



DESIGNING MACHINE LEARNING

A Multi-Disciplinary Approach

Ethical Considerations

In Designing ML

What if machines
become conscious?

Who is responsible
when an algorithm
commits crime?

How do I “appeal” an
algorithm’s decision?

Will behavioral prediction
erode my freedom to
decide?

Ethical Considerations *In Designing ML*

Will machines lead to
mass unemployment?

Will machine systems
become powerful
surveillance tools?

How do you govern a
multi-territorial
computational system?

Will machine learning
reinforce bias and
discrimination?



Robust De-anonymization of Large Sparse Datasets

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Abstract

We present a new class of statistical de-anonymization attacks against high-dimensional micro-data, such as individual preferences, recommendations, transaction records and so on. Our techniques are robust to perturbation in the data and tolerate some mistakes in the adversary's background knowledge.

We apply our de-anonymization methodology to the Netflix Prize dataset, which contains anonymous movie

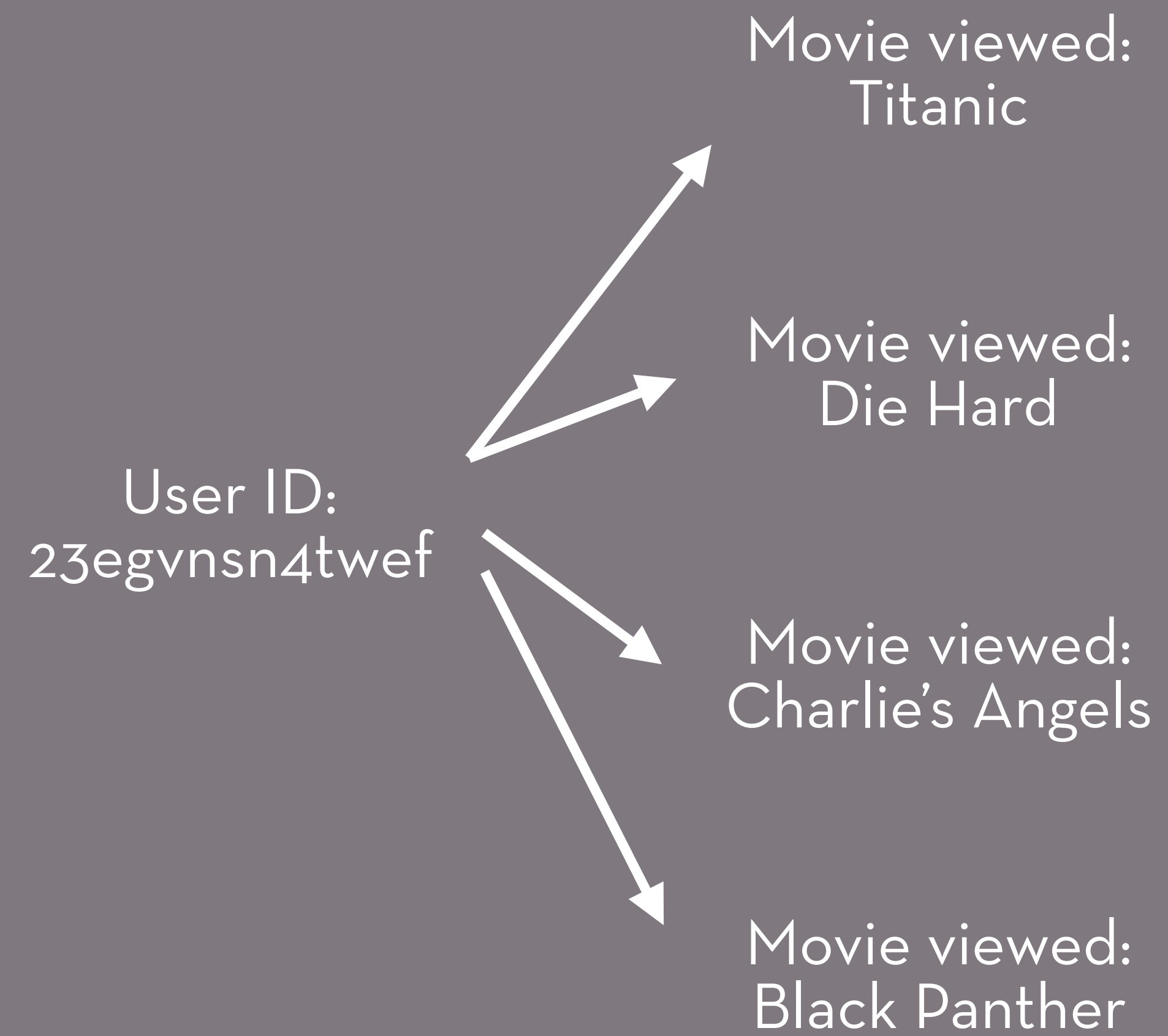
and sparsity. Each record contains many attributes (*i.e.*, columns in a database schema), which can be viewed as dimensions. Sparsity means that for the average record, there are no “similar” records in the multi-dimensional space defined by the attributes. This sparsity is empirically well-established [7, 4, 19] and related to the “fat tail” phenomenon: individual transaction and preference records tend to include statistically rare attributes.

