"Through a Graph, Darkly" or "A Manifesto for Online Privacy"

Jon Crowcroft, http://www.cl.cam.ac.uk/~jac22

# Nodes are people, links are relationships

Looking at an abstract graph hides reality Node data is PII Its personal But collection of edge/link data can be used to identify nodes Even if PII is protected

## Anonymizing Node Data Records

- If data is separate from graph, then anonymization is feasible.
- Risk of re-identification of records if not careful statistically Differential Privacy...

### Differential Piracy example

- Imagine we have a database of pirates.
- If we query for a very tall pirate with a long beard, we are asking to identify a unique record ("Long John Silver"
- If we ask "How many pirates in Penzance?" we are safe, as there are lots
- Or if we ask for the number of 1 legged pirates who also have parrots?
- But don't ask for the pirate with the prosthetic hand, coz that even tells you his name...

## Piracy Preserving DBase

	name	port	Parrot	Wooden leg	Height	
	X	penzance	у	у	1.75	
	У	penzance	у	у	1.74	
	Z	penzance	у	у	1.76	
	Dread pirate roberts	?	n	n	1.80	
	Hook	neverland			1.65	
	shakespeare	airport			1.60	
	sparrow	hollywood			1.50	
	Long john silver	Treasure island	у	у	2.00	
				-		

## Piracy Preserving DBase

	#name	port	Parrot	Wooden leg	Height	
	XXX	penzance	у	у	1.75	
	ууу	penzance	у	у	1.74	
	ZZZ	penzance	у	у	1.76	
	Dread pirate roberts (*)	?	n	n	1.80	
	foo	neverland			1.65	
	bar	airport			1.60	
	baz	hollywood			1.50	
	fie	Treasure island	у	у	2.00	
	dinal 11/2					

# Adding the graph messes this all up

 Link data represents a lot of attacks on hash of name:



### Worse: K-Clique Analysis



# There are lots of graph properties

 Degree of nodes All the centrality types (including spectral etc) If links have properties too (strength, as in recommendation or reputation, or age, or other) Worse than ever!

#### Worse to come

 Dunbar's # - 150 So if friend id is 32 bits, your friend list is 4800 bits on average So the attack surface for identifying you is huge Worse Still - you have lots of "edges"

## Hypergraphs

- You have an edge for each type of relationship
  - kin, friend, colleague
  - Co-author of work
  - Co-located (e.g. paid congestion charge same time, used oyster card on same journey, checked in on foursquare same place)
  - Pay tax together, live at same postcode,
  - Sent SMS, IM, Email, Phone call, cell phone call from location
  - Same smart meter address

#### Re-identification trivial

 Anyone in possession of 8 (see Anderson et al) I-Ds a graph of one set of edge type, with access to "anonymized" any other graph edge types, can reidentify the whole thing E.g. Tesco's clubcard can reidentify your whole health net....



#### Forgetting might help



#### Manifesto

 Separate storage of node PII and link data Always crypt PII Decentralize nodes and links Partition PII by role Kin, friend, worl, school Health, finance, gov, social Make it easy to understand Maybe add forgetting

#### Take Homes

Doesn't have to be all central

- Cannot figure out safe way to share graphs (sorry:-(
- Can use Differential Privacy for node data records (without graph)
- Epidemiologists don't need our bank data, government don't need our social data

Prototype by some colleagues at Eurecom© http://www.safebook.us/