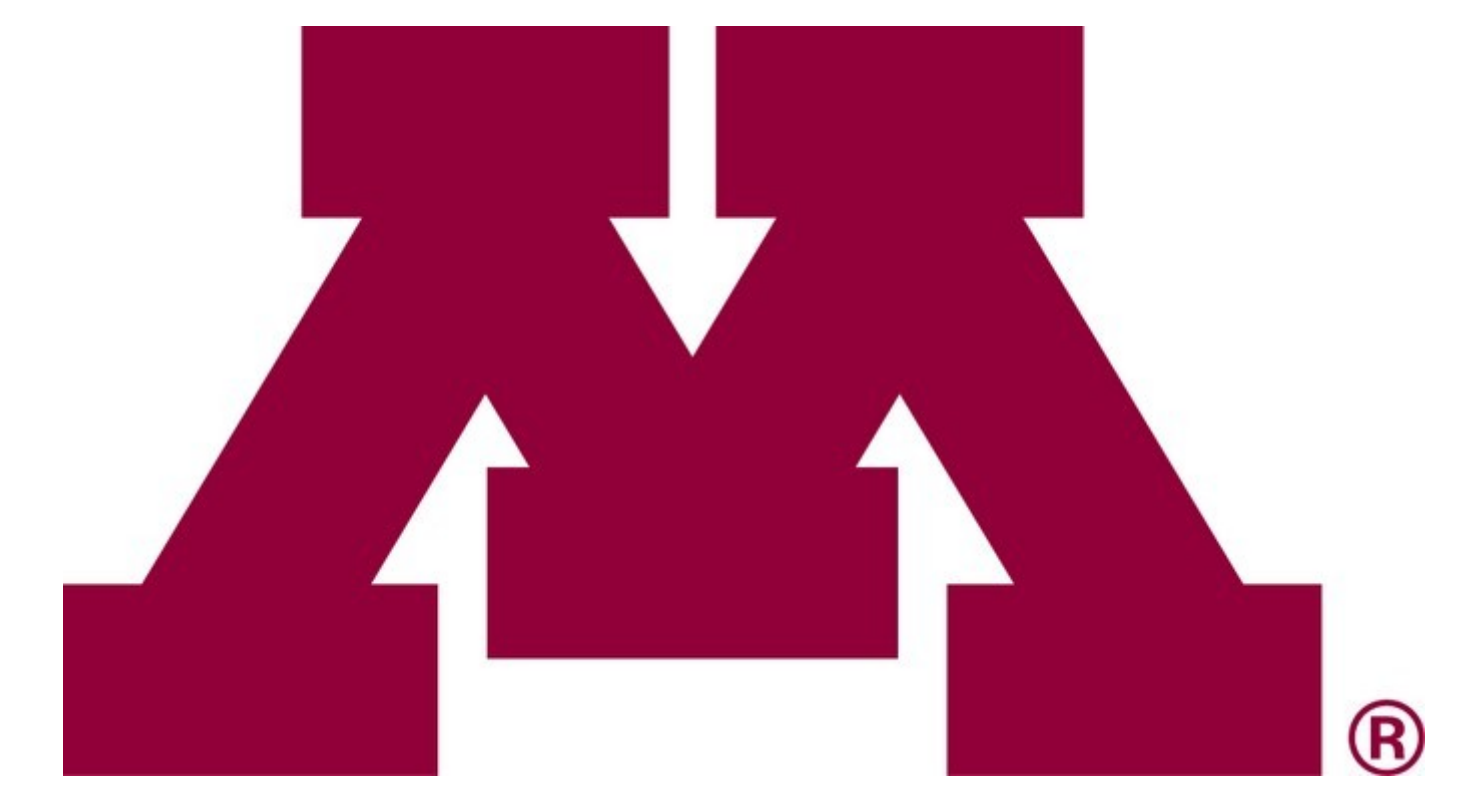


# The reliability of human clustering

Vijay Marupudi, V. N. Vimal Rao, Jimin Park, Rina Harsch, Jeffrey K. Bye, Sashank Varma  
University of Minnesota



## BACKGROUND

### Traveling Salesman Problem

- Involves creating a tour which connects a set of cities while visiting each city exactly once.
- Computers find this problem hard.
- Humans are nearly optimal for low numbers of cities.
- Humans are pretty efficient, i.e., their solution time taken grows linearly with number of cities.
- It has been proposed that humans are guided by the external boundary of the cities (convex hull), but this strategy does not have a linear time complexity.

