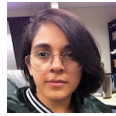


## Modeling the effects of attention on causal inference in multisensory perception

Michael S. Landy



Stephanie Badde

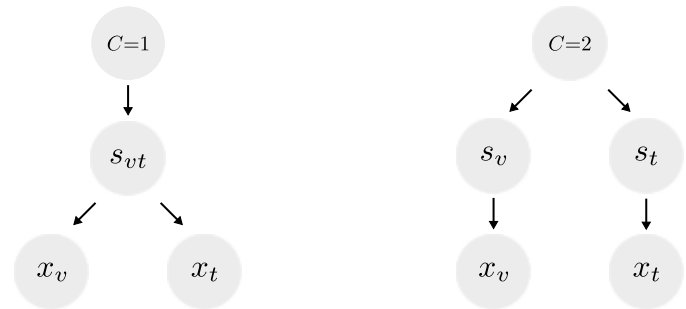


Karen Navarro



Badde, S., Navarro, K. T. & Landy, M. S. (2020). *Cognition*, 197, 104170

## Causal Inference for visual-tactile localization and recalibration



Körding et al., 2007

### Attention toward a modality: Ventriloquism and its aftereffect

- Top-down attention to a modality can influence visual-auditory and visual-proprioceptive ventriloquism effects and aftereffects

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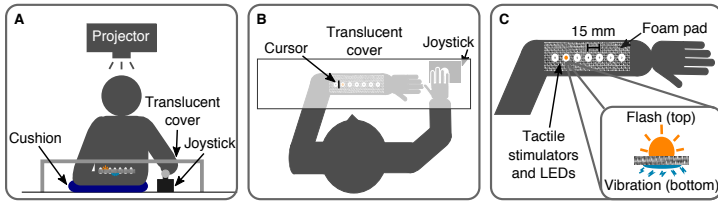
### Attention toward a modality: Ventriloquism and its aftereffect

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- Can modality-specific attention influence recalibration (the ventriloquism aftereffect)?

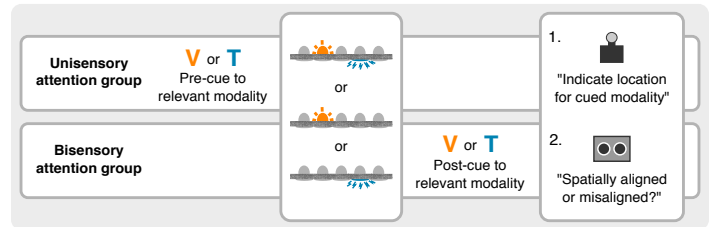
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- Does it do so via cue reliability or causal inference?

