Origins of Bias



- Most research studies tend to be conducted in western countries with adaptive systems developed by designers in the west (Blanchard, 2012)
 - Little to no research on the generalizability when used in non-western contexts despite evidence on ulletdifferences in student use (Ogan et al., 2012)

- Most research studies tend to be conducted in western countries with adaptive systems developed by designers in the west (Blanchard, 2012)
- Small-scale experiments also tend to recruit from a convenience sample due to practical constraints of research projects
 - For example, undergraduate, middle-class students in the United States (Kimble, 1987)
 - These participants are likely to exhibit significant differences in their behavior than other subpopulations (Henrich et al., 2010)

Henrich, J. et al. (2010). Most people are not WEIRD. Nature. Kimble, G. A. (1987). The scientific value of undergraduate research participation. American Psychologist.



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- Invalidates assumptions for student subpopulations not represented in the experiments informing upstream components



- Due to issues in data collection methods
- Reliability of measurements across different student subpopulations
 - For example, coder bias due to cross-cultural affect coding •
 - Poor performance of automated facial recognition for female students and those with darker skin tones (Lohr, 2018)
 - Demographic differences in the reliability of self-reports (e.g., age, culture) \bullet

Measurement Bias

Lohr, S. (2018). Facial recognition is accurate, if you're a white guy. New York Times.

Historical Bias

- Forming theories and design choices by observing the world as it exists (including its biases)
 - ulletskin color (Roth, 2009)
- Historical biases embedded in upstream sources get perpetuated by downstream applications
 - ulletlarger scale

For example, earlier cameras were designed to bring out high contrast and better resolution for white

For example, a predictive model that then automates the biased decision-making at a potentially

Roth, L. (2009). Looking at Shirley, the Ultimate Norm: Colour Balance, Image Technologies, and Cognitive Equity. Canadian Journal of Communication.

Origins of Bias

- Representation Bias
- Measurement Bias
- Historical Bias
- Aggregation Bias
- Evaluation Bias
- Deployment Bias

Suresh, H., & Guttag, J. V. (2020). A framework for understanding unintended consequences of machine learning.

For your example model(s), please share some potential origins of biases in them.

Discussion Board Question