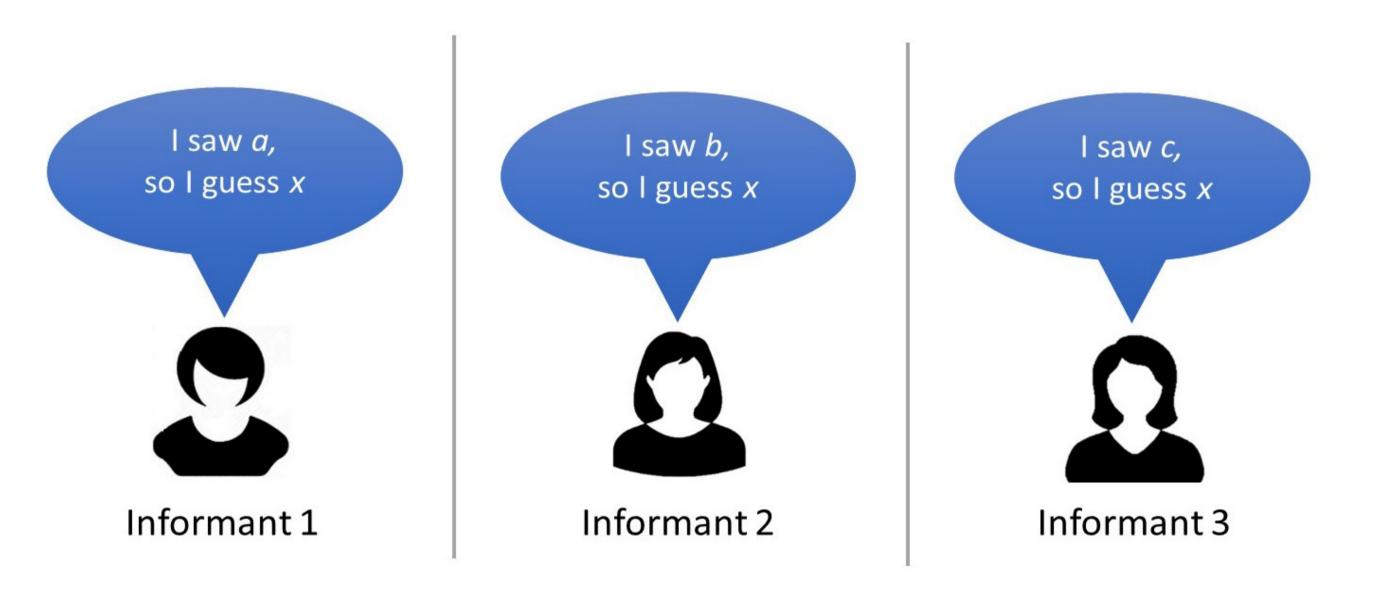
# Independent Testimonies are no better than Sequential Testimonies in Judgments under Uncertainty

