## DEVOPS AND CI/CD PIPELINE: EXPLORING THE EDGE COMPUTING LANDSCAPE

DOCTORAL DEFENSE PREVIEW

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#### INTRODUCTION

#### CONTEXTUALIZATION

- Organizations and communities developing IoT systems rely on software components as one of the main assets in their products
- When the systems become more complex, these entities need to adapt [Luz et al., 2019]
- These entities have teams that develop hardware that traditionally uses rigorous and plan-oriented methodologies [Lindgren and Münch, 2016]
- Moreover, they have software development and operations teams that are more familiar with to agile methodologies

#### CONTEXTUALIZATION

- On one hand, an IoT system project requires ongoing cooperation between development, operations, and hardware teams
- On the other hand, there may be resistance in hardware teams to using agile practices in their activities
- IoT systems are composed of addressable objects (things) that interact with each other and with users, detecting and processing data to achieve specific goals [Jacobson et al., 2017]
- These systems have **different embedded components**, leading to the creation and use of architectural patterns for various applications [Wu et al., 2010]

#### PROBLEM



- IoT systems have **several components** and require the **integration of multiple experts** and **development approaches**
- Software engineering must adapt to ensure the quality of IoT systems
- Component variability makes choosing technologies and practices for IoT embedded projects complex
- The specific challenges of adapting the CI/CD pipeline for IoT embedded systems are not understood

#### MOTIVATION

- The CI/CD pipeline can expedite build, test, and delivery, improving quality and time to release
- Efficient organizational structures are necessary to improve communication and delivery speed in IoT embedded systems
- The integration of hardware, software, and infrastructure is not just a component but a critical pillar of success in IoT systems
- Understanding and overcoming the challenges of CI/CD in IoT embedded systems can provide valuable insights for practitioners and researchers, advancing software engineering in this domain



#### GENERAL GOAL

**Investigate** the challenges of software development, maintenance and continuous delivery

for the purpose to clarify to software engineering community

with respect to proposing approaches to overcome these
challenges

from the point of view of researchers, professionals and
practitioners

in the context of IoT embedded systems.



#### Specifics Goals

- Identify DevOps practices and tools used in IoT embedded projects reported in the literature and by professionals
- Elucidate teams' benefits and challenges when adopting DevOps in IoT embedded projects
- Select a subset of practices and tools that promote the quality of FLOSS (Free/Libre Open-Source Software) projects from these domains during DevOps adoption
- Verify developers performance when using these practices and tools on a project



#### THEORETICAL REFERENCE

#### BACKGROUND

- DevOps is a collaborative and multidisciplinary organizational effort to automate the continuous delivery of new software updates while guaranteeing their correctness and reliability [Leite et al. 2019]
- The CI/CD pipeline is an automated sequence of actions that involves source code from the machine of the developer to the target device that is in production and available to system users
- **IoT embedded systems** are hardware and software components that execute continuously and react to events in the environment

#### BACKGROUND

- We are considering an architecture for IoT systems with 4 layers. Each layer refers to different levels and plays a specific role in data processing and management [Zhang et al., 2018] [Kumar and Agrawal, 2023]
  - The **sensors and devices layer** is closest to the physical environment
  - The edge layer processing data close to the source location, reducing latency, and relieving the load on the network
  - The fog layer provides more advanced computing, storage, and communication resources, typically on local servers
  - The cloud layer handles intensive processing and long-term storage and provides advanced services like big data analytics, machine learning, and web services

#### BACKGROUND

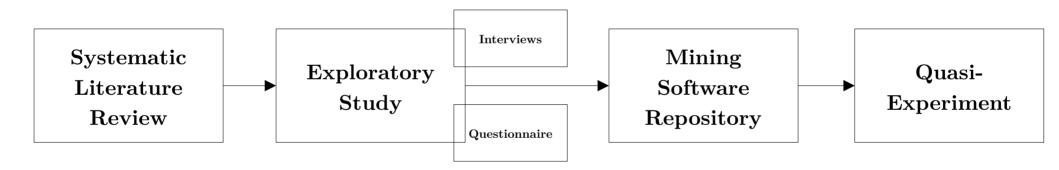
- **GitHub** is a source code hosting platform for version control and collaboration. It allows developers to work together on projects in a geographically distributed manner
- GitHub Actions enables task automation involving several components, such as PR, commits, and issues, that are applied to facilitate the automation of builds, tests, deliveries, deploys, and communication

