



# Processes influencing visual search efficiency in conjunctive search

A rational analysis approach

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# Overview

- ◆ Problem
- ◆ Salience computation
- ◆ Methods
- ◆ Participant results
- ◆ ACT-R model
- ◆ Model results
- ◆ Comparison
- ◆ Discussion
- ◆ Closing remarks



# Problem

- ◆ When deploying the eyes, how does the human visual system decide where to look next?
- ◆ Since its inception, the ACT-R visual system hasn't really addressed these issues
  - Currently doesn't handle bottom-up salience nor err on conjunctive searches
- ◆ Here is a first attempt to address such concerns



# Saliency Computation

Saliency of feature  $i$  in the visual icon

$$L_i = \sum_{k=1}^{\#attr(i)} \log_2 \frac{1}{p_i(v_k)} \gamma_k + \log_2 \frac{1}{p_i(v_s)} + \sum w_j S_{ji} + \varepsilon$$

Diagram illustrating the Saliency Computation formula with annotations:

- $L_i$ : Saliency of feature  $i$  in the visual icon
- $\sum_{k=1}^{\#attr(i)} \log_2 \frac{1}{p_i(v_k)} \gamma_k$ : bottom-up saliency
- $\log_2 \frac{1}{p_i(v_s)}$ : top-down spatial guidance
- $\sum w_j S_{ji}$ : top-down value guidance
- $\varepsilon$ : noise
- $\gamma_k$ : bottom-up weightings