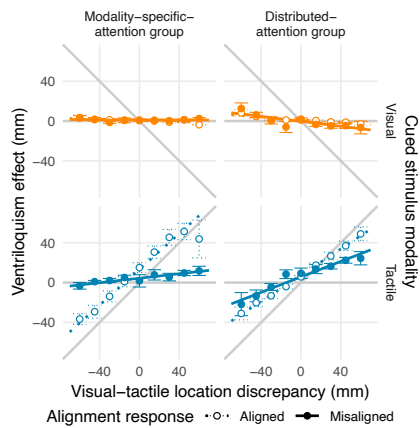
## 1. Ventriloquism effect: Apparatus



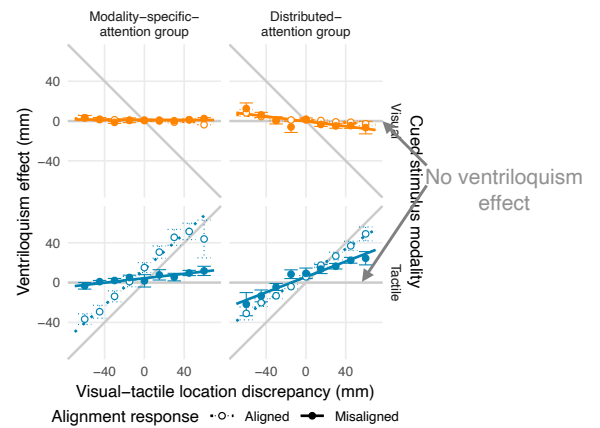
## Ventriloquism effect: Procedure



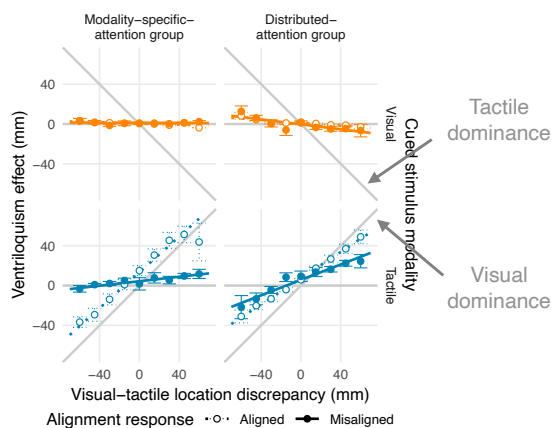
## Ventriloquism effect: Results



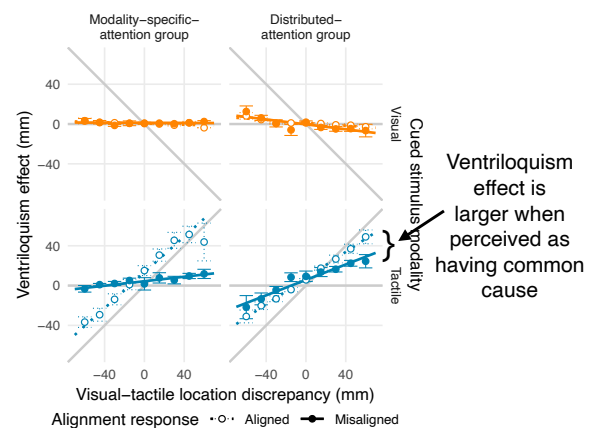
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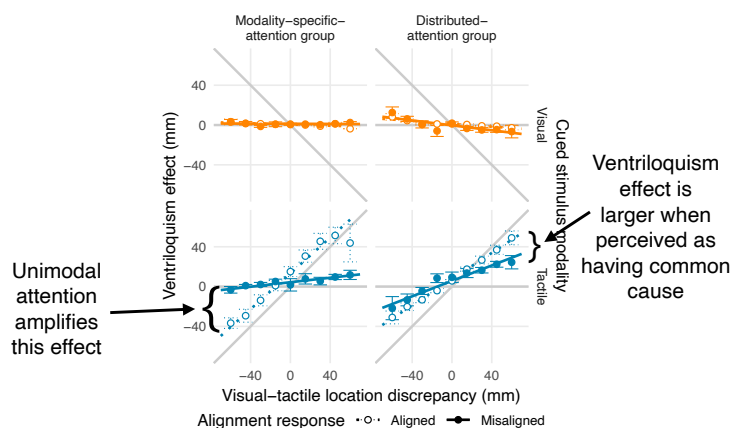
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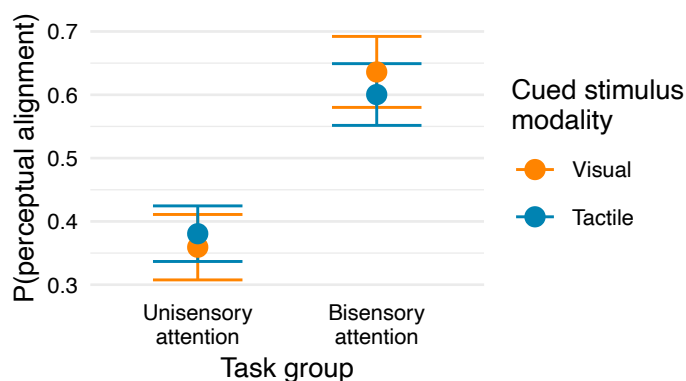
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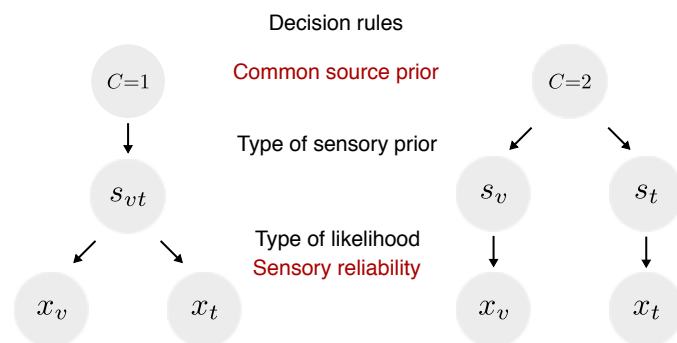