#### **Related Works**

- CI/CD in different contexts, such as cloud, IoT, CPS, and edge and fog computing
- These studies reveal challenges, practices, benefits, and trends in applying CI/CD in complex software development environments
- Some key points include heterogeneity in continuous delivery workflows, automation, and tools, testing in simulated versus real environments, hardware and software management, balancing regulatory compliance and agile development, and flexible and interdisciplinary approaches

#### EXPERIMENTAL PROCEDURES

#### STEPS OF RESEARCH EXPERIMENTAL PROCEDURES





#### SEARCH OF THE SRL

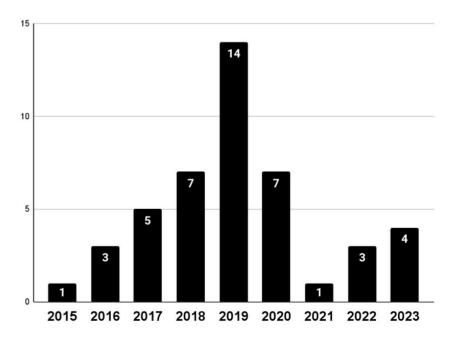
Data Source	Address	Results
IEEE Xplore	https:// ieeexplore.ieee.org/	120
ACM Digital Library	https://dl.acm.org/	402
Science Direct	https:// www.sciencedirect.com/	360
Springer	https:// link.springer.com/	567
Wiley	https:// onlinelibrary.wiley.com/	264
Total		1713

(("internet of things" OR iot) AND ("devops"))

Systematic	Amining
Literature	Software
Review	Repository

#### SEARCH RESULTS







#### EXPLORATORY STUDY DESIGN

Interview	Questionnaire
91 professional invited	60 professional invited
31 responded	30 responded
Free and informed consent forms	First section about participant's backgroud
Encouraged to speak freely	Second section with close questions
Pilot study	
Google Meet and Audacity	
Lasted between 30-50 minutes	
Each interview was transcribed	
Open coding for analysis	



#### BACKGROUND OF PARTICIPANTS

Experience	Interv	iew	Questionnair	e
Less than one year	0%		3.4%	
Between one and three years	0%		10.3%	
Between three and five years	32.2		200170	
More than five years	67.8	ar % exper:	ienced 65.5%	
	Area	ı		
Development	25.8		33.3%	
Operation	48.4	% among	g the 36.7%	
Hardware	25.8	%	eas 30.0%	

### MINING SOFTWARE REPOSITORY (MSR)

- We selected and quantitatively analyzed:
  - <sup>-</sup> 11 metrics from repositories of 25 IoT-related projects
    - Popularity: stars, forks, issues and watchers
    - Delivery: release, commits, branches, closed and merged PR, closed but not merged PR, and open PR

Systematic

Literature

Review

Exploratory

Study

Mining

Software

Repository

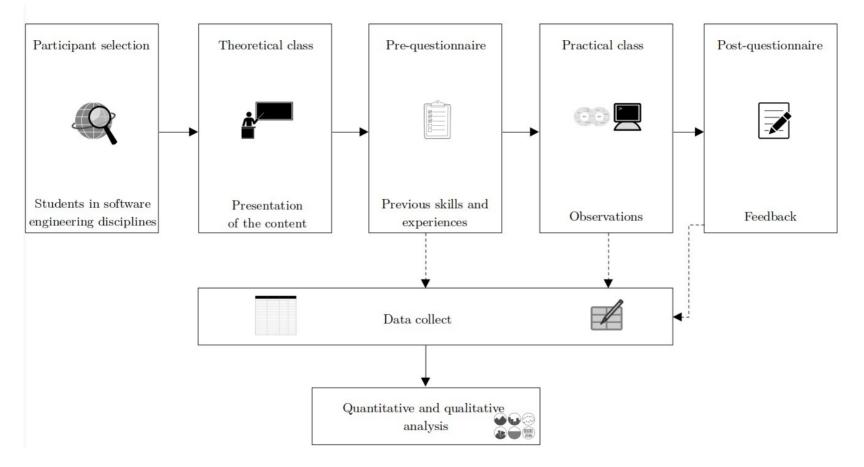
Quasi-

Experiment

- Community: contributors, truck factor, and one-time contributor
- Used the K-Means to clustering and understanding the characteristics of the repositories
- Explored evidence of use in GHA workflows (YAML files)
- Applied open coding to issues to understand how these communities discuss the CI/CD pipeline