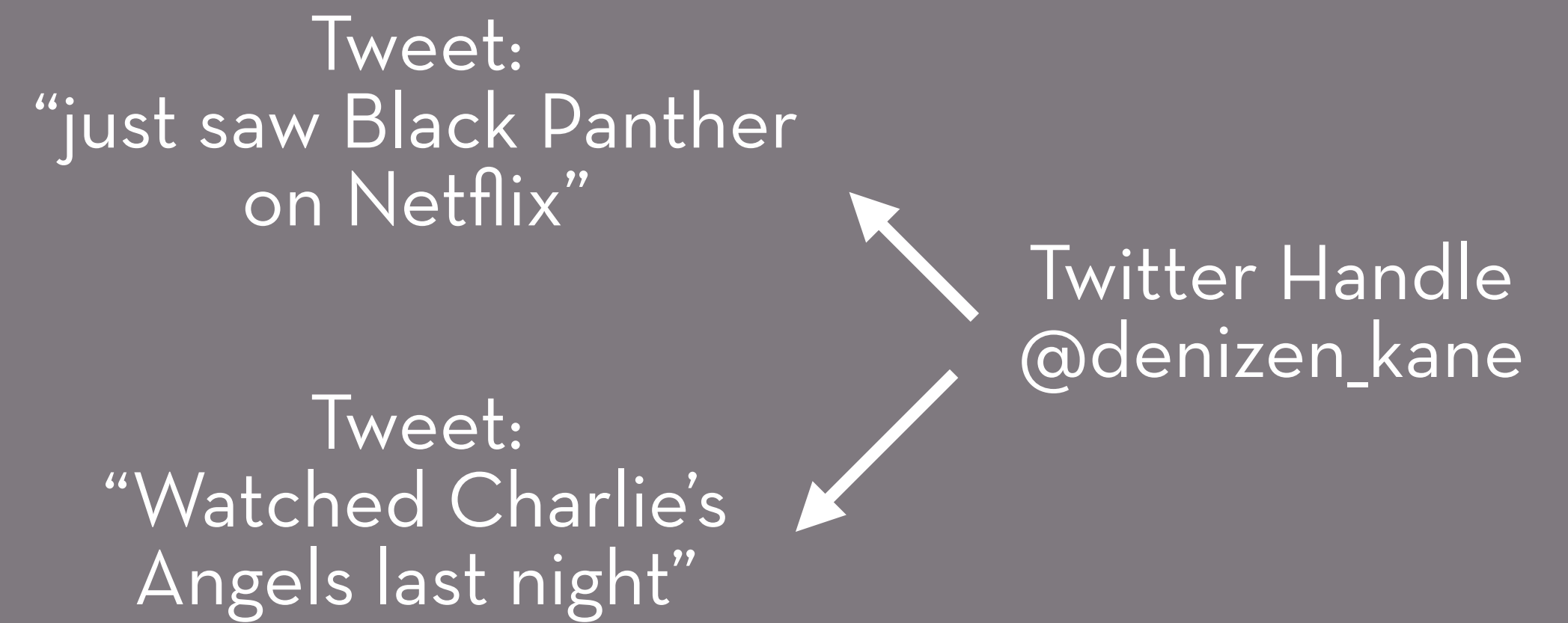
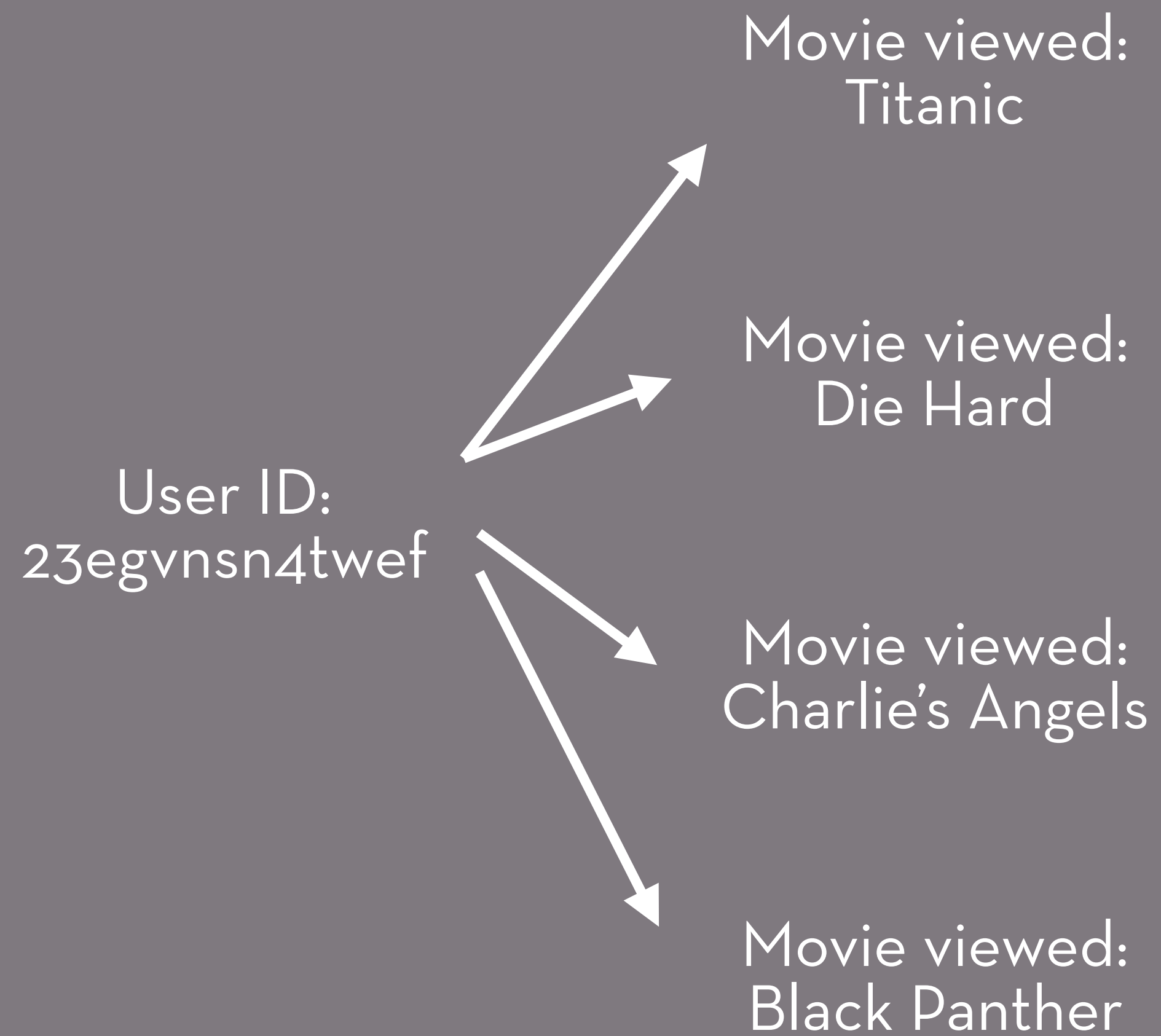
Our contributions. Our first contribution is a formal model for privacy breaches in anonymized micro-data



