

# CS 594: Empirical Analysis

## Deriving Sound Insights from Data

### Session 4: Privacy concerns

# Today's class

- Discuss reading
- Homework 1 initial feedback
  - What meaningful questions (even if trivial) could we ask of this data?
- Dataset brainstorming
  - What interesting questions could be asked of dataset X?
  - How can we validate that we're able to answer that question?

# Robust De-anonymization of Large Sparse Datasets

Narayanan and Shmatikov

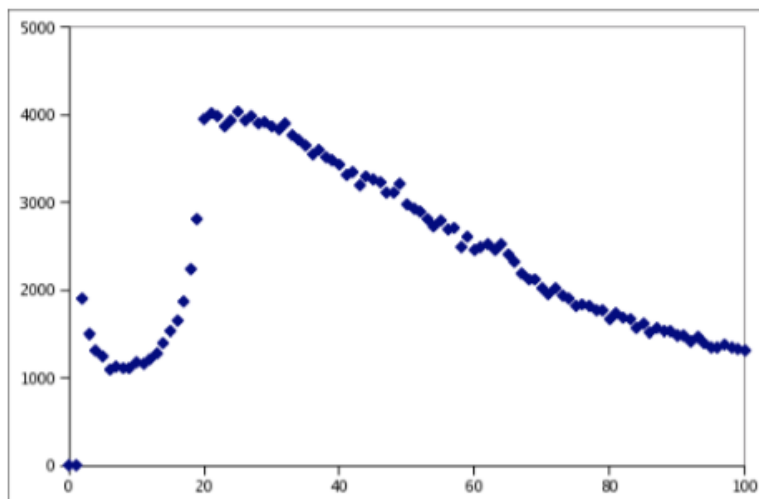
## Auxiliary database:

A subset of additional data that contains identifiers.

The netflix prize dataset includes a subset of all users.  
What was netflix's claim about how subscribers were  
chosen for this dataset?

How did the authors attempt to verify that claim?

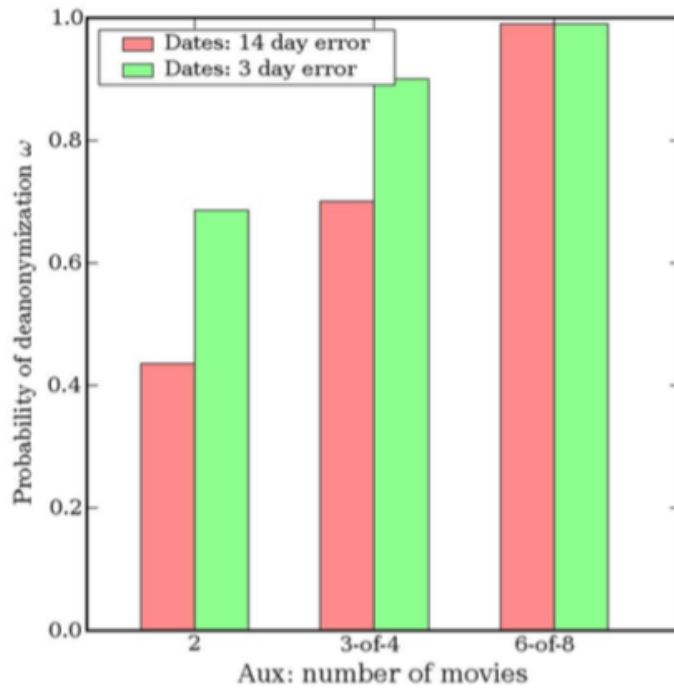
- What's the goal behind showing this graph?
- What hypotheses might you want to test about this claim?
- Can we design an experiment that would allow us to test this?



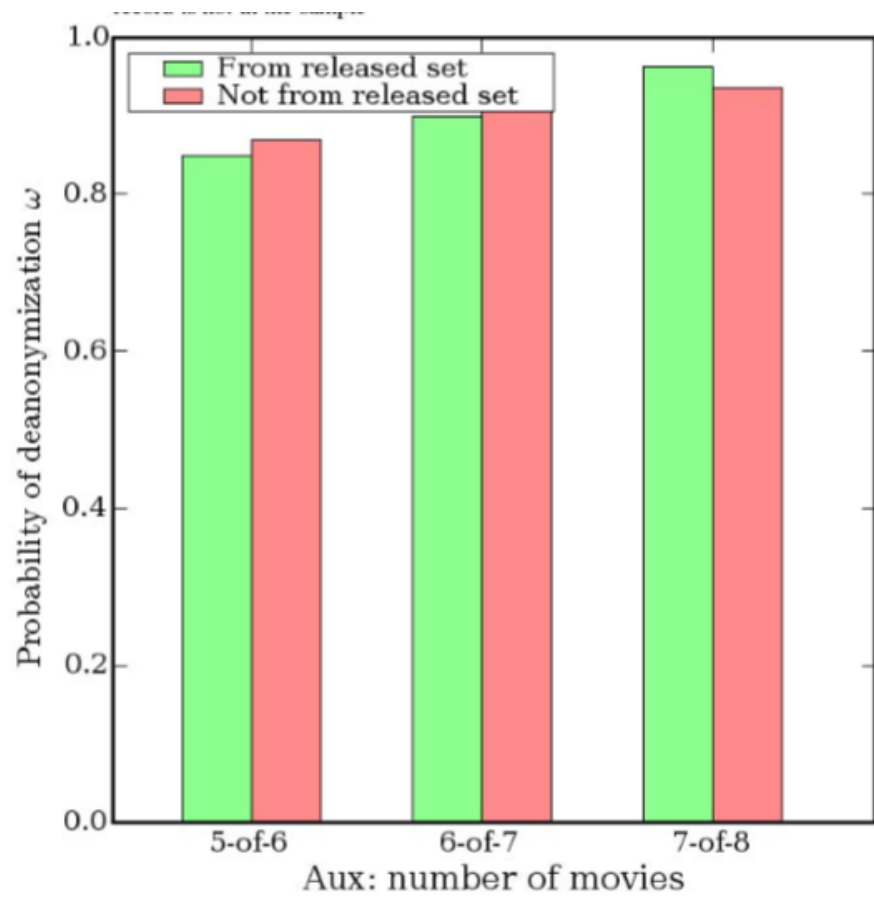
**Figure 2.** For each  $X \leq 100$ , the number of subscribers with  $X$  ratings in the released dataset.

The authors performed a large number of experiments, each of which needs the main database and the auxiliary database. What datasets did they use for this task?





**Figure 4. Adversary knows exact ratings and approximate dates.**



What variables did the experimenters vary during the course of their experiments?

What additional test datasets did the researchers do that used information beyond the netflix prize dataset?

- Dataset brainstorming
  - What interesting questions could be asked of dataset X?
  - How can we validate that we're able to answer that question?

- Enron email corpus
- CRAWDAD wireless networking repository datasets
- CAIDA internet measurements
- DNS Zonefiles
- Wikipedia
- StackOverflow
- City of Chicago open data
- FTC fraud complaint list
- Activitst data