### Hypothesis

- People might be *clustering* the problems into mini-TSPs, solving them, and then connecting the clusters together.
- This strategy could enable near-optimal, linear-time performance.

#### Research Questions

- Is human clustering reliable to support this strategy?
- Is human TSP performance reliable?
- Do people's clusters predict their TSP performance / path?

## METHOD

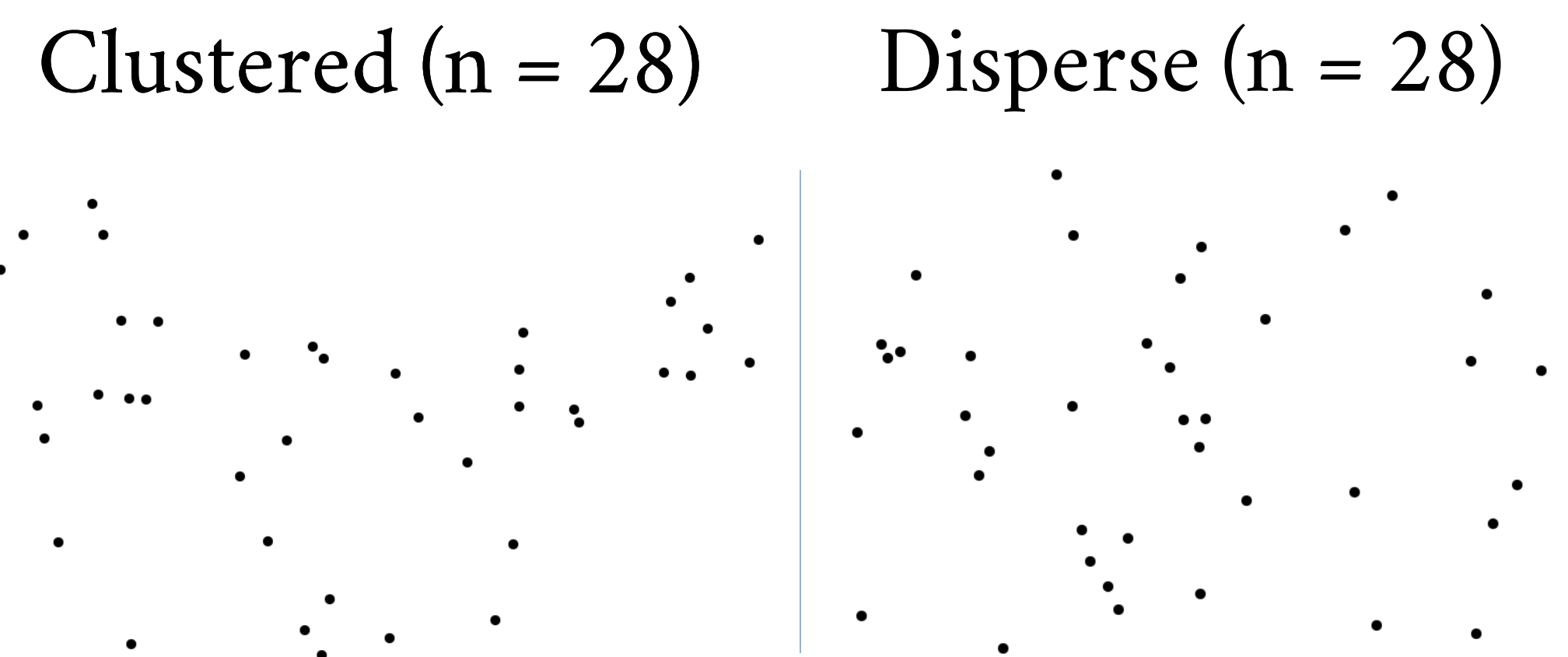
**Participants:** N= 13 (ongoing till 40), undergraduate students.