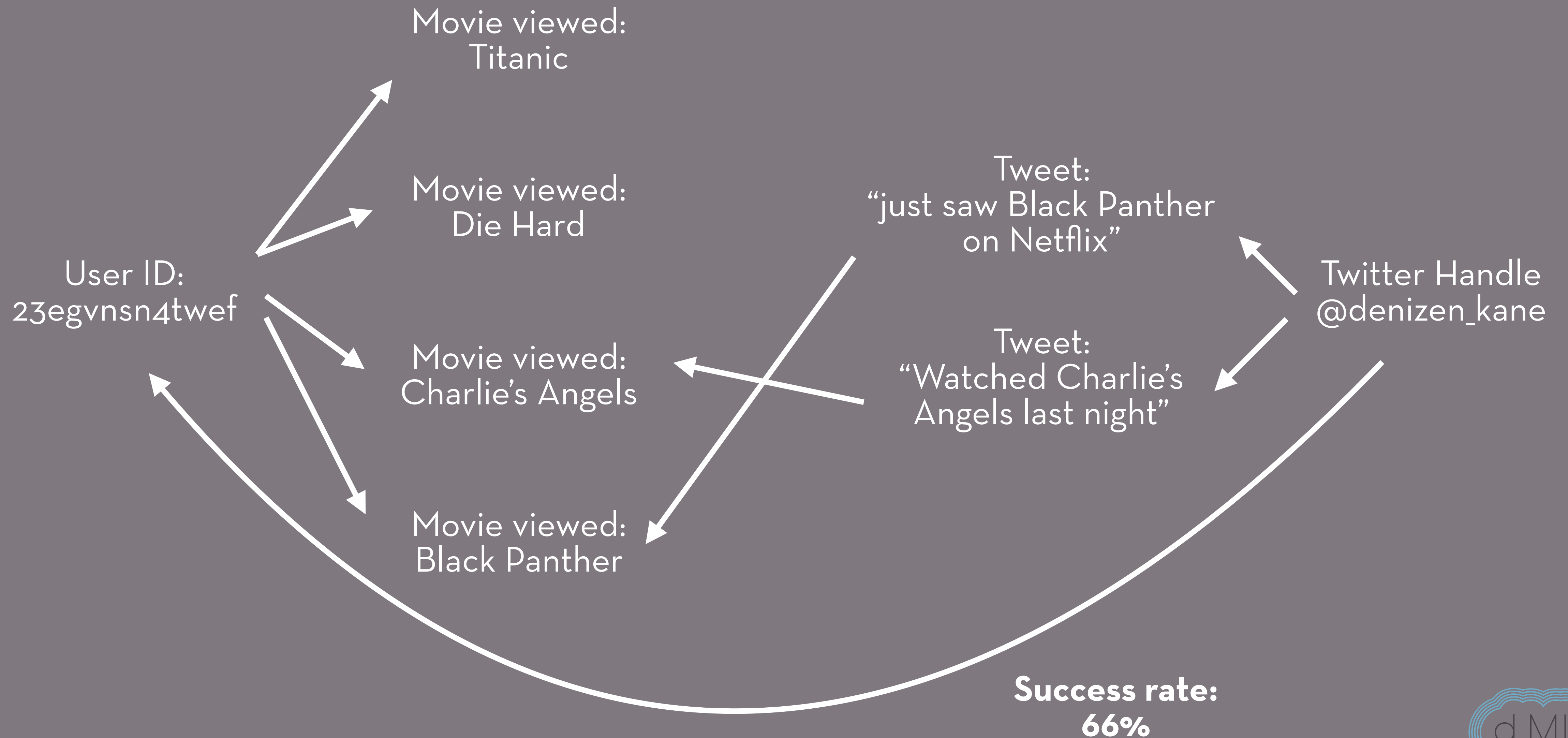
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