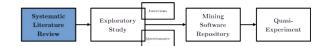


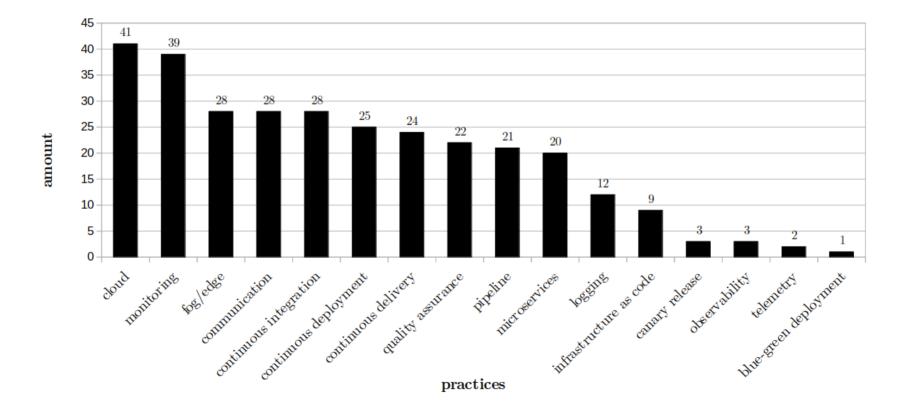
#### QUASI-EXPERIMENT



#### Results

RQ1. What are the DevOps topics investigated in the context of IoT software systems?





plan	communication	Systematic Literature Review Study Protonome Repository Quasi- Experiment
develop	architecture languages and frameworks ide library and toolkit storage protocols and communications formats operation system hardware servers network build and interpreter testing version control container continuous integration	
deliver	continuous delivery / deployment infrastructure as code source code hosting	
operate	measurement processing and analysis	25
Techn	ologies	25

RQ2. What are the benefits of adopting DevOps in IoT software systems?

Review Study Repository Experiment	Systematic Literature Review		Exploratory Study	Interviews	Mining → Software Repository	<b></b>	Quasi- Experiment
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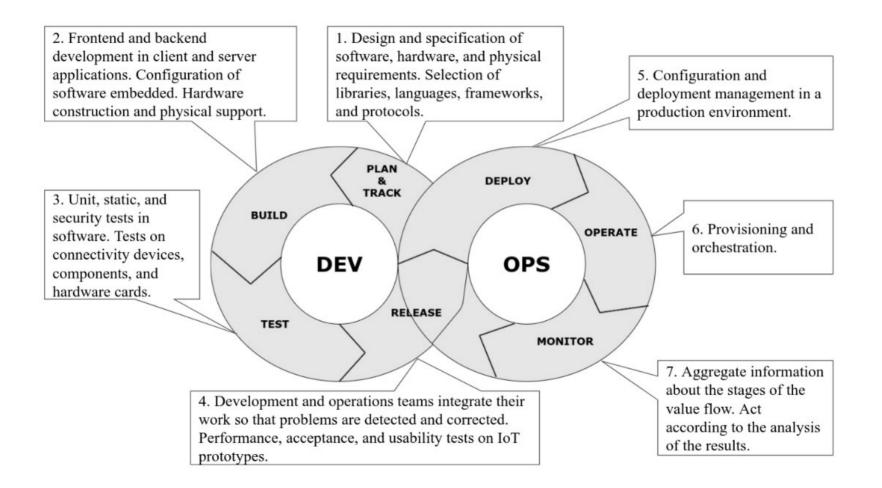
Benefit	Category
BO1	DevOps framework proposals for IoT
B02	Use of cloud and fog computing
B03	Economics with the use of containers
B04	Microservices induce the formation of small teams
B05	Reference architectures DevOps to IoT systems

RQ3. What the reported challenges of adopting DevOps in IoT systems?

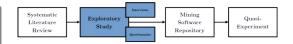


Category	Challenge
Manage quality of serv	C01
Select devi	C02
Continuous feedback between te	C03
Apply a deployment pipel	C04
Continuous documentat	C05
Need for e-shaped profession	C06





RQ1. What are the differences in developing embedded systems with a traditional process compared to a process that seeks continuous delivery and develops IoT systems?