**Procedure:** Participants clustered 112 dot clouds at a computer using a mouse.

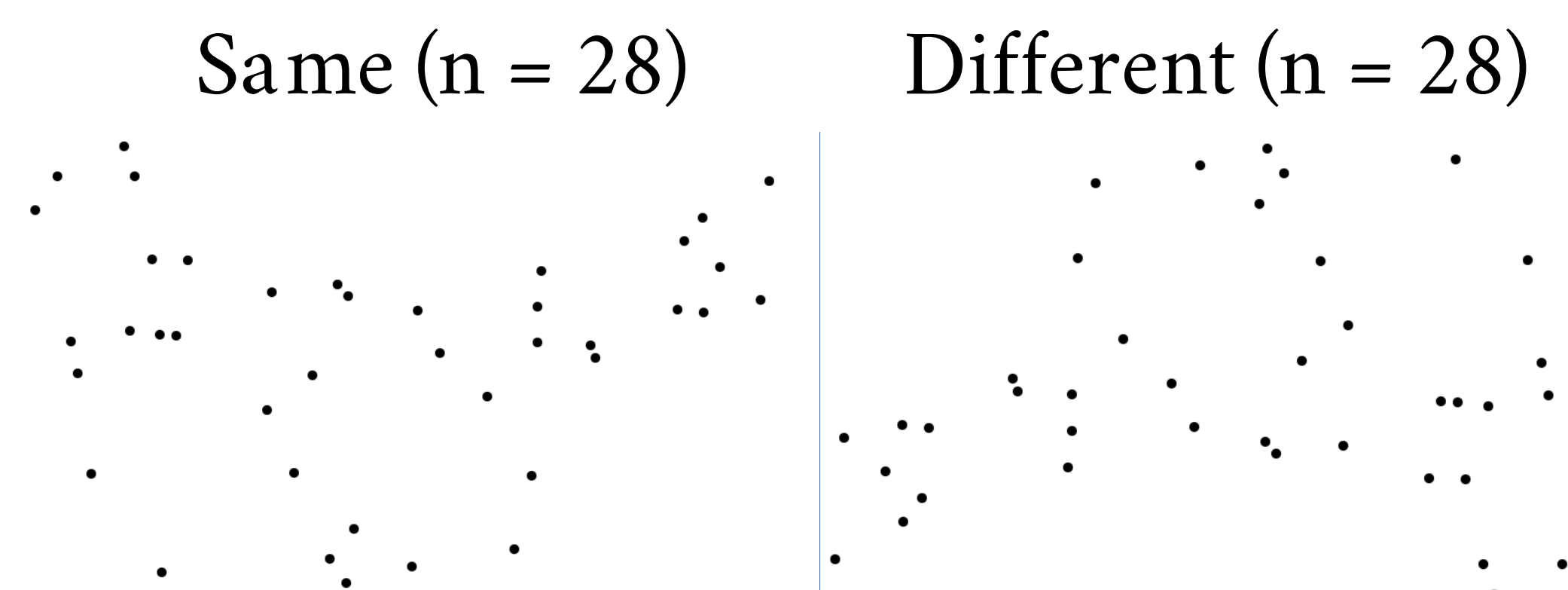
**Measures:** Number of clusters, cluster point membership, **calculated Fowlkes-Mallows index**, time to complete clustering.

## MATERIALS

### Dot clouds (n = 112)



The stimuli were shown again, with either the same or flipped orientation.



