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The risk of identity disclosure through network structure

Anecdotal evidence from a hackathon

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Agenda

- Problem
- Hackathon set-up
- Results
- Conclusions for SDC



Problem



Research problem

Statistics Netherlands recently developed population scale network (van der Laan et al, 2022)

- 5 types of links: family, neighbours, household members, colleagues, schoolmates
- Every person in the Netherlands

Anonymity measure developed with assumption of certain knowledge from attacker (de Jong et al, 2023a,b)

How likely is this prior knowledge?



Why a hackathon?

Online social networks (OSN) exhaustive source for finding sensitive data (Alipdrandi et al, 2014), (Koot et al, 2015)

- Open Source Intelligence (OSINT) takes advantage of online data

Research done into *what* is available, not *how much* is available

Hackathon reflects what is available, what information is harder/easier to find



Hackathon set-up



Hackathon organisation

22 students from Faculty of Science (Leiden University),
split into 11 groups

Each group given 7 volunteers, asked to give as many links
as possible

- 26 volunteers from CBS, Leiden University, other companies

4 hours, keeping a log

Volunteers were asked to assess validity found links



Recorded data



Edgelist_example



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M24 |

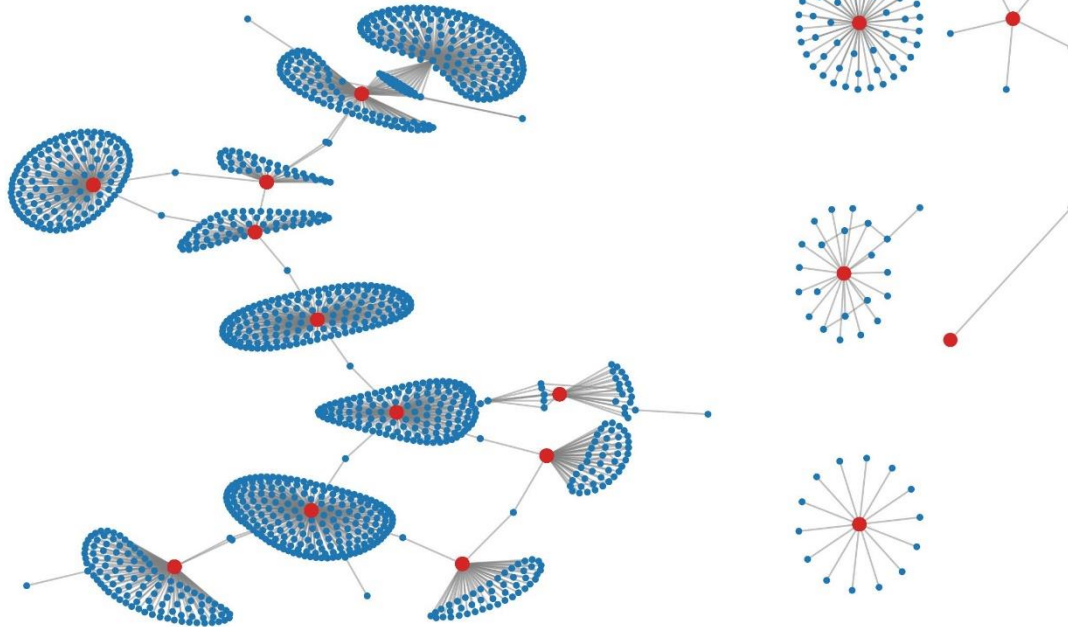
	A	B	C	D	E	F	G	H
1	Willem Alexander		Source: https://www.koninklijkhuis.nl/onderwerpen/geschiedenis/koningen-en-koninginnen/willem-alexander-koning-1967					
2	Source	Target	Type	Subtype (optional)	Distance	Reliability of link	Source	
3	Beatrix	Willem Alexander	Family	Kind	1	High	https://nl.wikipedia.org/wiki/Koninklijke_familie_van_Nederland	
4	Beatrix	Constantijn	Family	Kind	2	High	https://nl.wikipedia.org/wiki/Koninklijke_familie_van_Nederland	
5	Willem Alexander	Amalia	Family	Kind	1	High	https://nl.wikipedia.org/wiki/Koninklijke_familie_van_Nederland	
6	Amalia	Alexia	Family	Zus	2	High	https://nl.wikipedia.org/wiki/Koninklijke_familie_van_Nederland	
7	Willem Alexander	Maxima	Household	-	1	High	Story	
8	Thom de Graaf	Willem Alexander	Work	Colleague	1	High	raadvanstate.nl	
9	Bert	Ernie	Friends	-	20	High	https://nl.wikipedia.org/wiki/Bert_en_Ernie	
10								
11								
12								