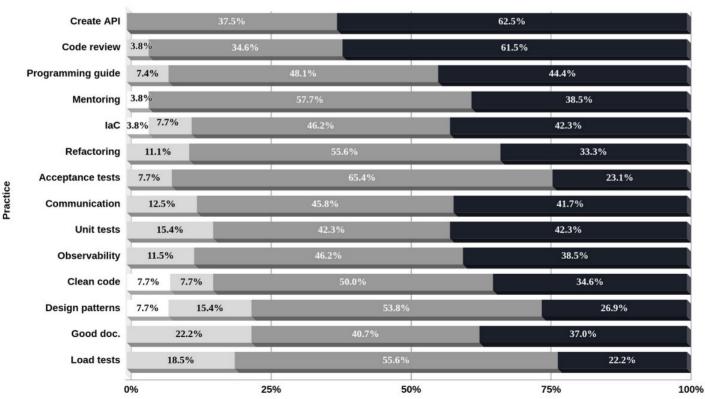
- Some companies develop their prototypes; others even import its
- The final hardware is mainly purchased from China
- Every IoT solution is different from another
- Use of microservices
- Use of IaC to obtain stable environments
- Different delivery/deployment strategies



answers more related to technical and business aspects RQ2. Which quality practices are most used in the pursuit of continuous delivery in developing IoT systems?





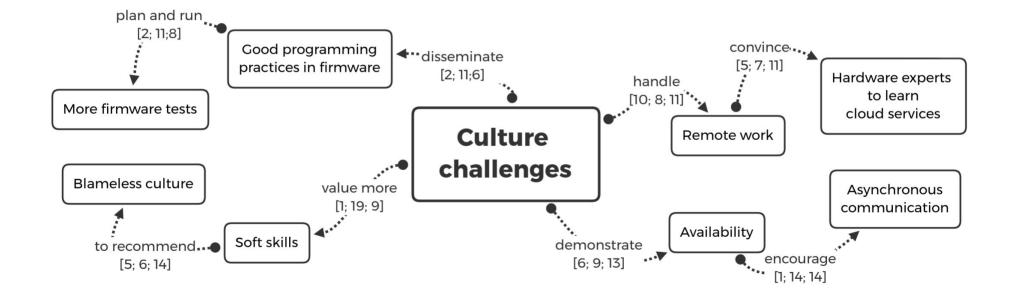


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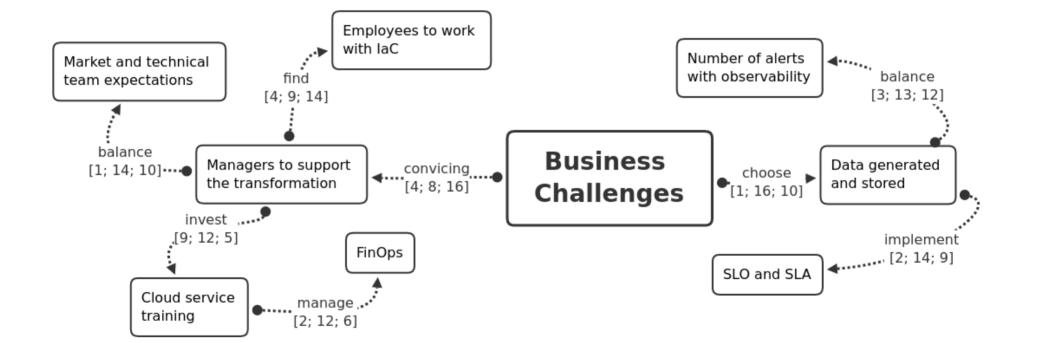
RQ3. How are perceived challenges faced in the quest for continuous delivery?



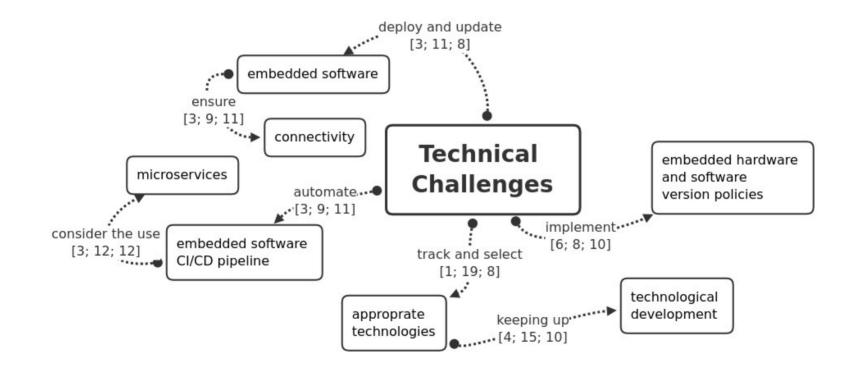


RQ3. How are perceived challenges faced in the quest for continuous delivery?

