



## "I DIDN'T CLICK": WHAT USERS SAY WHEN REPORTING PHISHING

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## Phishing Impact

Most common threat vector, in the UK alone accounts for **83%** of attacks in 2022<sup>1</sup>.

IBM found that phishing is the most expensive vector, at an avg. of \$4.65M<sup>2</sup>.

Initial threat causing a cascade of issues such as:

- Malware,
- Data Loss,
- Ransomware, etc.









## **RESEARCH QUESTIONS**

RQ1 - What statements and information do people provide when submitting phishing reports?

RQ2 - What questions do people ask and what kinds of support requests do they make when submitting phishing reports?



### **University Processes**

This work is part of a larger project regarding how organizations handle phishing reports.

Universities have unique features:

- High turnover of staff and students
- Communicate regularly with external orgs.

Help Desk system where staff and students may report any IT related issues, using a **'Ticketing'** approach.





## METHODOLOGY





### Dataset – Help Desk Tickets

- Initial search using keywords, i.e. "phishing"
- Limited search from 27<sup>th</sup> Oct. 2020, to 2<sup>nd</sup> Aug. 2021 (9 months)
- Limited due to roll-out of Automatic Banner on external emails
- Final Set was **984** Tickets



#### This email was sent to you by someone outside the University.

You should only click on links or attachments if you are certain that the email is genuine and the content is safe.

Google Forms

Thanks for filling out USEC 2023 Information Required from Presenters

Here's what was received.



### Non-Phish & Reporters



- Examples where they were confirmed by help desk to be False Positives
- Keyword search, i.e. "legitimate", resulted in 94
- Total of 22 from manual review





- Highest reporter provided 71 reports, next being 14
- 82 reports from IT services group



## Qualitative Codebook

Initial 100 random tickets were read by lead researcher.

A subset of 300 random tickets for collaborative refinement

Applied to full 300, allowing multiple codes per ticket.

- Krippendorf's Alpha with Jaccard's distance.
- Initial 27 tickets had a score of 0.69
- Final 31 tickets had a score of **0.77**
- 30 tickets removed as non-phishing related.









## Codes, Subcodes & Counts

Just reporting		116
Evidence		82
	From address	53
	Cues	15
	Technical	12
	Unsolicited	11
	Other people	9
	Banner	6
	Tools	5
	Other evidence	2
Impact potential		62
	Repeated emails	21
	Compromised	18
	Convincing	15
	IT systems	8
	Number targeted	7

Actions taken		85
	Clicked	28
	Not clicked	35
	Delete	19
	Change login	8
	Gave data	7
	Not give data	7
	Opened	0
	Not opened	7
	Responded	1
	Not responded	2
	Other action	2
Questions		33
	Next Steps	11
	Other Questions	22



RQ1 - What statements and information do people provide when submitting phishing reports?

Evidence - Subcode	Counts
From address	53
Cues	15
Technical	12
Unsolicited	11
Other people	9
Banner	6
Tools	5
Other evidence	2

#### "sender looks like a Chemistry Student"

"the time the email was sent compared to the time the call was meant to be received do not align"

"not expecting an email from ... "

"thought I would check first in case more users have received this?" RQ1 - What statements and information do people provide when submitting phishing reports?

Impact Potential - Subcode	Counts
Repeated emails	21
Compromised	18
Convincing	15
IT systems	8
Number targeted	9

"Our [Head of School] has been impersonated again by this address -[attacker email]. In the past you have applied a rule to silently block this email on the mail server.

Please could you do that again?

Some people from our School have engaged and I'd like to cease comms from this address ASAP" RQ2 - What questions do people ask and what kinds of support requests do they make when submitting phishing reports?

Questions- Subcode	Counts
Next Steps	11
Other Questions	22

"I have received an Outlook calendar invitation from an unknown source, and I think it might be a phishing attempt.

I want to remove it from my calendar. Please can you advise how I can do so safely. I deleted the invitation, but it is still showing as a recurring appointment in my calendar"

## DISCUSSION





## Discussion

- Similarities with spotting phish
  - Prior work highlight several features that indicate phishing to end-users.
  - *Evidence* and *Impact* potential map well to stages in phishing decisions.
- Self-Efficacy
  - Seeking confirmation regarding state of Phish.
  - Problematic 'Paranoia'.



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## Future Work

Reporting Systems and Human Alcollaboration<sup>1</sup>

 Contextual features combined with technical information

**Encouraging Phishing Reporting** 

Development of systems that do not overwhelm IT staff<sup>2</sup>

#### Reassuring users

 Provide responses at scale given Help desk workload



1. Jenkins, A., Kokciyan, N., & Vaniea, K. (2022, June). PhishED: Automated contextual feedback for reported Phishing. In 18th Symposium on Usable Privacy and Security. Usenix.

2. Saka, T., Vaniea, K., & Kökciyan, N. (2022, November). Context-Based Clustering to Mitigate Phishing Attacks. In *Proceedings of the 15th ACM Workshop on Artificial Intelligence and Security* (pp. 115-126).





# **THANK YOU & QUESTIONS?**

REPHRAIN

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THE UNIVERSITY of EDINBURGH

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- $\star$ HTTPS://WWW.REPHRAIN.AC.UK/PHISHED/
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