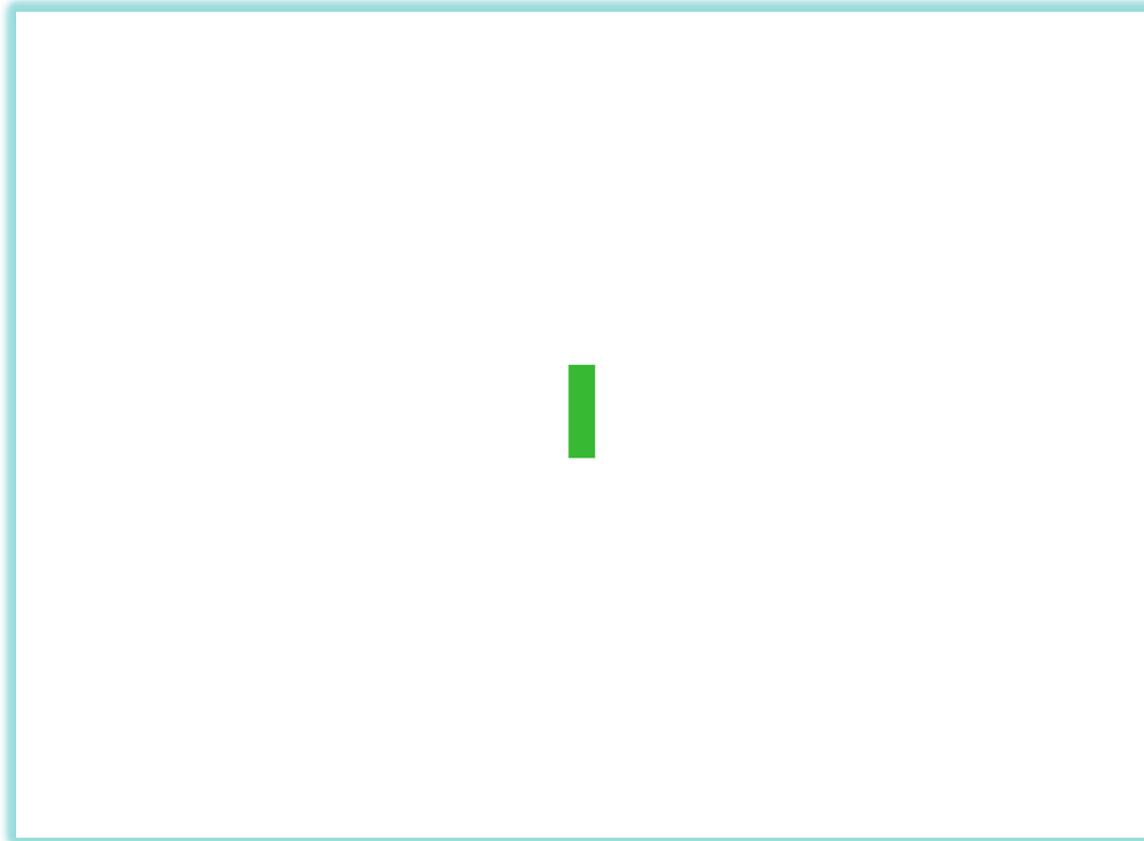


# Methods

- ◆ 16 subjects
- ◆ 4 possible rectangular targets
  - (Red, Green) color
  - (Horizontal, Vertical) orientation
- ◆ 2 target conditions
  - (Present, Absent)
- ◆ 21 manipulated cells
  - Alters relative frequency of the two types of conjunctive distractors as well as number of disjoint distractors
- ◆ 3 repetitions of each configuration
- ◆ 504 shuffled trials per run
- ◆ Number of objects
  - 36 for target absent condition; 1 additional when present (target doesn't replace an object)