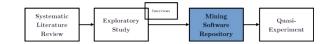


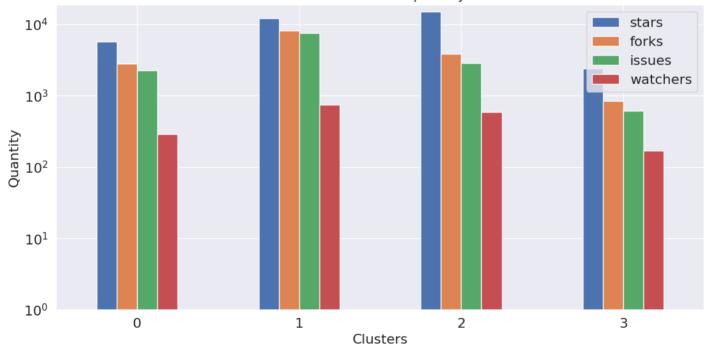


RQ3. How are perceived challenges faced in the quest for continuous delivery?



RQ1. What are the characteristics of FLOSS IoT-related projects?

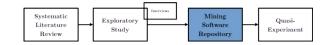




Accumulated - Popularity

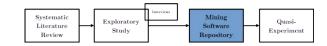
34

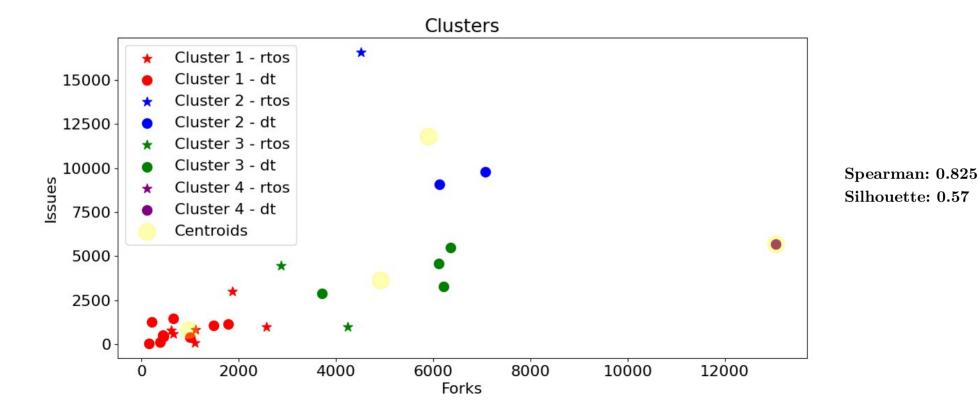
# RQ1. What are the characteristics of FLOSS IoT-related projects?



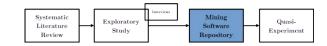
Project	Kind	General	Popularity	Delivery	Community
zephyrproject-rtos/zephyr	RTOS	2	2	1	2
ARMmbed/mbed-OS	RTOS	3	1	2	1
RIOT-OS/RIOT	RTOS	3	1	2	3
contiki-os/contiki	RTOS	0	1	3	0
contiki-ng/contiki-ng	RTOS	0	1	3	3
RT-Thread/rt-thread	RTOS	3	1	0	Y
aws/amazon-freertos	RTOS	0	1	(0)	0
apache/nuttx	RTOS	3	1	2	3
FreeRTOS/FreeRTOS	RTOS	0	1		0
esp8266/Arduino	Library(DT)	1	0	$(\overline{0})$	1
arduino/Arduino	IDE (DT)	1	0	3	3
espressif/arduino-esp32	Library (DT)	1	0	(3)	1
arduino/arduino-ide	IDE(DT)	0	1	3	0
espressif/ESP8266_RTOS_SDK	Framework(DT)	0	1	3	0
espressif/esp-idf	Framework(DT)	1	0	3	1
jerryscript-project/iotjs	Framework(DT)	0	1	3	0
jerryscript-project/jerryscript	Library(DT)	0	1	0	0
micropython/micropython	Language(DT)	1	3	0	1
hybridgroup/gobot	Framework(DT)	0	1	3	0
hybridgroup/cylon	Framework(DT)	0	1	3	0
hybridgroup/artoo	Framework(DT)	0	11	3	0
Tencent/ncnn	Framework(DT)	1	3	3	3
rwaldron/johnny-five	Framework(DT)	1	3	3	0
cesanta/mongoose-os	Framework(DT)	0	1	3	0
adafruit/circuitpython	Language(DT)	3	1	0	0