# Belinda Xie, Danielle Navarro, Brett Hayes University of New South Wales, Sydney, Australia

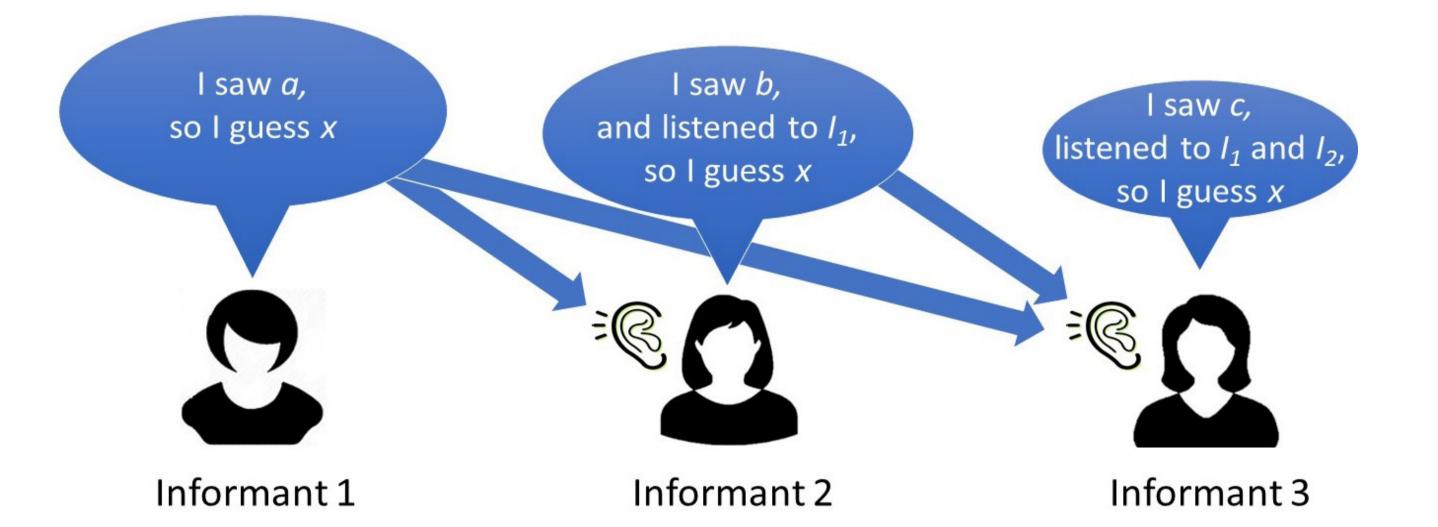


# Background

Independent testimonies provide novel information



# Dependent testimonies involve redundant information

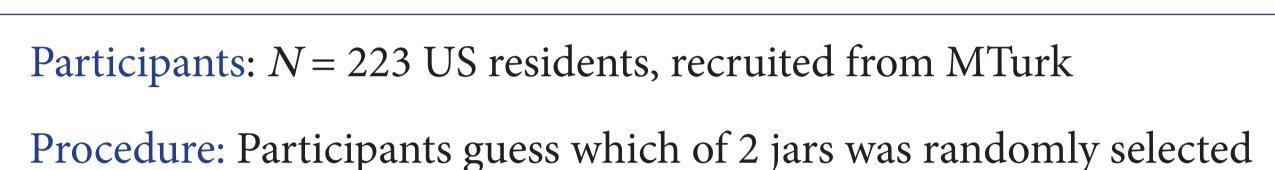


## Two conflicting accounts:

- 1) Dependent evidence influences reasoning more than it normatively should.
- Participants were as confident in a true consensus (many primary sources) as a false consensus (a single primary source) (Yousif, Aboody, & Keil, 2018)
- Participants either did not attend to dependence, or did not know how to incorporate dependencies when combining forecasts (Maines, 1996)
- Participants conformed more to opinions consistent with their own information, regardless of that opinion's level of redundancy to their own information (Gonzalez, 1994)
- 2) People are sensitive to dependency, consistent with a Bayesian model of updating.
- Whalen, Griffiths, and Buchsbaum (2017) developed a Bayesian model of social learning
  - Then used a balls-and-urns task with social testimony (Anderson and Holt, 1997)
  - Participants used dependent testimony less than independent testimony

- 1) Re-examine participants' sensitivity to dependency, using the Whalen et al., (2017) task
- 2) Identify how participants update after each piece of evidence
- 3) Compare this updating with Whalen et al., (2017)'s Bayesian model of social learning

# Experiment 1



1) Blue jar contains 100 blue, 20 red balls (5/6<sup>ths</sup> blue). p(blue jar) = p(red jar) = .5

- 2) Several friends help: 1. Each receives a ball from the jar
- 2. Gives their best guess on which jar was
- Always guessed the same jar
- We manipulated:
- Dependency of testimony:
- Guesses are independent (top) • Or made **sequentially** after hearing previous guesses (bottom)
- Number of informants:
- 3) Participant makes likelihood rating after each guess
- 4) Participant receives own ball