**Fowlkes-Mallows Index**  
Measure of reliability

$$FM = \sqrt{\frac{TP}{TP + FP} \cdot \frac{TP}{TP + FN}}$$

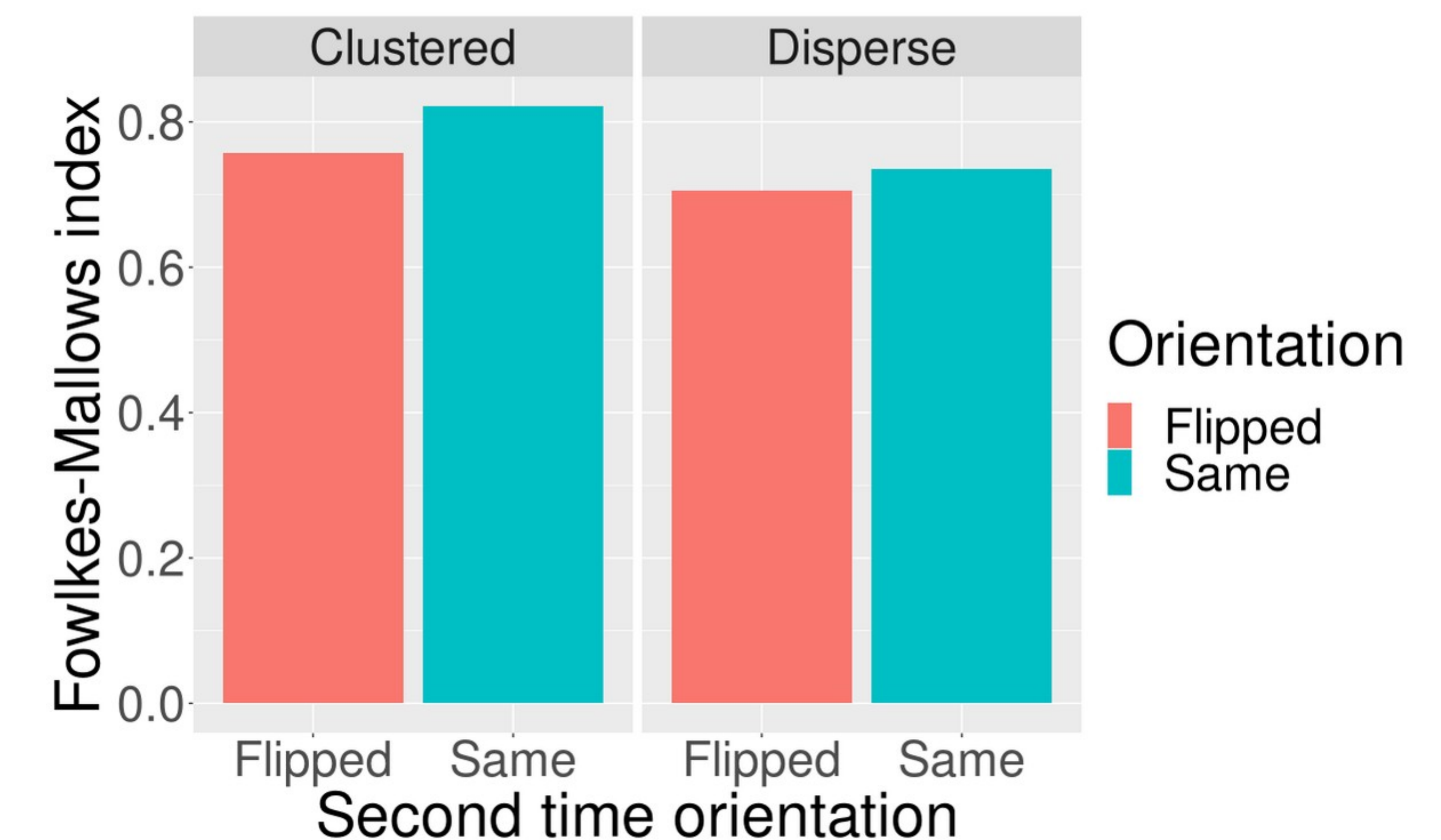
**Analysis:** Linear Mixed Effects Model

**Fixed Effects:**

- Structure (Clustered/Disperse)
- Orientation (Same/Flipped)
- Number of points (10 – 40)
- Structure x Orientation

**Random Effects:** Participant, Stimulus

## RESULTS



- High clustering reliability ( $M = 0.76$ )
- Main effect of orientation ( $p = 0.046$ ), with higher reliability for same ( $M = 0.79$ ) vs. different orientation ( $M = 0.72$ ) on second viewing.
- No effect of structure ( $p = 0.21$ ), with comparable reliabilities for clustered vs. dispersed stimuli.
- No effect of structure x orientation interaction ( $p = 0.36$ )

## DISCUSSION

- High reliability suggests that clustering is a stable ability, and thus potentially a solid foundation for human TSP strategies.
- No duration differences for number of points suggests that clustering strategies might enable linear time complexity.