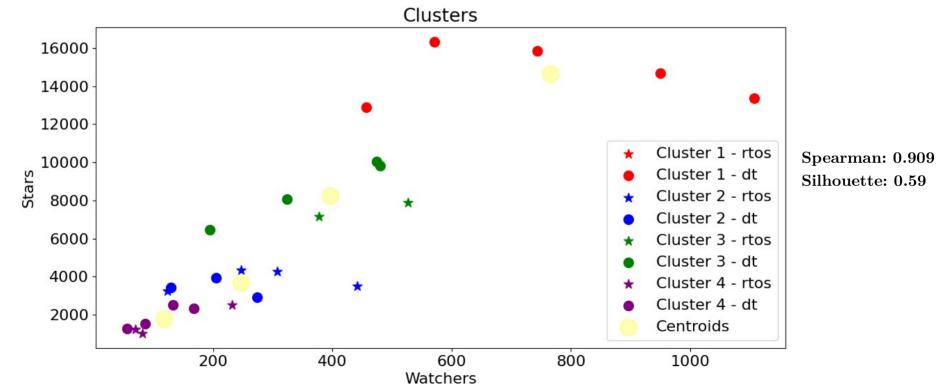
RQ1. What are the characteristics of FLOSS IoT-related projects?





RQ1. What are the characteristics of FLOSS IoT-related projects?





RQ2. How do FLOSS IoT-related projects structure their CI/CD pipeline?

Systematic Literature Review	Interviews	Mining Software Repository	<b></b>	Quasi- Experiment
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	Event	%Workflows	%Repositories
	push	74.63%	72.00%
	pull_request	71.98%	72.00%
	release	25.82%	44.00%
	schedule	15.93%	36.00%
W	orkflow_dispatch	10.99%	32.00%
	issues	9.34%	28.00%
pu	ll_request_target	4.40%	16.00%
	workflow_run	2.20%	12.00%
reţ	oository_dispatch	1.65%	4.00%
	workflow_call	1.65%	4.00%
i	issue_comment	1.10%	8.00%
pul	l_request_review	0.55%	4.00%

182 YAML files

# RQ2. How do FLOSS IoT-related projects structure their CI/CD pipeline?

Systematic Literature Review	ixploratory Study	** Mining Software Repository	┝	Quasi- Experiment
------------------------------------	----------------------	-------------------------------------	---	----------------------

Action	%Steps	%Repositories
actions/checkout	47.17%	100.00%
actions/upload- artifact	12.34%	52.63%
actions/setup-python	8.74%	68.42%
actions/cache	7.84%	31.58%
actions/download- artifact	3.47%	26.32%
codecov/codecov- action	1.03%	15.79%
actions/setup-node	0.90%	10.53%
docker/login-action	0.77%	26.32%
docker/build-push- action	0.77%	21.05%
docker/setup-qemu- action	0.77%	15.79%

#### 75 Actions out of 766 Steps

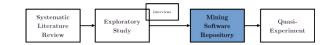
RQ2. How do FLOSS IoT-related projects structure their CI/CD pipeline?

Systematic	Mining
Literature	Software
Review	Repository

Action category	%Actions
Continuous Integration	26.67%
Utilities	20.00%
Deployment	6.67%
Dependency Management	5.53%
Testing	5.53%
Project Management	5.53%
Code Quality	4.00%
Code Review	2.67%
Open Source Management	2.67%
Chat	2.67%

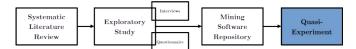
Action category	%Actions
Security	2.67%
Publishing	1.33%
Container CI	1.33%
Uncatecorised	13.33%
Total	100.00%

RQ3. What	is discussed	in FLOSS	IoT-related
projects	communities	about	the CI/CD
pipeline?			

