# Responsible Recommendation

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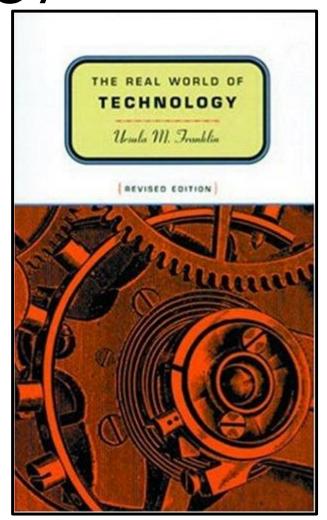


# The Real World of Technology

Ursula Franklin's 1989 Massey Lectures

Technology is not just artifacts.

- It is process
- It affects people
- It was designed by human action





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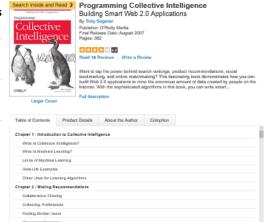
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## Key Questions

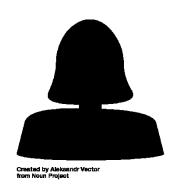
Who is involved in designing and evaluating our systems?

What is these systems' impact?

Recommender

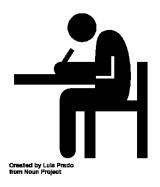
Expert Design User Input Behavioral Analysis

# Who Benefits from Recommendations?













from Noun Project

Whose voices are in the design process?

# Example: Meeting User Information Needs

Problem: naïve statistics over user base emphasizes largest group of users

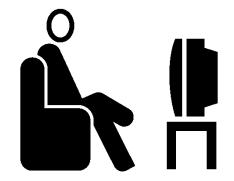
→ Minority groups might get worse results!

**Solution:** measure results for each group Mehrotra et al., 2016 – Microsoft Bing

# Example: Limits of Behavioral Observation

Neil Hunt, RecSys '14 keynote:

NetFlix's metrics cannot distinguish between an enr 'iction.



Created by Jems Mayor from Noun Project

## Intention-Behavior Gap

Problem: users say one thing and do another Old problem: Paul in 1<sup>st</sup> century said 'What I want to do, I don't do; what I don't want to do, I do.'

- They do not truly understand their desires.
- They are not satisfied with their actions.

Which is true?

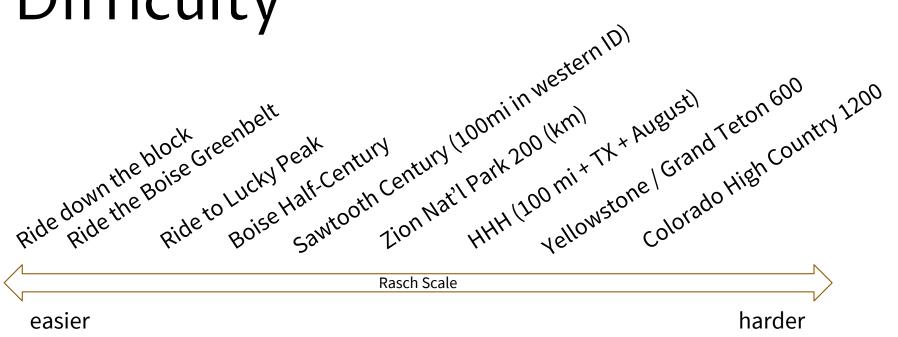


# Opportunities for Recommenders

If we know a user's **goals** and their **behavior**, maybe the recommender can help!

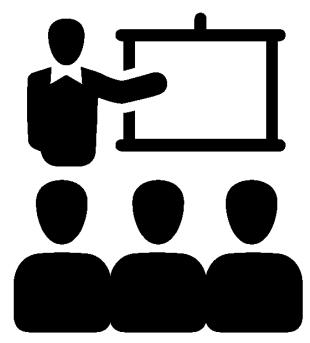
- Find 'baby steps' that are:
  - Likely to be adopted (behavior helps here!)
  - Closer to user's goals (their input necessary here!)
- Persuasive computing has how, but recsys can do more for what.

# Difficulty



## Reciprocity (Franklin, 1989)

Broadcast ...



Created by Delwar Hossain from Noun Project

... or conversation?



Created by Michael V. Suriano from Noun Project

## Giving Users a Voice

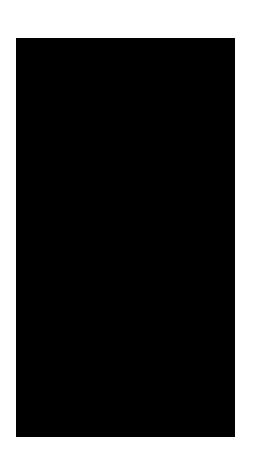
Participatory design provides a framework for incorporating user voices into the design process.

How do we scale it?

How does it apply to advanced algorithms?

**Transparency** lets users know whose voices are being incorporated and how.

### Promote Clickbait





### Reinforce Biases

Does the system propagate existing social biases?

How does this affect users?

Or content creators?



Rob Speer; <a href="https://goo.gl/13Ss1p">https://goo.gl/13Ss1p</a>

Fajitas, by stu spivack. CC-BY-SA 2.0.

## What's Missing?

#### A lot of work to do!

- How do we measure these things?
- How can we scale participatory design?
- What does participatory design of algorithms even look like?
- How can we use intention-behavior gap to build compelling recommender experiences?
- How can we provide *meaningful* control over the recommendation process to users?

#### What We Get

What is the impact of your system?

What will you do about it?

Michael D. Ekstrand







https://goo.gl/G1DK38