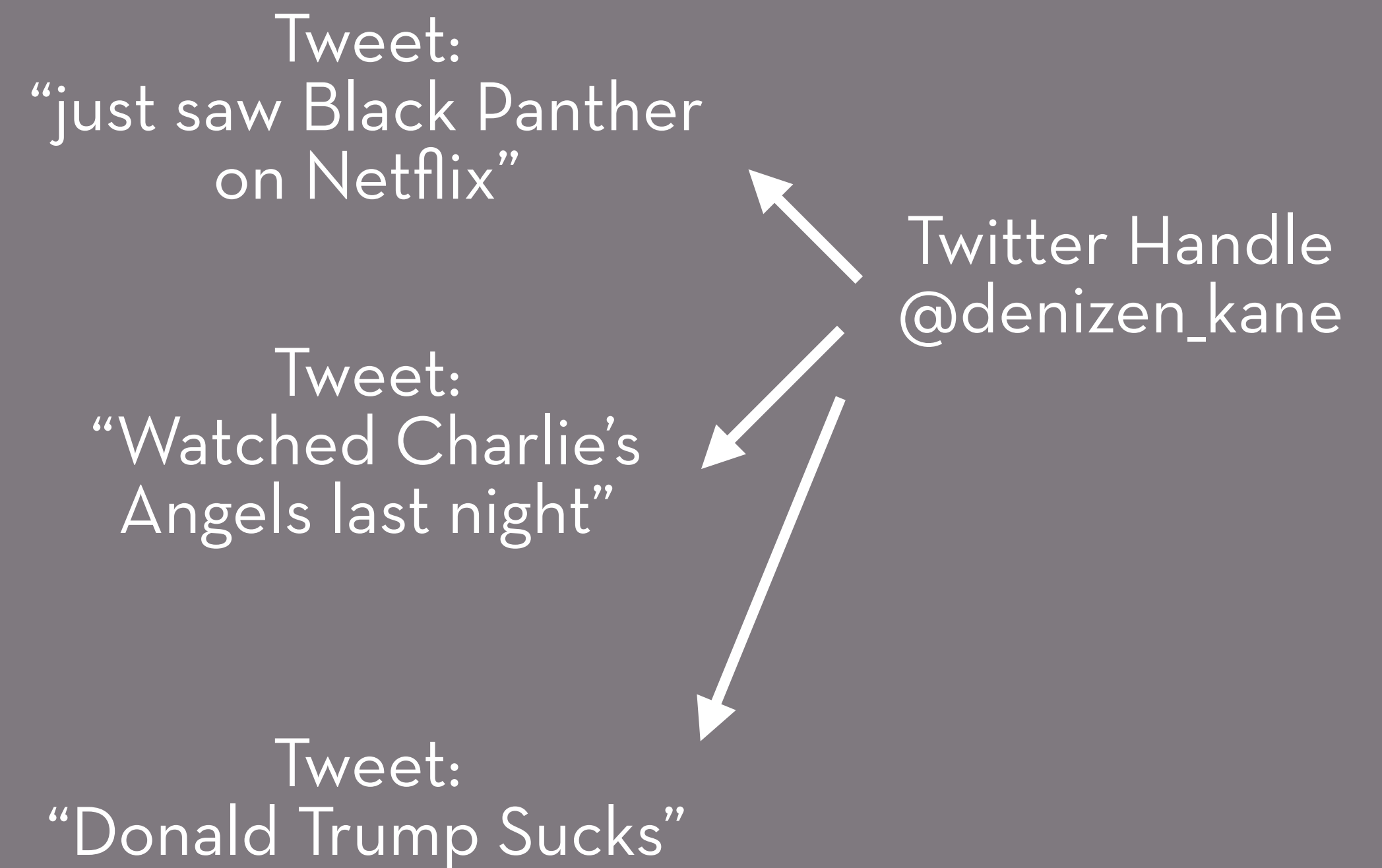
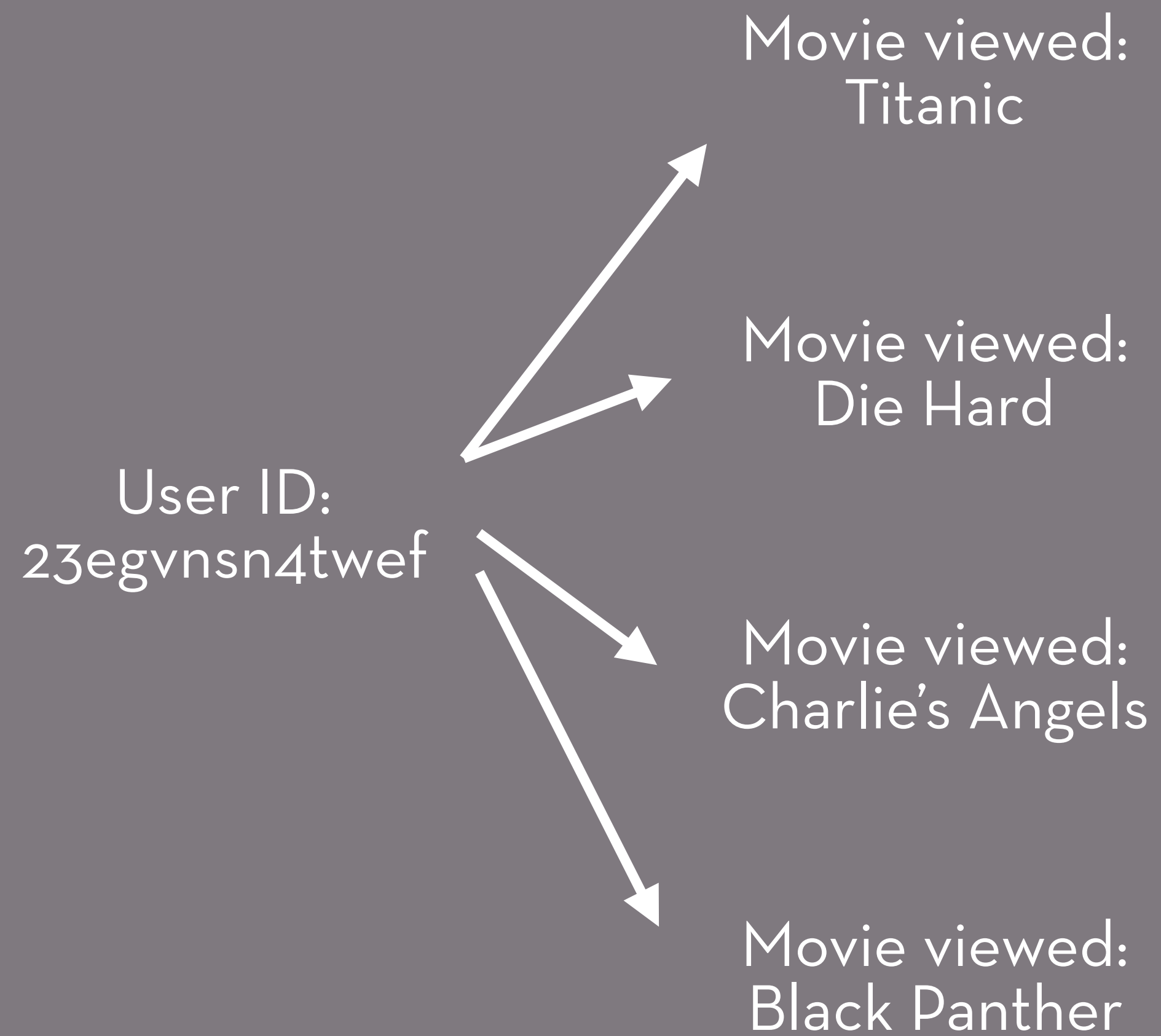












