 — Q/A)
- Code design (36/133 — Q/A)
- Context-specific (83/110 — Q/A)
- Noise (107/134 — Q/A)

*“What are the good features of a processor should have which help in carrying out multimedia(Video/Image)?. [...] PS: It has to be low power as it is for portable applications.”*

- Measurements  
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# RQ2: Problems

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- 
- Highest popularity
  - Highest A per Q ratio
  - Highest success rate

# RQ3: Causes

- Unnecessary resource usage (49 occurrences)
- Fault GPS behavior (42 occurrences)
- Background activities (40 occurrences)
- Excessive synchronization (32 occurrences)
- Background wallpapers (17 occurrences)
- Advertisement (11 occurrences)



*“to have a background application that monitors device usage, identifies unused/idle resources, and acts appropriately”*

- Unnecessary resource usage (49 occurrences)
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*“When there are bugs that keep the GPS turned on too long they go to the top of the list to get fixed”*

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# RQ4: Solutions

- Keep IO to a minimum (29 occurrences)
- Bulk operations (24 occurrences)
- Avoid polling (17 occurrences)
- Hardware Coordination (11 occurrences)
- Concurrent Programming (9 occurrences)
- Race to idle (7 occurrences)

*“do not flood the output stream with null values”*

- Keep IO to a minimum (29 occurrences)
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*“Don’t transfer say 1 file, and then wait for a bit to do another transfer. Instead, transfer right after the other.”*

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# Do researchers agree?



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# Recurring problems in the answers

- Misconceptions (37 users)
- Panaceas (23 users)
- The perception of lack of tools (38 questions)

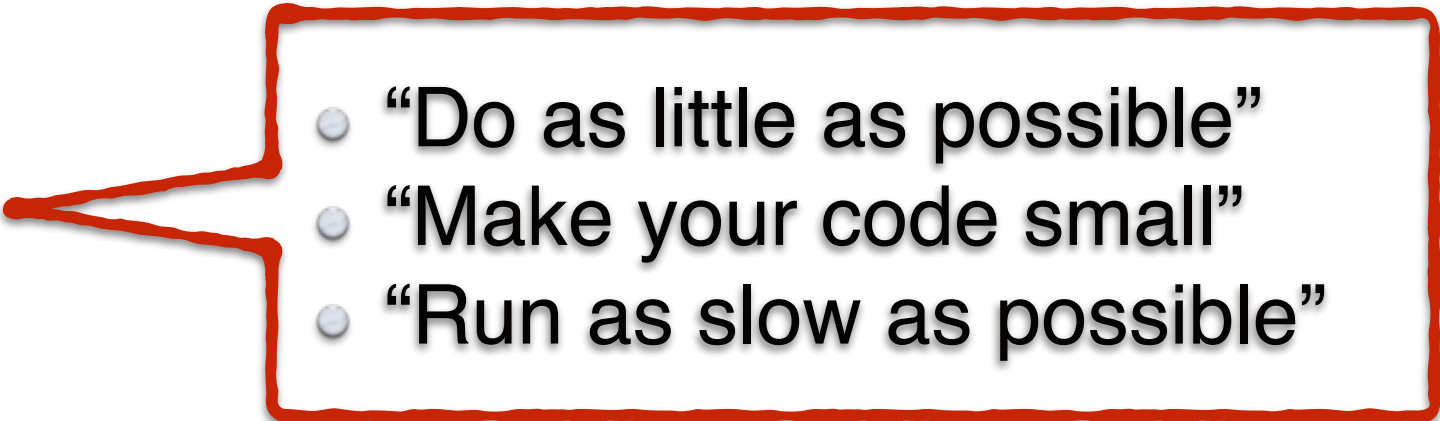


# Recurring problems in the answers

- Misconceptions (37 users)
  - Power and Energy?
  - Performance as an indicator to Energy?
  - Shift to managed languages
- Panaceas (23 users)
- The perception of lack of tools (38 questions)