# Methods

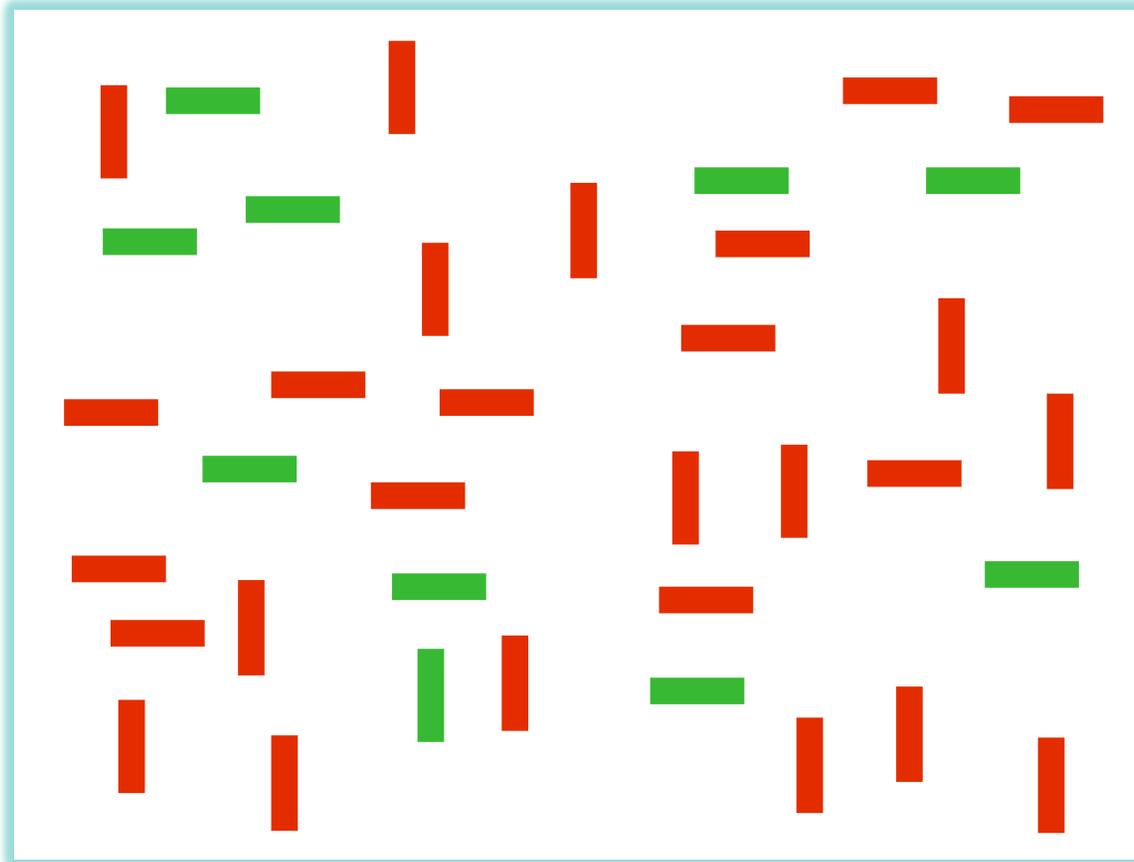


Target encoding



# Methods

Target Present (GV)  
Distract RV 15  
Distract GH 9  
Disjoint Distract RH 12

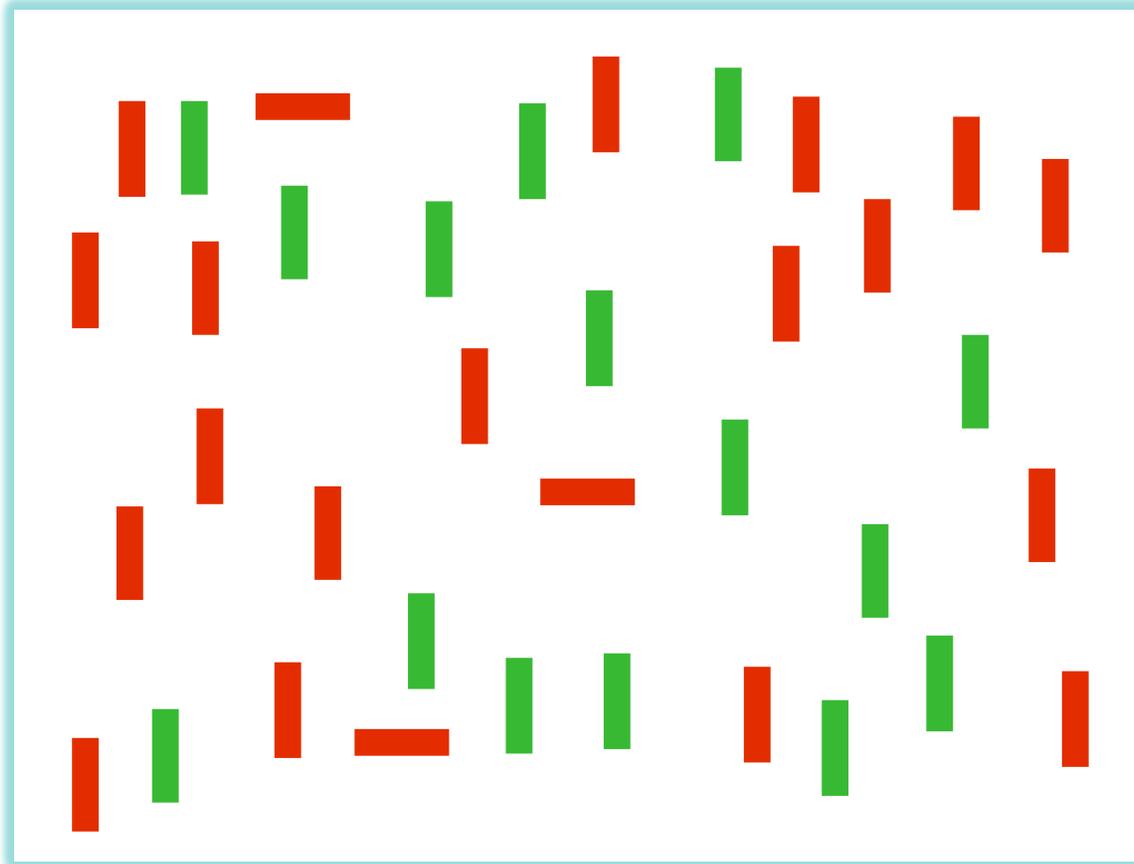


Search trial ex. a



# Methods

Target Absent (GH)  
Distract RH 3  
Distract GV 15  
Disjoint Distract RV 18

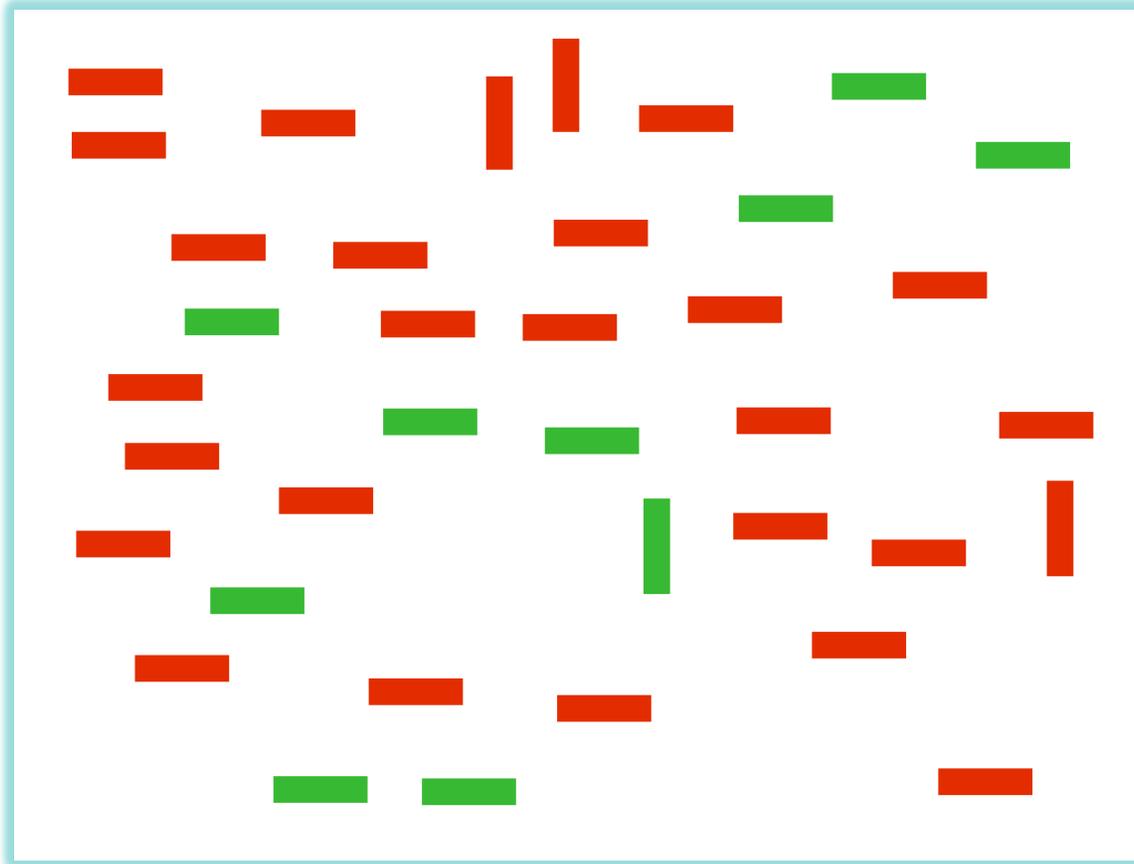


Search trial ex. b



# Methods

Target Present (GV)  
Distract RV 3  