The de-anonymization was robust to:

- Erroneous/imprecise ratings
- Missing data points
- Long time windows
- Inclusion of incorrect data (fake users/movies)
- Anonymized movie titles (no meta-data)

***When you collect data at scale,
you implicitly know more about
your users than you bargained for***



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Sexual Orientation, Political
Preference, Mental Health, Drug
Use, Religious Affiliation, etc.

THE AGE OF SURVEILLANCE CAPITALISM

**THE FIGHT FOR A
HUMAN FUTURE
AT THE NEW
FRONTIER OF POWER**

**SHOSHANA
ZUBOFF**

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*“...behavioral prediction
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- Personalized advertising
- Re-targeting
- Insurance pricing
- Persuasive messaging
- Sponsored gamification
- Political advertisements

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Activision wins patent that uses matchmaking to make you want to buy stuff

By [James Davenport](#) October 17, 2017

Activision says the system is not is in place.

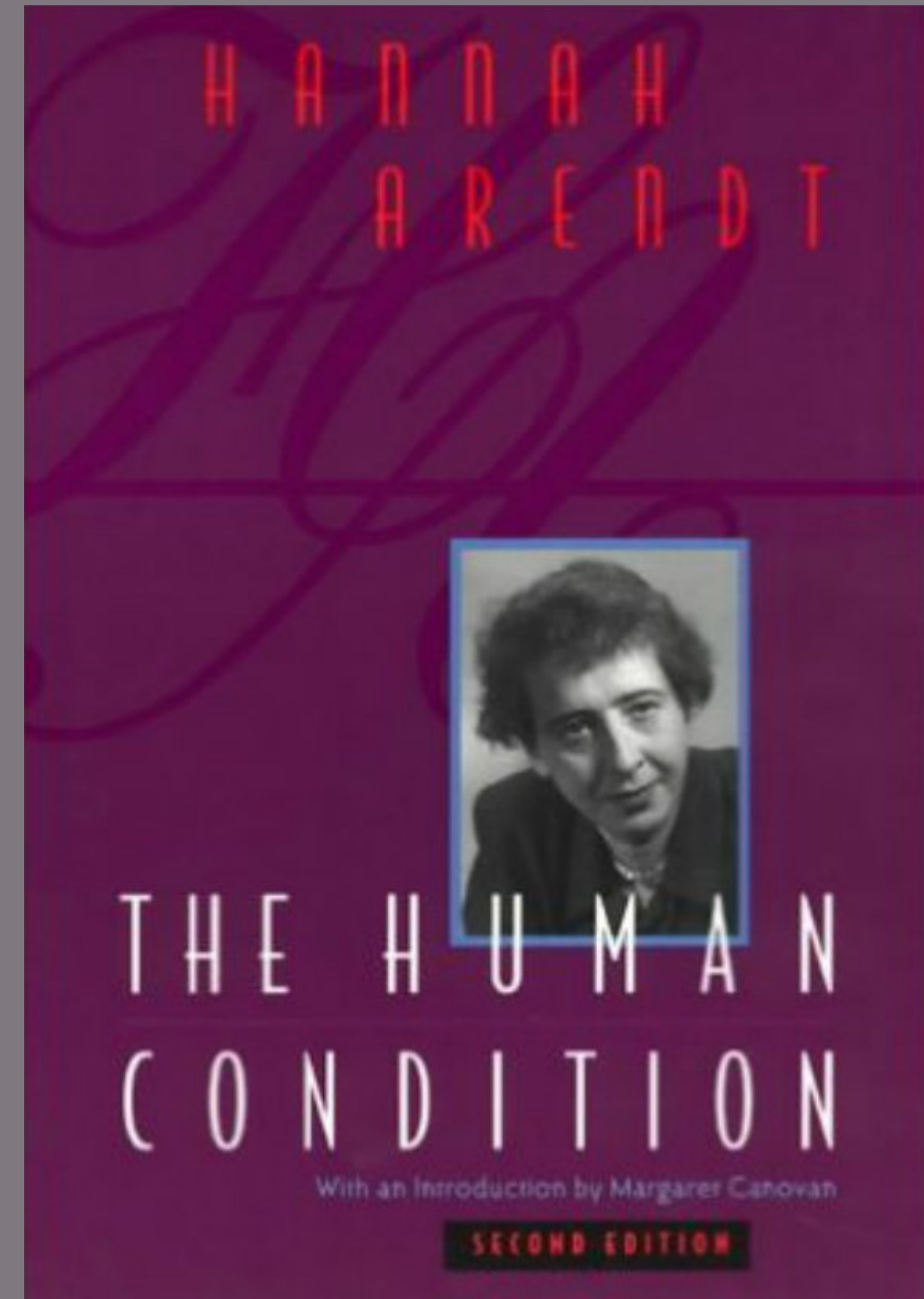
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Is this simply a “privacy issue”?