# Recurring problems in the answers

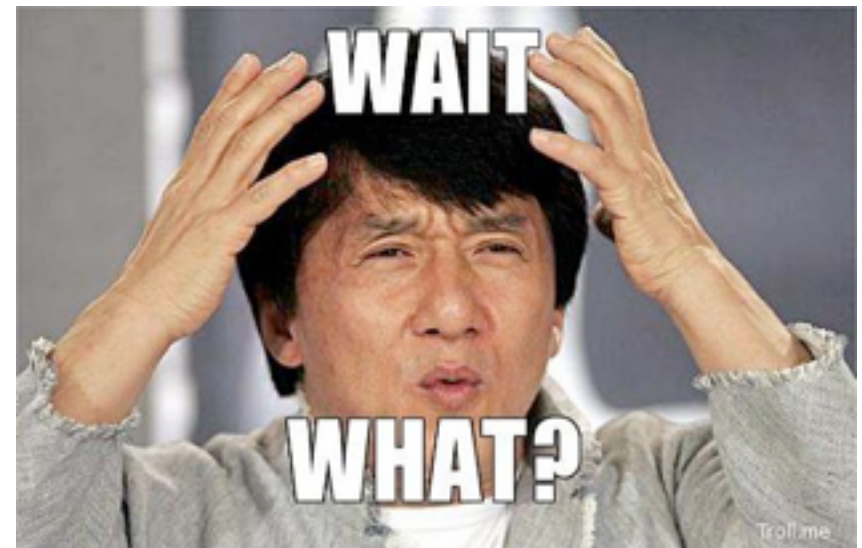
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- “Do as little as possible”
  - “Make your code small”
  - “Run as slow as possible”

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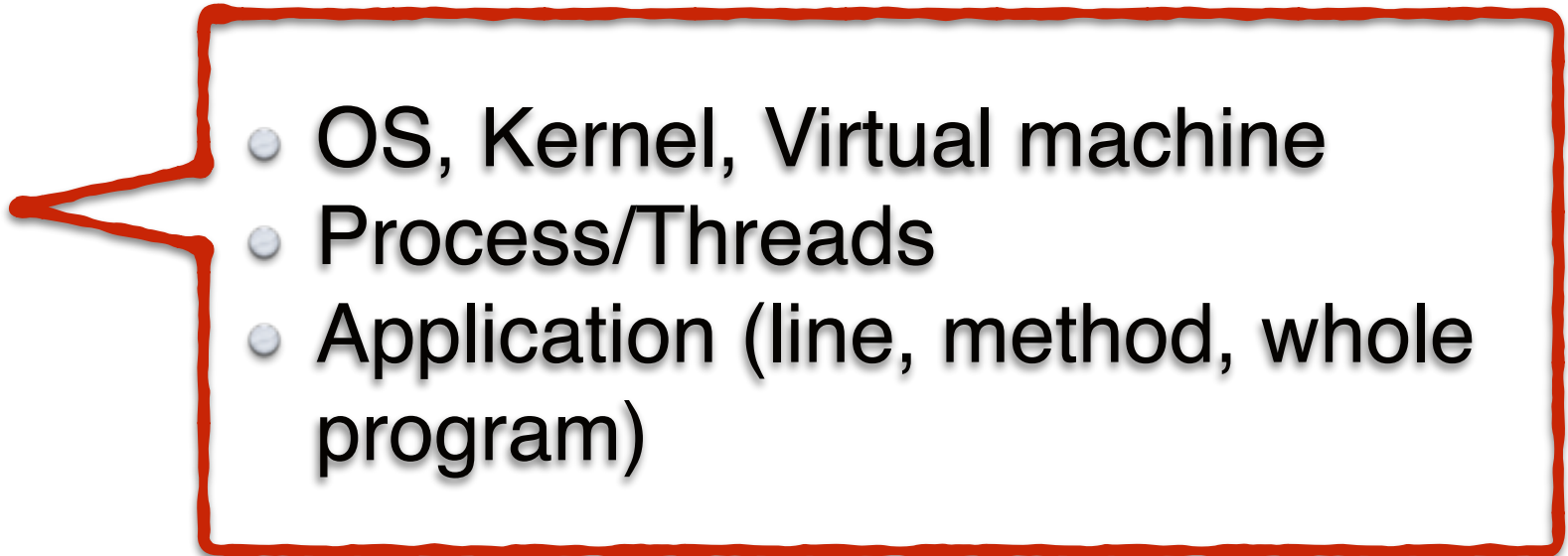
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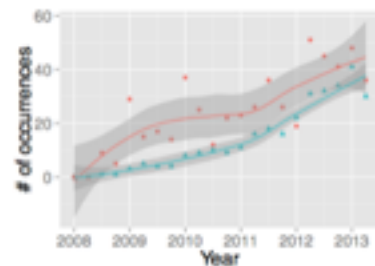
- 
- OS, Kernel, Virtual machine
  - Process/Threads
  - Application (line, method, whole program)

# Conclusions

- A practical guide for future energy-aware and energy-efficient software development
- We described the needs and challenges that developers face
  - 5 most common **problems**
  - 7 most common **causes**
  - 8 most common **solutions**

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## RQ1: Characteristics



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## RQ2: Problems

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19

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29

Thanks!

[ghlp@cin.ufpe.br](mailto:ghlp@cin.ufpe.br)