



# Pushed by Accident

A Mixed-Methods Study on Strategies  
of Handling Secrets in Source Code Repositories

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#teamusec



# Developers Must Provide and Handle Secrets Securely

- Version control systems (VCSs) are an essential technology for collaborative software development 
- Git-based platforms such as GitHub or GitLab are the most used source code sharing platforms  
- Developers need to provide secrets to e.g., deploy software, automate interactions with third parties, or handle authentication





# Credentials, Authentication Tokens, or Secret Encryption Keys

Secrets are highly sensitive, e.g.,

- credentials e.g.,

```
user=admin, password=secretpwd
```

- authentication tokens e.g.,

```
JalrXUtnFEMI/K7MDENG/bPxrFiCYEXAMPLEKEY
```

- secret encryption keys e.g.,

```
-----BEGIN OPENSSSH PRIVATE  
KEY-----b3BlbnNzaC1rZXktbjEAAAACmFlczI1Ni1jdHIAAAAGYmNyZXB0AAAA  
GAAAABBjTZYaSZ...
```





## Even the Big Players Fail

### **Toyota Suffered a Data Breach by Accidentally Exposing A Secret Key Publicly On GitHub**

On October 7th, Toyota revealed a partial copy of their T-Connect source code had been accidentally exposed for 5 years, including access to data for over 290,000 customers.

SECURITY

Rogers' internal passwords and source code found open on GitHub

HOWARD SOLOMON

JANUARY 24, 2020

### **GitHub Rotates Publicly Exposed RSA SSH Private Key**

GitHub replaced the RSA SSH private key used to secure Git operations for GitHub.com after it was exposed in a public GitHub repository.





# Code Secret Leakage Becomes More and More Significant

## GitGuardian: The State of Secrets Sprawl 2023 [1]

**10M**

secrets occurrences  
detected in 2022  
(3M unique secrets)

**1 in 10**

authors exposed a secret in 2022  
**To err is human.** Of the 13.3M distinct  
authors who pushed code to GitHub  
in 2022, 1.35M accidentally exposed  
a secret.

**5.5**

commits out of 1,000 exposed at least one secret (+50%)

**3.7% of repositories active during 2022 leaked a secret**

- 61.2M repositories were active in 2022
- 2.27M of those repositories leaked a secret

[1] GitGuardian

<https://www.gitguardian.com/files/the-state-of-secrets-sprawl-report-2023>





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**Meli et al.** presented a large-scale measurement study on secret leakage in public GitHub repositories, finding more than 100,000 repositories with leaked secrets. [2]

[1] GitGuardian  
<https://www.gitguardian.com/files/the-state-of-secrets-sprawl-report-2023>

[2] Meli et al. "How Bad Can It Get? Characterizing Secret Leakage in Public GitHub Repositories", NDSS, 2019





# Research Questions





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**RQ1** How widespread is code secret leakage among developers?

**RQ2** What are secret leakage prevention approaches, and what are developers experiences?

**RQ3** What are developers' experiences with code secret leakage incidents?

**RQ4** What are developers' experiences with code secret remediation techniques and tools?





# Methodology

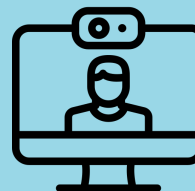
*Mixed-Methods Study*



Online Developer Survey



Online Developer Interviews





# Online Developer Survey



## Recruitment

- n = 109 developers



- 50 from Upwork
- 59 from GitHub





# Online Developer Survey



## Recruitment

- n = 109 developers



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- 59 from GitHub

## Content of the Questionnaire

- Source code management
- Experience with secret information
- Threat model for secret information
- Secret leakage remediation approaches
- Secret leakage prevention approaches
- Demographics





# Online Developer Survey



## Recruitment

- n = 109 developers



- 50 from Upwork
- 59 from GitHub

## Goals



- Identify the extent of code secret leakage
- Identify code secret leakage prevention & remediation approaches

## Content of the Questionnaire

- Source code management
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- Demographics





# Online Developer Interviews



## Recruitment

- n = 14 developers from GitHub



- Developers must have experienced code secret leakage







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## Content of the Interview Guide

- Code secret leakage incidents
- Secret leakage remediation approaches
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# Online Developer Interviews



## Recruitment

- n = 14 developers from GitHub
  - Developers must have experienced code secret leakage



## Goals



Identify developers' problems, challenges, and needs with code secret leakage remediation & prevention approaches

## Content of the Interview Guide

- Code secret leakage incidents
- Secret leakage remediation approaches
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# Selected Findings



Online Developer Survey



Online Developer Interviews





# A Third Reported Secret Leakage



30.3%

of our survey respondents reported first-hand experience with secret leakage in their projects.