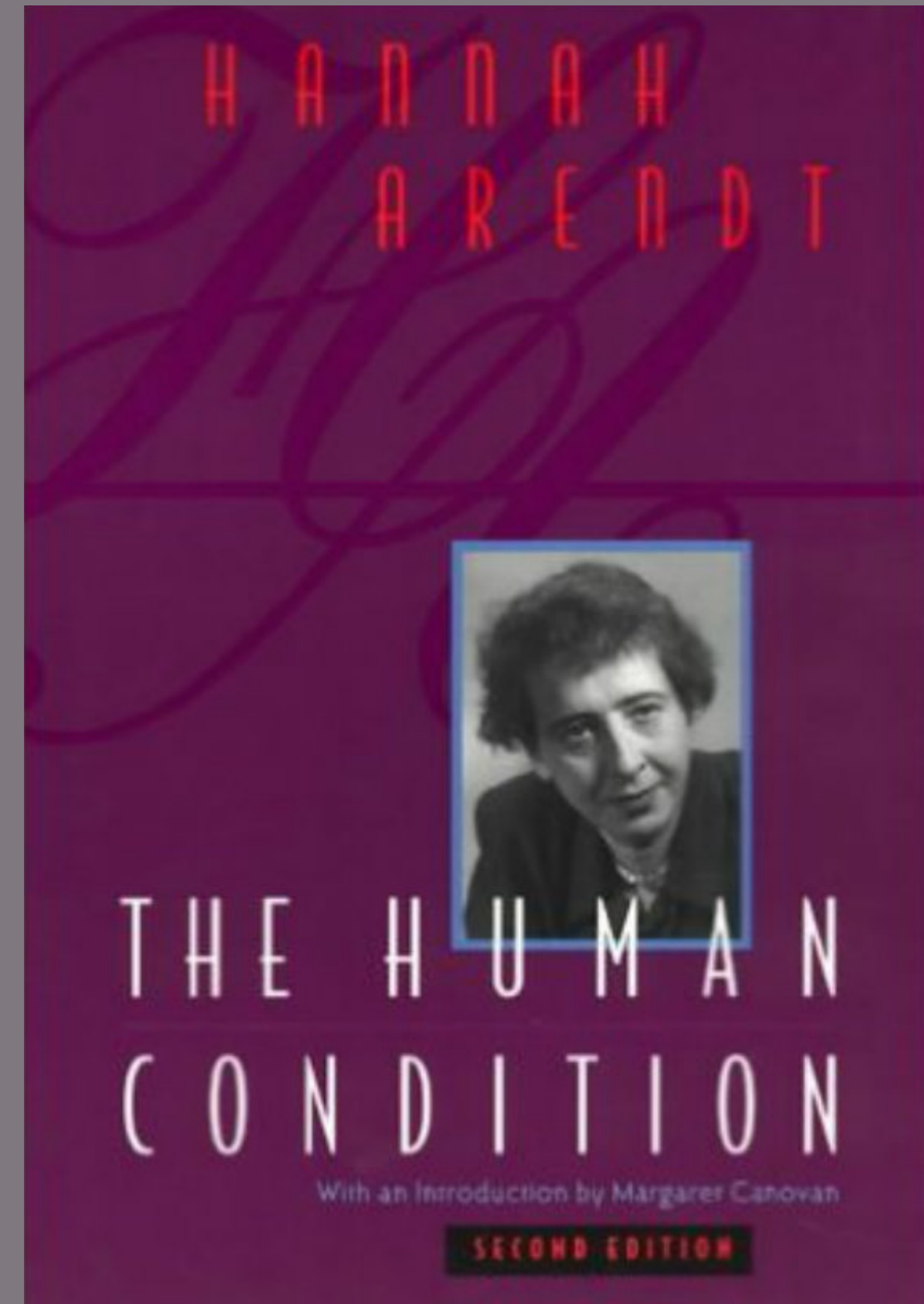


*“For us, appearance—**something that is being seen and heard by others** as well as by ourselves—constitutes reality.”*