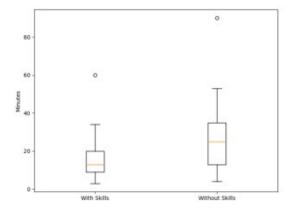


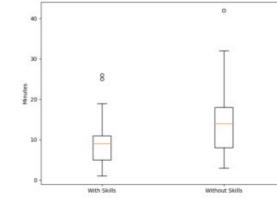
Categories of the Issues	#Issues	%Issues
Difficulties or challenges	83	44.62%
Improvement	44	23.66%
Maintenance	32	17.20%
Request or suggestion	27	14.52%
Total	186	100.00%

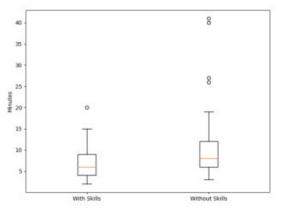
RQ1. How does prior CI/CD knowledge impact the effort to configure, use, and understand a CI/CD pipeline in an IoT embedded project?



Statistic Table - Mann-Whitney - Time in Minutes								
	With skills Without skills							
	med	min	max	med	min	max	p-value	
Task 1	13	3	60	25	4	90	0.00072	
Task 2	9	1	26	12	3	42	0.00220	
Task 3	6	2	20	8	3	41	0.00203	





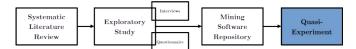


Task 1: Set up GitHub Actions

Task 2: Create a PR with a bug

Task 3: Fix a PR 42

RQ1. How does prior CI/CD knowledge impact the effort to configure, use, and understand a CI/CD pipeline in an IoT embedded project?



	Statistic Table - Mann-Whitney - Degree								
		With skills Without skills							
	mod	min	max	mod	min	max	p-value		
Task 1	0	0	4	1	0	4	0.00218		
Task 2	1	0	3	2	0	4	0.00022		
Task 3	0	0	2	1	0	4	0.00251		

Statistic Table - Mann-Whitney - Degree								
	With skills Without skills							
	mod	min	max	mod	min	max	p-value	
File 1	2	0	3	2	1	4	0.00000	
File 2	1	0	3	2	0	4	0.02778	
File 3	0	0	2	1	0	4	0.00338	

RQ2. What were developers' perceptions about the setting, use, and understanding of the CI/CD tasks?

Systematic	Mining
Literature	Software
Review	Repository

Developers insights		
Don't know GitHub Actions	Know GitHub Actions	
Novelties (with skills) - 38	Observations (with skills) - 8	
Learning (without skills) - $52$		
Performance (without skills) - $20$		
Doubts (without skills) - 50		
Barriers (without skills) - $53$		

- Construction Validity:
  - SLR: Selection of multiple electronic data sources to ensure comprehensiveness
  - Exploratory Study: Use of a structured interview guide and external validation
  - MSR: Documentation of choices and reasons, recognizing limitations in choosing the GitHub Actions platform
  - Quasi-Experiment: Selection of Software Engineering students as subjects, justified by previous studies

- Internal Validity:
  - SLR: Collaborative approaches to increase objectivity in selecting and interpreting studies
  - Exploratory Study: Use of semi-structured interviews to minimize bias
  - MSR: Justifications of methodological choices following recommendations
  - Quasi-Experiment: Document the process and follow guidelines to ensure the validity of inferences

- External Validity:
  - SLR: Limitations in the representativeness of selected studies
  - Exploratory Study: Limitations in the sample
  - MSR: Scope limited to IoT-related projects; clear criteria for future studies
  - Quasi-Experiment: Apply appropriate statistical tools and maintain consistency in results

- Conclusion Validity:
  - SLR: Consensus among researchers on interpretations
  - Exploratory Study: Collective participation in data analysis and discussion of results
  - MSR: Open coding is used to make raw data available
  - Quasi-Experiment: Detailed presentation of results and encouragement of replication

#### CONCLUSION

## SUMMARY - SLR

- Practices and Technologies: Various practices and technologies emphasize edge and fog computing
- Infrastructure: Cloud computing and infrastructure as code are emerging trends
- Deployment Strategies: Canary Release, Blue-Green Deployment, and reference architectures
- Challenges Identified: The impact of these challenges, including defining and monitoring QoS metrics, communication between teams, and resistance to agile practices, is significant, underlining the urgency of addressing them

#### SUMMARY - EXPLORATORY

- DevOps Practices: Generates agility in hardware and firmware development
- Cultural Aspects: Shorter delivery cycles and adaptation to each project's specific demands are needed
- Quality Practices: Create APIs, conduct code reviews, and develop programming guidelines
- Challenges: Incomplete adoption of practices such as clean code and testing by hardware and firmware teams