## Ventriloquism effect: Conclusions

Distribution of attention across the two modalities leads to stronger ventriloquism, including

- an increase in the proportion of perceived alignment of tactile-visual stimuli
- increased tactile shifts toward the visual stimulus for stimulus pairs judged to be misaligned, while the shifts for stimuli judged to be aligned is near-maximal in both attention conditions.

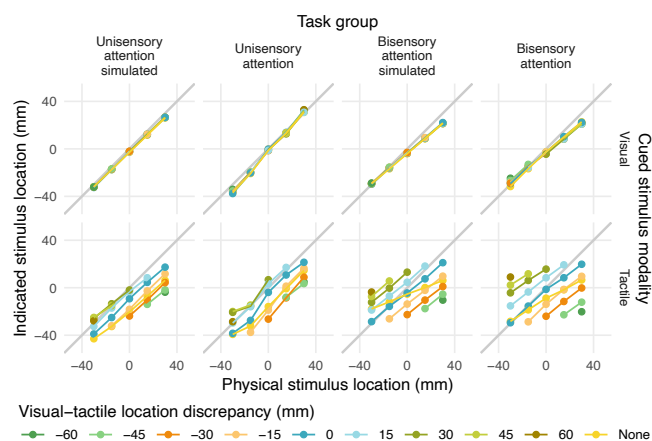
## Ventriloquism effect: Models



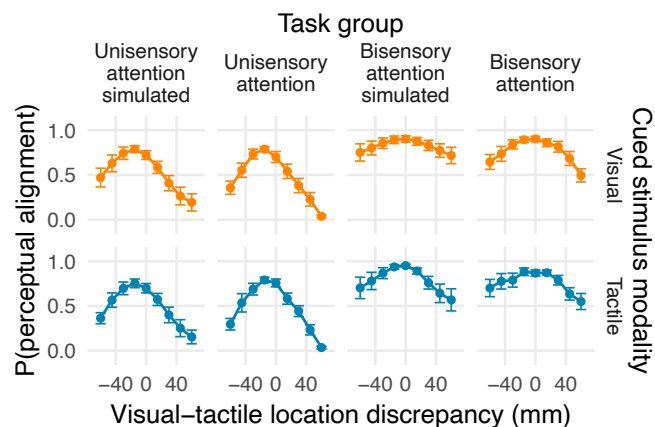
## Ventriloquism effect: Models

- The winning model (using AIC) was the same for the unisensory and bisensory attention groups
- Localization responses based on the ideal observer, but overt common-cause judgments based on a heuristic: the distance between the unisensory location estimates

## Ventriloquism effect: Modeling

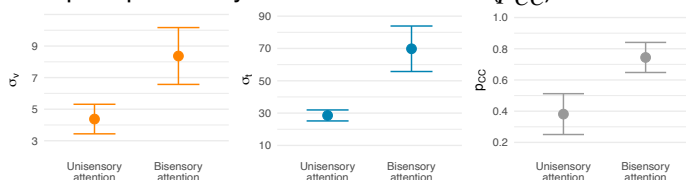


## Ventriloquism effect: Modeling



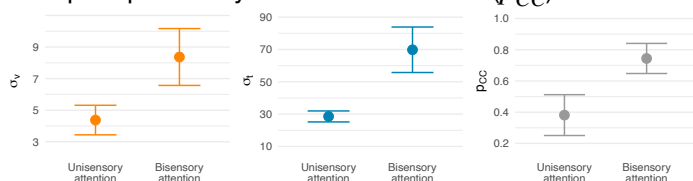
## Ventriloquism effect: Modeling

The model allowed for an effect of modality-specific attention on tactile and visual variability ( $\sigma_t^2$ ,  $\sigma_v^2$ ) and the prior probability of a common cause ( $p_{CC}$ ).