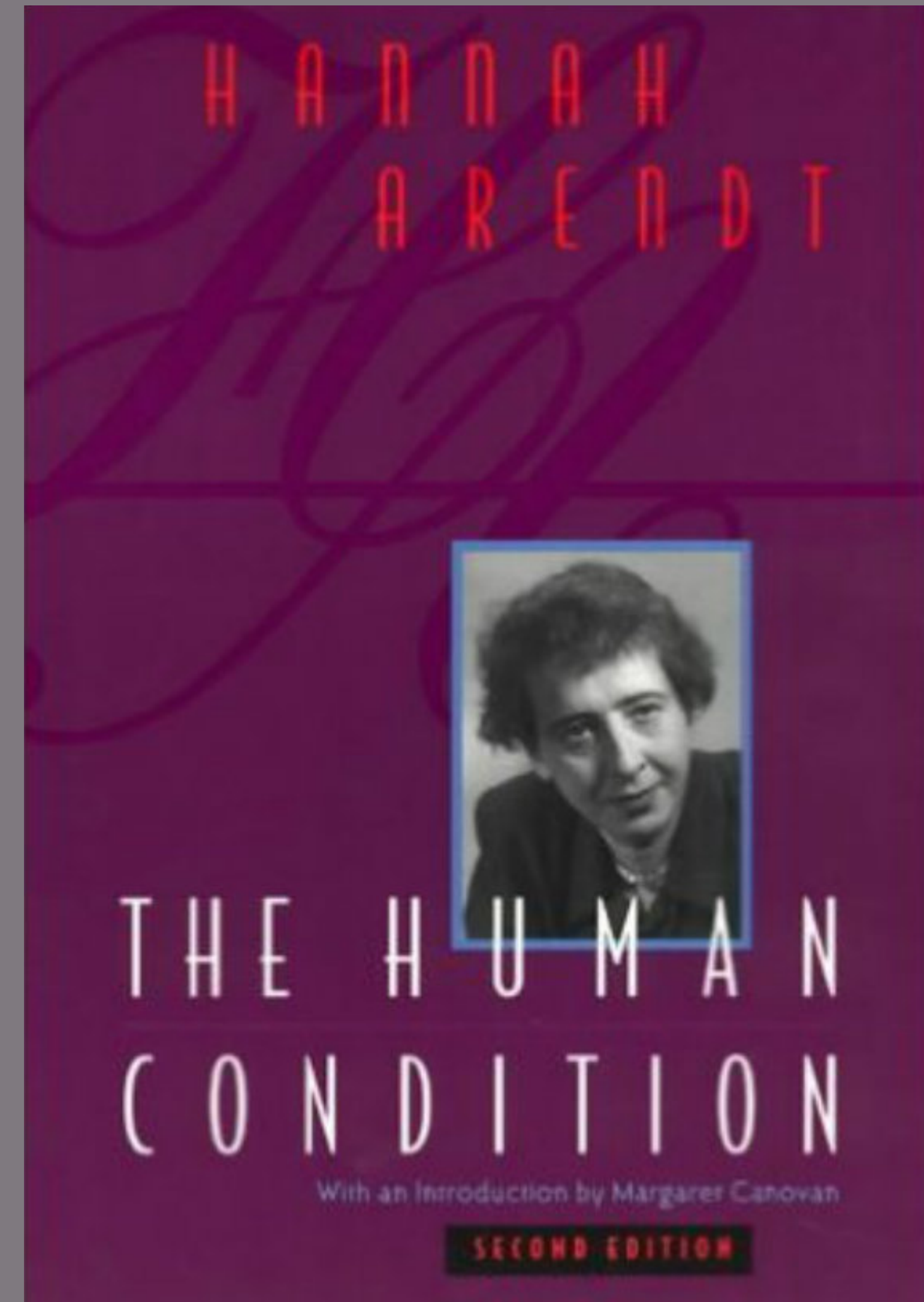
“For us, appearance—**something that is being seen and heard by others** as well as by ourselves—constitutes reality.”

“Yet there are a great many things which cannot withstand the **implacable, bright light of the constant presence of others** on the public scene”



*“Yet there are a great many things
which cannot withstand the
**implacable, bright light of the
constant presence of others** on the
public scene”*

*Power is “a potential and not an
unchangeable, measurable and reliable
entity like force or strength ... [it] **springs
up between men when they act together
and vanishes the moment they disperse**”*



Is this simply a “privacy issue”?