## Summary - MSR

- CI/CD adoption: Mixed picture with variation in workflow adoption
- Tools: The importance of Docker and GitHub Actions is growing
- Gaps: Lack of third-party Actions specific to embedded systems

#### SUMMARY - QUASI-EXPERIMENT

- Impact of Prior Knowledge: Significant differences in effort and understanding between developers with and without prior CI/CD skills
- Benefits of Experience: Experienced developers with prior CI/CD knowledge spend less time and find tasks easier, demonstrating their capability and efficiency
- Beginning Developers: Faced more challenges and spent more time
- Importance of Training: Ongoing training in CI/CD is needed to face emerging technological challenges

#### SUMMARY - QUASI-EXPERIMENT

- Efficiency of GitHub Actions: Praised by experienced developers
- Challenges for Beginners: Interpretation of source code, use of Git and GNU/Linux systems
- Guidance from Researchers: Essential to help overcome obstacles and understand concepts

#### SUMMARY

- CI/CD Efficiency and Effectiveness:
  - Crucial to the success of modern software projects
- Competitive Advantage:
  - Overcoming barriers and implementing robust CI/CD practices can uniquely position your software projects, providing a significant competitive advantage

#### SUMMARY

- Investment in Training:
  - It is essential to face current challenges and ensure future success in developing IoT embedded systems
- Recommendation:
  - Look for solutions adapted to the specific needs of each project and promote practical learning

#### CONTRIBUTIONS - SLR

- Identification of Gaps:
  - Future experiments are needed to evaluate the operationalization of CI/CD in IoT embedded systems
- Technology Analysis:
  - A meticulous examination of detailed technology selection requirements, including documentation, active community, and licensing, has been conducted
- DevOps Challenges:
  - Discuss topics, technologies, benefits, and challenges specific to IoT projects, strengthening knowledge for DevOps adoption

#### CONTRIBUTIONS - EXPLORATORY

- Integration of DevOps Practices:
  - Comprehensive view of the problems professionals and organizations face
- Communication and Management:
  - Communication between professionals with different skills and support from top management is important
- Practices and Technologies:
  - Proposing the use of asynchronous communication, continuous monitoring, and careful technology selection, with the promise of improved efficiency and productivity
- Data and Metadata:
  - Use of solutions in production for improvements and continuous learning

#### CONTRIBUTIONS - MSR

- CI/CD adoption:
  - Identification of CI/CD practice in most FLOSS IoT projects, with a predominance of GitHub Actions
- Understanding the user Profiles:
  - Delineating the distinct user profiles for real-time operating system (RTOS) projects and development tools (DT), highlighting their unique needs and challenges
- Pipeline Challenges:
  - Main concerns related to difficulties in using the pipeline and the need for detailed documentation

## CONTRIBUTIONS - QUASI-EXPERIMENT

- Developer Perceptions:
  - Divergences in experiences with CI/CD, highlighting motivation and discovery of new resources
- Technical Challenges:
  - Recognition of pipeline efficiency but technical challenges in executing the steps
- Education and Mentoring:
  - The empowering role of practical and adaptive training approaches, with the guiding hand of mentors, is fundamental in motivating and developing CI/CD skills

#### CONTRIBUTIONS

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- Pereira, I.M.; Carneiro, T. G. S.; Figueiredo, E. 2021. Main Differences of DevOps on IoT Systems. XXXV Brazilian Symposium on Software Engineering (SBES). pp. 315-319. DOI: 10.1145/3474624.3474630.
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#### CONTRIBUTIONS

- Analysing the CI/CD Pipeline in FLOSS Repositories of IoT-Related Projects. SUBMITTED TO JUCS - Journal of Universal Computer Science.
- Manipulating a CI/CD Pipeline in an IoT Embedded Project: A Quasi-Experiment. SUBMITTED TO JSEP - Journal of Software: Evolution and Process.

#### FUTURE WORK

#### FUTURE WORK

- Expand the scope of results with additional case studies and experiments to validate tools, people, and solutions
- Evaluate different tools used in IoT embedded projects, focusing on ease of use, hardware integration, and task automation effectiveness
- Develop guidelines and best practices for integrating security into IoT embedded projects, addressing data protection and vulnerabilities
- Conduct experimental research to evaluate the effects of training in CI/CD practices on developers' productivity, quality, and satisfaction in IoT embedded project teams

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Questions?