# Places and Types of Leaked Secrets



- Places of leak
  - Public repositories
  - Restricted repositories (internal)
  - Code sharing platforms like Pastebin or GitHub gist
  - GitHub workflow logs





# Places and Types of Leaked Secrets



- Places of leak
  - Public repositories
  - Restricted repositories (internal)
  - Code sharing platforms like Pastebin or GitHub gist
  - GitHub workflow logs
- Types of leak
  - Configuration files
  - API tokens
  - Access keys
  - Database passwords

“[I was] pushing the commits to GitHub and when I pushed the remote repository, I found that my [password manager database] has gone into GitHub without me wanting it to go to there.”— I10





# Detection and Impact of Incidents



- Leak Detection
  - GitHub secret scanner
  - Randomly or by others
  - Incidents discovered lately

“It was probably out there for a couple of weeks. So, yes, that was not amazing.”— I11





# Detection and Impact of Incidents



- Leak Detection
  - GitHub secret scanner
  - Randomly or by others
  - Incidents discovered lately
- Impact
  - For the company or software team
    - Additional workload remediating the leak
    - Financial or reputational damage
  - External stakeholders
    - Data loss or data theft

“It was probably out there for a couple of weeks. So, yes, that was not amazing.”— I11







# Root Causes of Code Secret Leakage Incidents



- Root Causes
  - No awareness of new developers in a team
  - No use of any prevention approaches before an incident happened
  - No use or misuse of the .gitignore file
  - Use of hard-code secrets in source code
  - Developers' threat models and secret access process

“Even with all the technology [. . .] to prevent secret leakage, the biggest contributor to secret leakage is the human factor, or negligence.” — I2

“Really just any time you ask, you’ll just get access to whatever you want.” — I6





# Most Survey Respondents Renewed or Revoked Leaked Secrets



What approaches did our survey respondents use to remediate code secret leakage?

## Remediation Approaches

- **Renew or revoke secret** 54.1%
- **Cleanup VCS history** 17.4%
- **Analyze leak** 15.6%
- Removal from source code 11.0%
- Notify concerned roles 7.3%
- Access management 5.5%
- Retract repository 4.6%
- Systemic consequences 2.8%
- Server operations 1.8%





# Challenges Remediating Code Secret Leakage



- The process of remediation is cumbersome
- Complicated incident response process that was never used before
- Being not aware of all the consequences caused by the leak
- The need to select, learn, and apply different or multiple remediation approaches would be too complex and time-consuming





What approaches did our survey respondents use to prevent code secret leakage?

## Prevention Approaches

- **Externalize secrets** 55.0%
- **Block secrets** 29.4%
- **Encrypted secrets** 27.5%
- Restrict access 17.4%
- Monitoring 14.7%
- Education & awareness 8.3%
- Other 7.3%
- Rotation 5.5%
- Code & secret reviews 3.7%





# Factors that Influence the Use of Prevention Approaches



- Participants reported approaches have to be:
  - Effective
  - Efficient
  - Secure
  - Usable
  - Compliant with company requirements





# Challenges When Preventing Code Secret Leakage



- Cost and time constraints
  - Time to set up a new approach
  - Even more time is required to train all involved developers using the approach
  - Adopting new approaches to existing projects often requires refactoring work





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- Cost and time constraints
  - Time to set up a new approach
  - Even more time is required to **train** all involved developers using the approach
  - Adopting new approaches to existing projects often requires **refactoring work**
- Awareness and education

“Someone was doing something **off the books** [...]:

They were just **creating another repository** [...] **not within the organization** but maybe just under a personal account or something.

Those you **can't really fix with tooling**, at the end of the day, those are just **people's problems** [...] and we can **fix that through training** [...] **[or] policy.**”— 16





# Selected Recommendations

*For Developers and Service  
Providers*









# Recommendations for Developers



Combination of different prevention approaches to decrease the likelihood of code secret leakage

- Externalize secrets e.g., using environment variables
- Block secrets from repositories, e.g., using .gitignore files
- Monitoring e.g., using secret scanners 
- Encrypt secrets that need to be shared through the repository 











# Recommendations for Developers



Typical steps that should always be taken to remediate code secret leakage

- Renew or revoke the leaked secret 
- Analyze the leak 
- Revise the access management using the results from the leak analysis 
- Notify the concerned roles 
- In addition
  - Removal from source code 
  - Cleaning up the VCS history 





# Recommendations for Service Providers



- Improving online information and documentation



- Provide and expand secret scanning





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Alexander Krause. Pushed by Accident: A Mixed-Methods Study on Strategies of Handling Secret Information in Source Code Repositories.

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