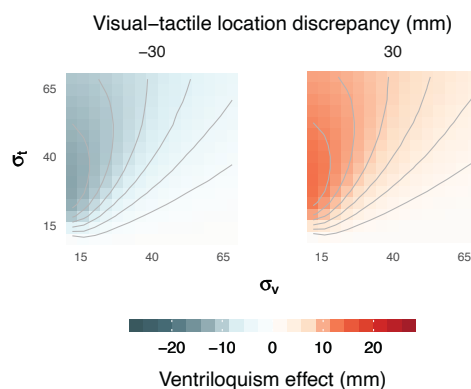
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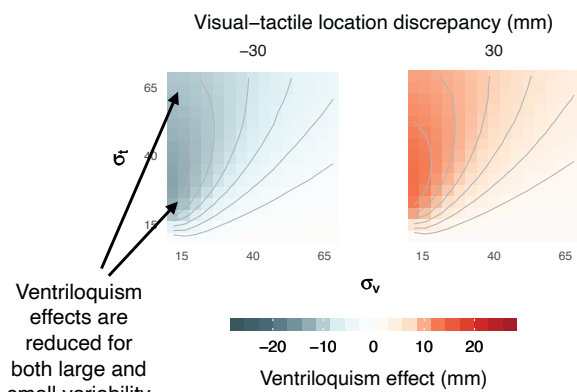


Distributed attention increases localization noise (e.g., due to limited capacity) and increases the “prior” probability of a common cause.

## Ventriloquism model simulations: Tactile shifts

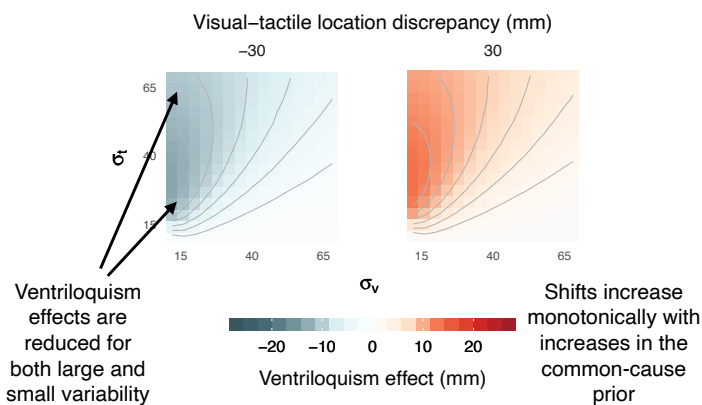


## Ventriloquism model simulations: Tactile shifts



Ventriloquism effects are reduced for both large and small variability

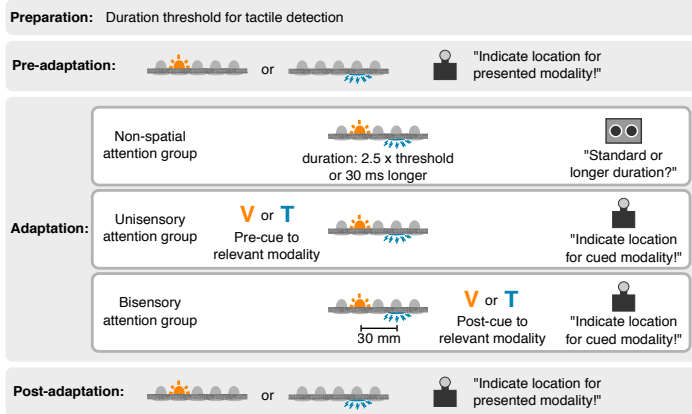
## Ventriloquism model simulations: Tactile shifts



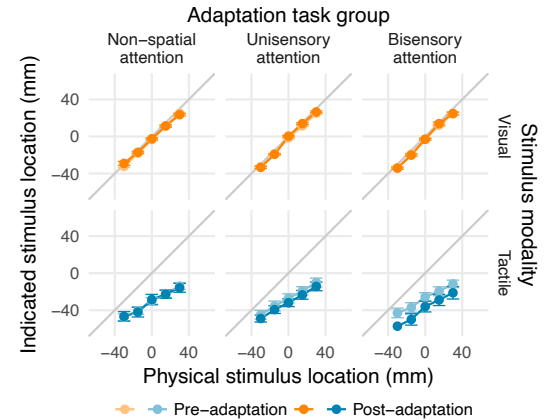
Ventriloquism effects are reduced for both large and small variability