Distract GH 9  
Disjoint Distract RH 24

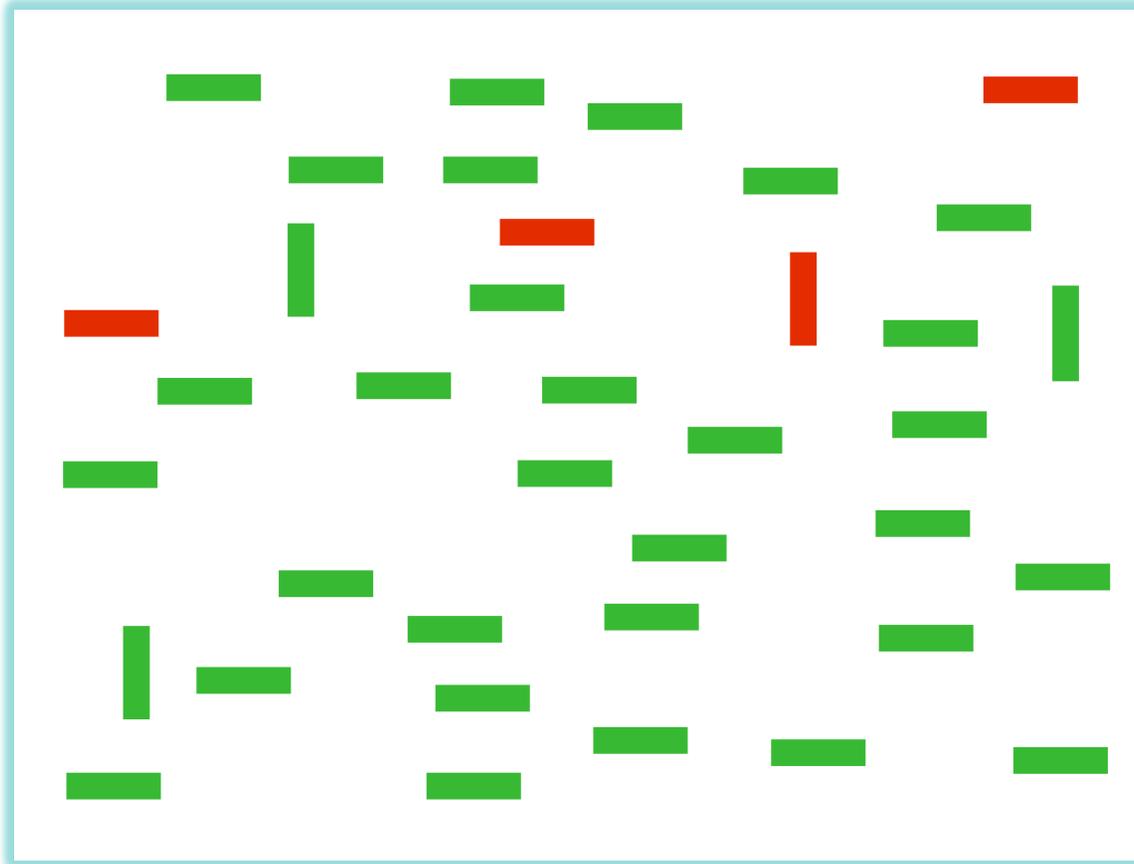


Search trial ex. c



# Methods

Target Present (RV)  
Distract GV 3  
Distract RH 3  
Disjoint Distract GH 30

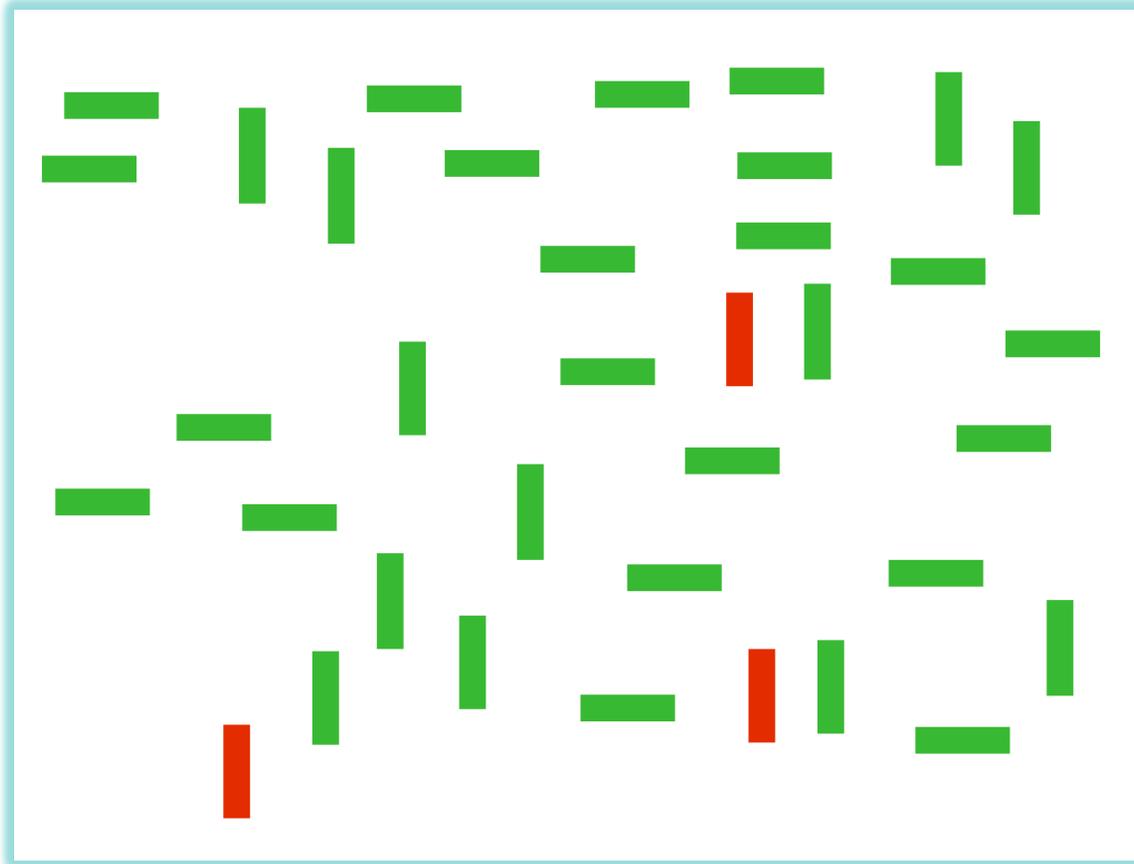


Search trial ex. d



# Methods

Target Absent (RH)  
Distract GH 21  
Distract RV 3  
Disjoint Distract GV 12



Search trial ex. e



# Methods

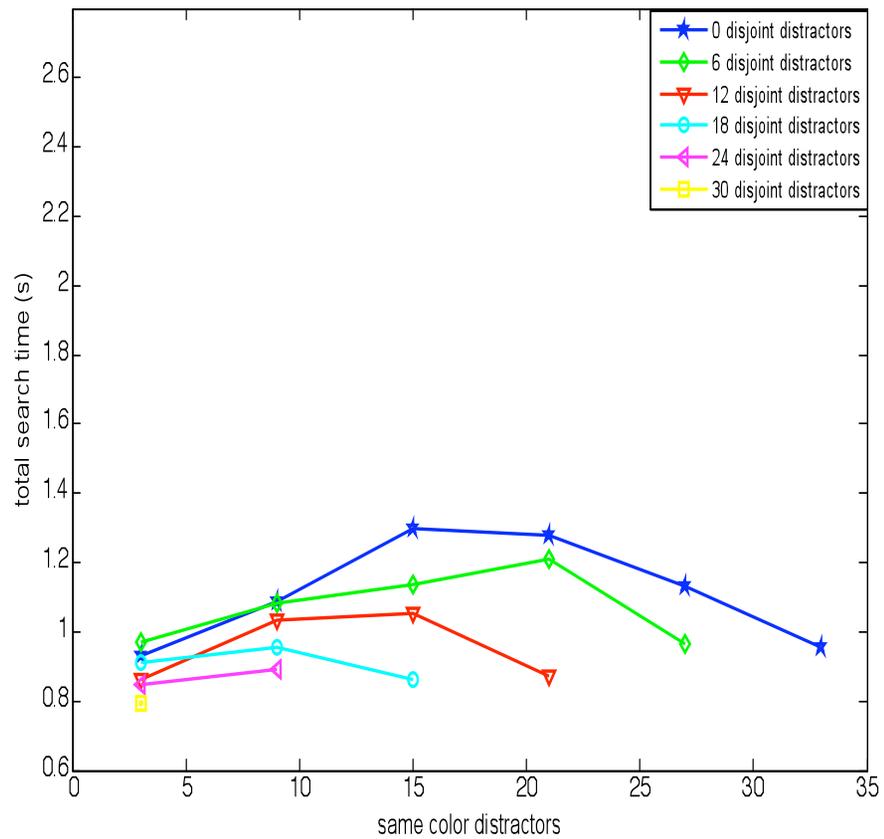
|                          |    | # same orientation distractors |    |        |        |    |    |
|--------------------------|----|--------------------------------|----|--------|--------|----|----|
|                          |    | 3                              | 9  | 15     | 21     | 27 | 33 |
| # same color distractors | 3  | 30 (d)                         | 24 | 18     | 12 (e) | 6  | 0  |
|                          | 9  | 24 (c)                         | 18 | 12 (a) | 6      | 0  | -  |
|                          | 15 | 18 (b)                         | 12 | 6      | 0      | -  | -  |
|                          | 21 | 12                             | 6  | 0      | -      | -  | -  |
|                          | 27 | 6                              | 0  | -      | -      | -  | -  |
|                          | 33 | 0                              | -  | -      | -      | -  | -  |