Colour conflicts with all guesses

5) Participant makes final likelihood rating

# I looked at my ball *and* thought about what Emma I looked at my ball and thought about wha guess the **blue** jar was Emma said. I guess and Sarah said. I guess the **blue** jar was selecte 7 Based on my friends' guesses and the ball you saw,

# Bayesian Model of Social Learning (Whalen et al., 2017)

### Independent

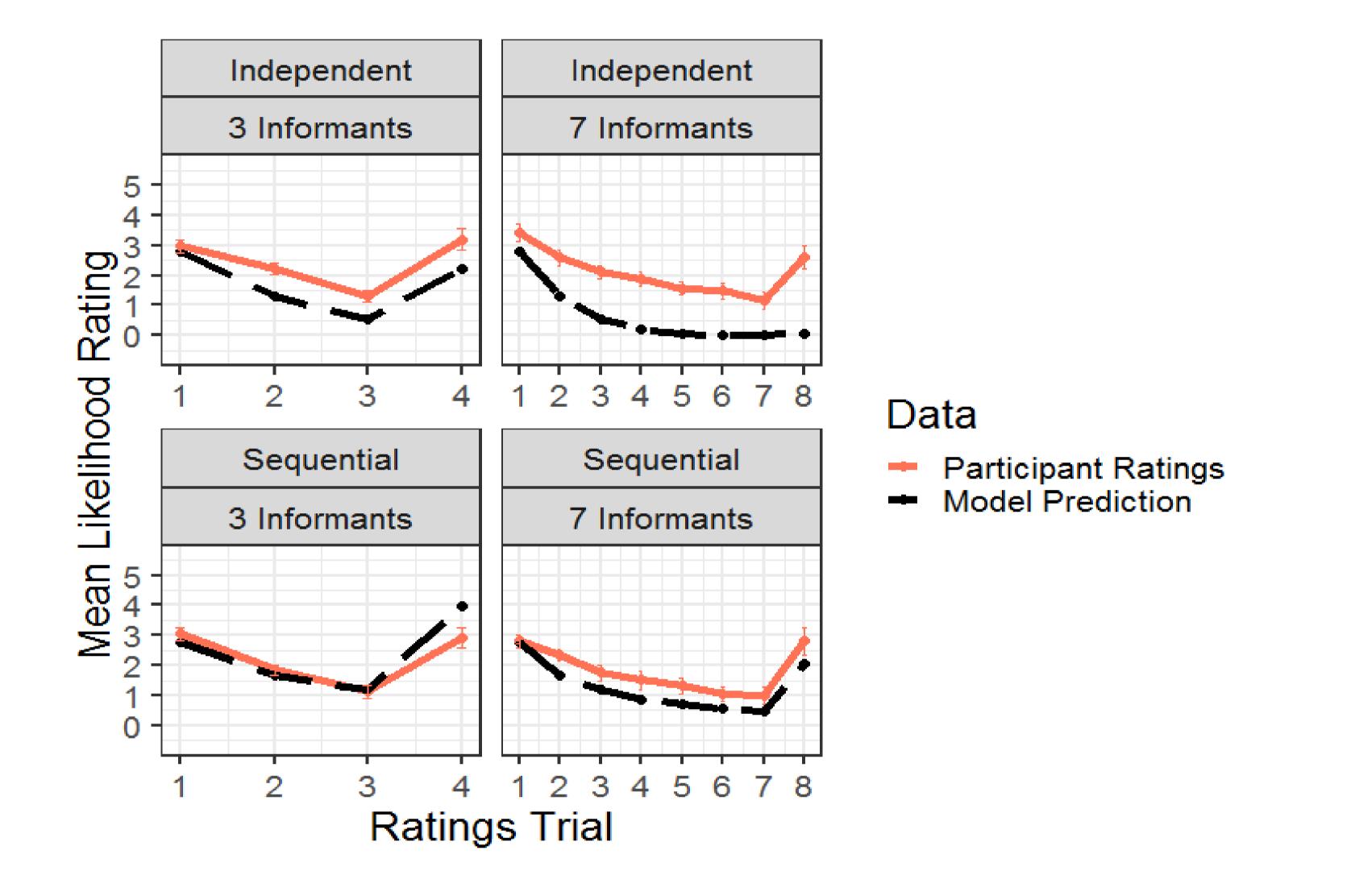
• Posterior probability of  $jar_{red} \propto probability$  of each testimony, given possible balls