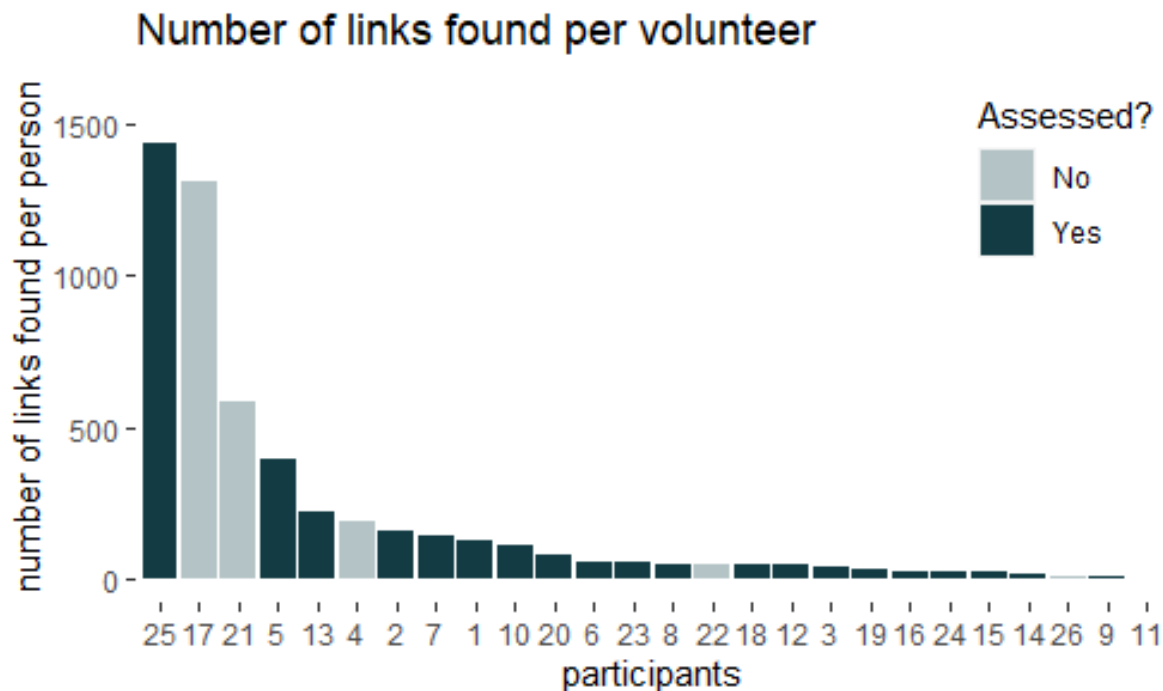
Results



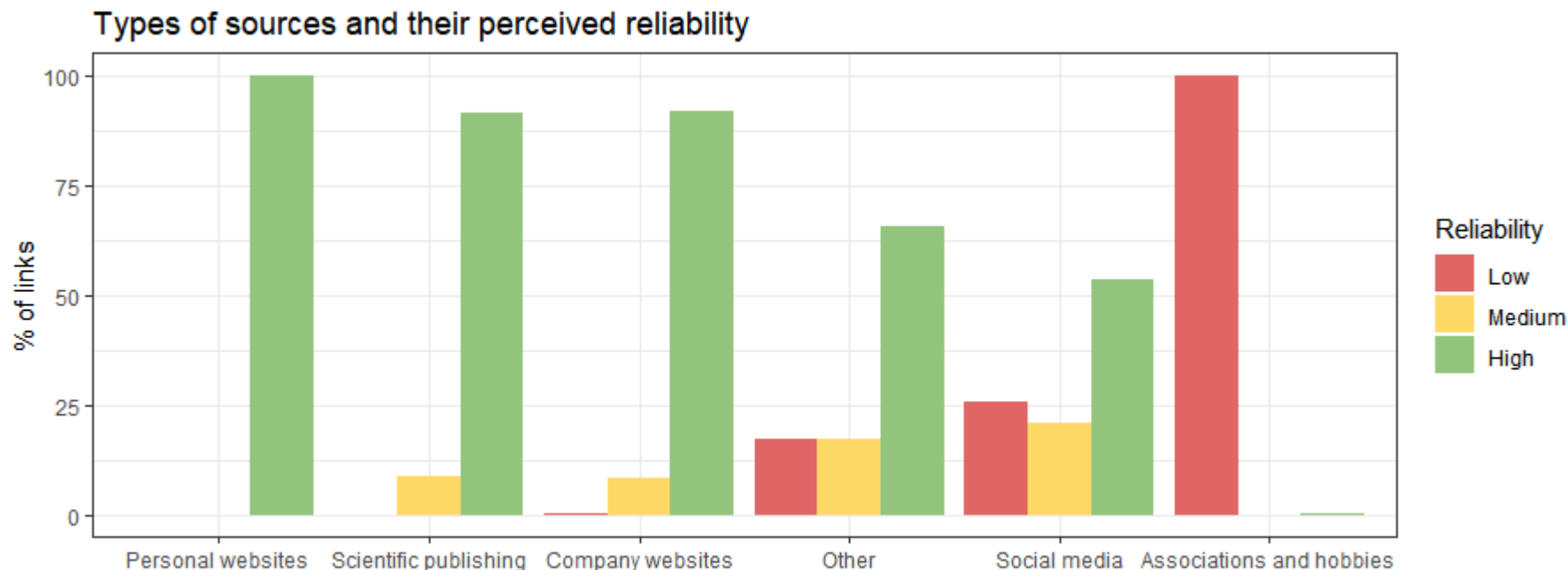
Networks found for all volunteers



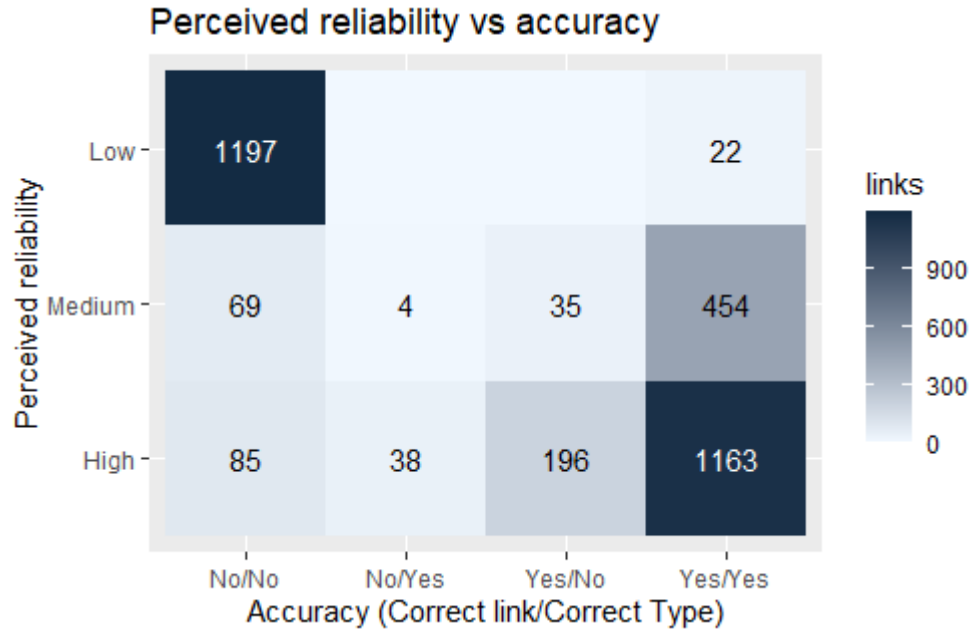
Big differences between volunteers



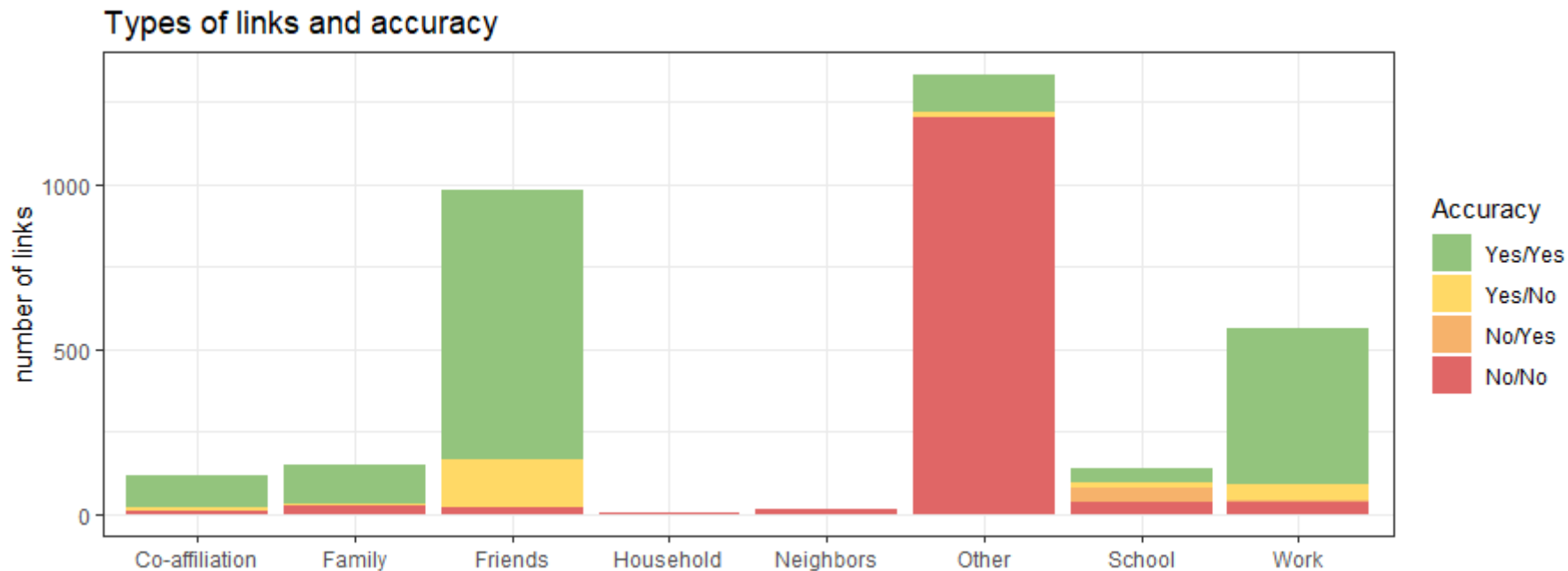
Social media deemed relatively unreliable



Correct assessment of validity



Differences between categories of links



Conclusions for Statistical Disclosure Control

- Friends and colleagues easy to find and often correctly inferred
- Household members and neighbours difficult to find and often incorrect, regardless of perceived reliability
- Perceived reliability often matched accuracy
- Higher order relationships were found far less, either due to assignment or due to difficulty

Open questions