Shifts increase monotonically with increases in the common-cause prior

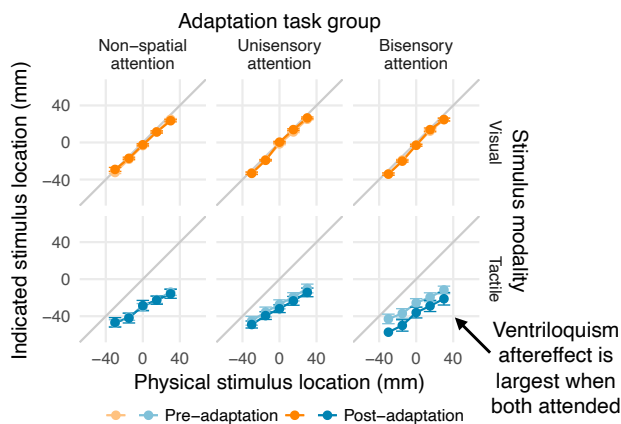
## 2. Ventriloquism aftereffect: Procedure



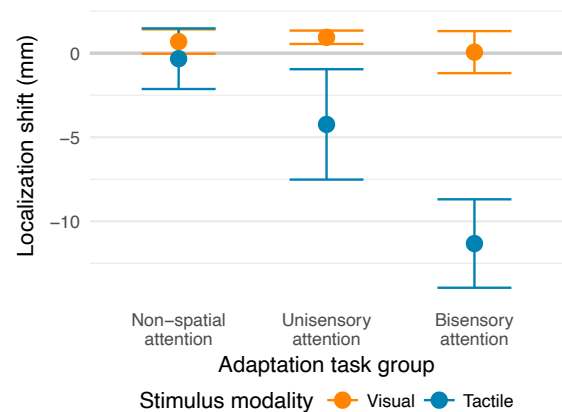
## Ventriloquism aftereffect: Results



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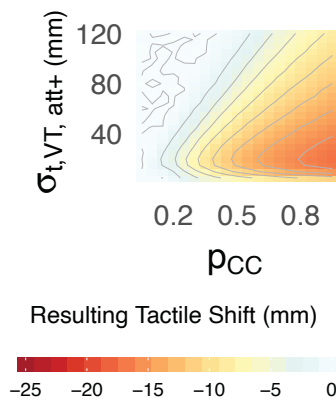
## Ventriloquism aftereffect: Conclusions

- Recalibration of touch significant only when both modalities' locations are attended during the adaptation phase
- Perhaps this is due to the degree of integration during the adaptation phase, which is influenced by cue reliability and the common-cause prior
- No recalibration of vision

## Ventriloquism aftereffect: Models

- On each trial, likelihood shifts are updated based on the discrepancy between cue measurements and estimates
- Cue estimates depend on measurements, priors, and the estimated probability of a common cause
- Updates can occur
  - Always
  - Only when the probability of a common cause > 0.5
  - Always, but modulated by the probability of a common cause

## Ventriloquist aftereffect: Modeling



## Ventriloquism aftereffect: Model results

- All three models predict greater recalibration with larger  $p_{cc}$
- The dependence of recalibration on the reliability of the tactile stimulus is non-monotonic: Relative to high tactile reliability:
  - reducing tactile reliability leads to greater tactile recalibration
  - but when reliability is low enough, reducing it further leads to *less* recalibration

## Ventriloquism aftereffect: Model results

- All three models predict greater recalibration in the bisensory attention condition
- However, only the second model, in which updates only occur if the estimated probability of a common cause is high, predicts an effect large enough to accord with the observed results

## Conclusions

Attention to a cue contributes in two ways:

- Attention toward a single modality increases its reliability, however, this might increase or decrease ventriloquism effects or aftereffects, depending on the level of reliability
- However, the strongest contribution of distributing attention across modalities is surprising: it strengthens the “prior” of the two cues as having a common cause, thus “priors” aren’t really prior, but depend on context/ state variables