 $p(jar_{red} \mid ball_{own}, t_1, t_2, t_3) = 1 - p(jar_{blue} \mid ball_{own}, t_1, t_2, t_3)$ 

- $\propto p(t_1, t_2, t_3 | jar_{red}) \times p(ball_{own} | jar_{red}) \times p(jar_{red})$
- $= p(t_1 \mid ball_{i1}) \times p(t_2 \mid ball_{i2}) \times p(t_3 \mid ball_{i3}) \times p(ball_{i1}, ball_{i2}, ball_{i3}) \times 1/6 \times 1/2$

### Sequential

- Posterior probability of jar $_{red}$   $\propto$  probability of each testimony, given possible balls AND previous testimonies
- Therefore, every informant undergoes the above inference for any previous informant(s)
- Model assumes participants take this into account



# Independent vs. Sequential

# Analyse updating in 2 stages:

- . Downward slope ratings after (3 or 7) testimonies
- Likelihood ratings decrease with more testimonies ( $BF_{10} > 1000$ )
- Decrease not affected by number of informants (3 vs. 7;  $BF_{01} = 2.46$ )
- Nor by dependency (independent vs. sequential;  $BF_{10} = 1.05$ )
- 2. Uptick rating after own ball
- Rating did increase from penultimate to final rating ( $BF_{10} > 1000$ )
- Increase not affected by number of informants ( $BF_{01} = 5.96$ )
- Nor by dependency ( $BF_{01} = 6.58$ )

## Participant ratings vs. Model predictions

- Closer model fit in sequential conditions ( $R^2 = .81$ ),
- Compared to independent conditions ( $R^2 = .71$ )
- Independent ratings are conservative (closer towards midline than predicted)

### Summary

- 1. In all conditions, participants updated in the predicted directions
- 2. This updating was unaffected by 1) dependency, or 2) number of informants
- 3. Sequential ratings fit the Whalen et al., (2017) model better than independent ratings

# Conclusions

We found no evidence that participants are sensitive to the dependency of testimony.

- In other experiments, we have shown that this lack of sensitivity is NOT due to;
- Using a between-subjects design (N = 150)
- Recency effects (swapped evidence order; N = 450)
- Belief that sources are unreliable (N = 167; e.g., Collins, Hahn, von Gerber, & Olsson, 2018)
- Dependency-insensitive reasoning is often thought to be caused by participants giving disproportionately large weight to dependent information
- E.g., Fiedler, Hütter, Schott, and Kutzner (2019) argue that we experience 'metacognitive myopia', in failing to discount repeated information

We show that reasoning from sequential evidence conforms more to a Bayesian model than reasoning from independent evidence

- This is somewhat unexpected the computational task of inferring probabilities from independent testimonies is less complex than that from sequential testimonies
- Independent ratings resemble the classic demonstration of conservatism (Phillips, Hays, & Edwards, 1966)
- This conservatism may be caused by participants assuming some conditional dependence (Navon, 1978; Winkler & Murphy, 1973)

### Future work:

- What is the influence of dependent testimonies in other domains (e.g., medical diagnosis)?
- What other models of belief updating could better account for these results?

- Anderson, L. R., & Holt, C. A. (1997). Information Cascades in the Laboratory. The American Economic Review, 87(5), 847-
- Whalen, A., Griffiths, T. L., & Buchsbaum, D. (2017). Sensitivity to Shared Information in Social Learning. Cognitive Science. doi: 10.1111/cogs.12485

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### Correspondence

belinda.xie@unsw.edu.au