- More research needed on online availability
- Further development of anonymity measures in networks
- How to include outside sources and public information
- More generic approach for assessing risk needed:
 - Assess vulnerabilities in the attacker scenarios
 - Assess likelihood of these scenarios themselves.





Facts that matter

References

- 1 - van der Laan, J., E. de Jonge, M. Das, S. Te Riele, and T. Emery (2022). A whole population network and its application for the social sciences. *European Sociological Review* 39(1), 145–160.
- 2 - de Jong, R. G., M. P. J. van der Loo, and F. W. Takes (2023a, jun). Algorithms for efficiently computing structural anonymity in complex networks. *ACM J. Exp. Algorithmics*.
- 3 - de Jong, R. G., M. P. J. van der Loo, and F. W. Takes (2023b). Beyond the ego network: the effect of distant connections on node anonymity. *arXiv preprint 2306.135083* -
- 4 - Aliprandi, C., J. Irujo, M. Cuadros, S. Maier, F. Melero, and M. Raffaelli (2014, 06). Caper: Collaborative information, acquisition, processing, exploitation and reporting for the prevention of organised crime. Volume 434.
- 5 - Koot, G., M. Huis in 't Veld, J. Hendricksen, R. Kaptein, A. Vries, and E. van den Broek (2014, September). Foraging online social networks. In M. den Hengst, M. Israël, D. Zeng, C. Veenman, and A. Wang (Eds.), *Proceedings of the 2014 IEEE Joint Intelligence and Security Informatics Conference (JISIC2014)*, pp. 312–315. IEEE. 10.1109/JISIC.2014.62 ; Conference date: 24-09-2014 Through 26-09-2014.