- ◆ Hyphens represent cells that were not tested. Numbers within a cell indicate the number of disjoint distractors placed on the screen

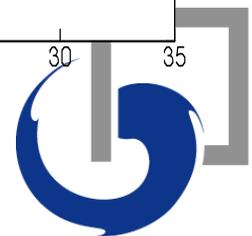
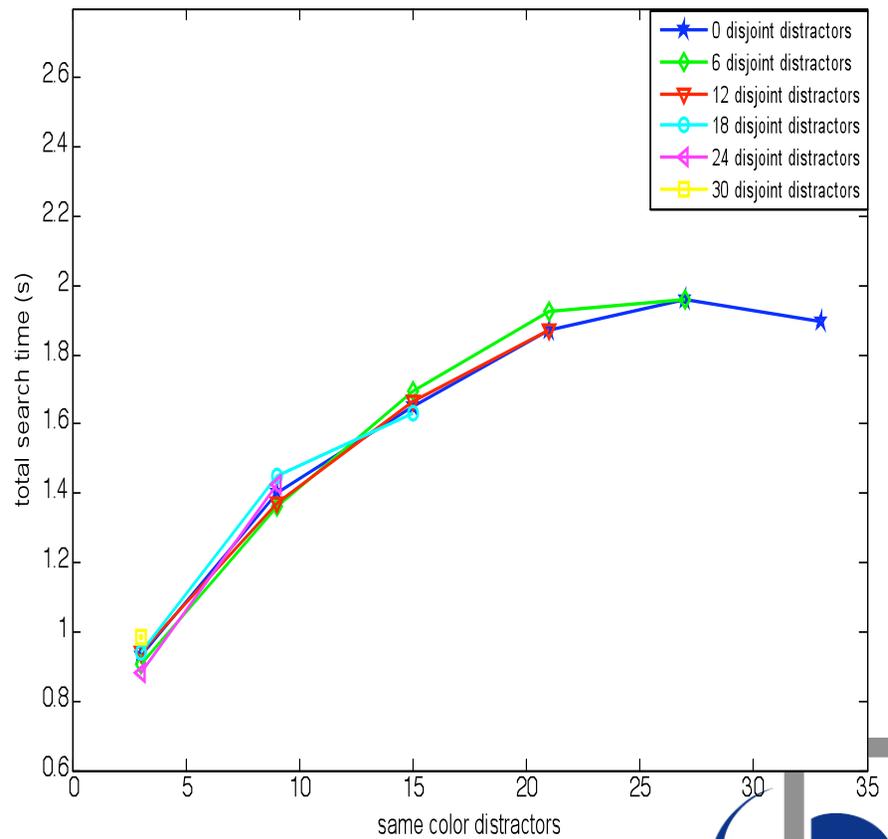


# Results

## Hit responses



## Correct rejection responses



# Discussion

- ◆ Average miss & false alarm rates were .06 & .013 respectively
- ◆ Asymmetrical curves for hit & correct rejection responses
  - Two components
    - First, the shape of the curves
      - Strong quadratic component of trend for hit responses
      - Almost asymptotic for correct rejections
    - Next, the 'squishiness' of the curves
      - Evidence for strong serial search component in hit responses
      - Evidence non-existent for correct rejections
- ◆ Interpretation
  - Difficult looking only at these data without a strong understanding of the underlying processes involved



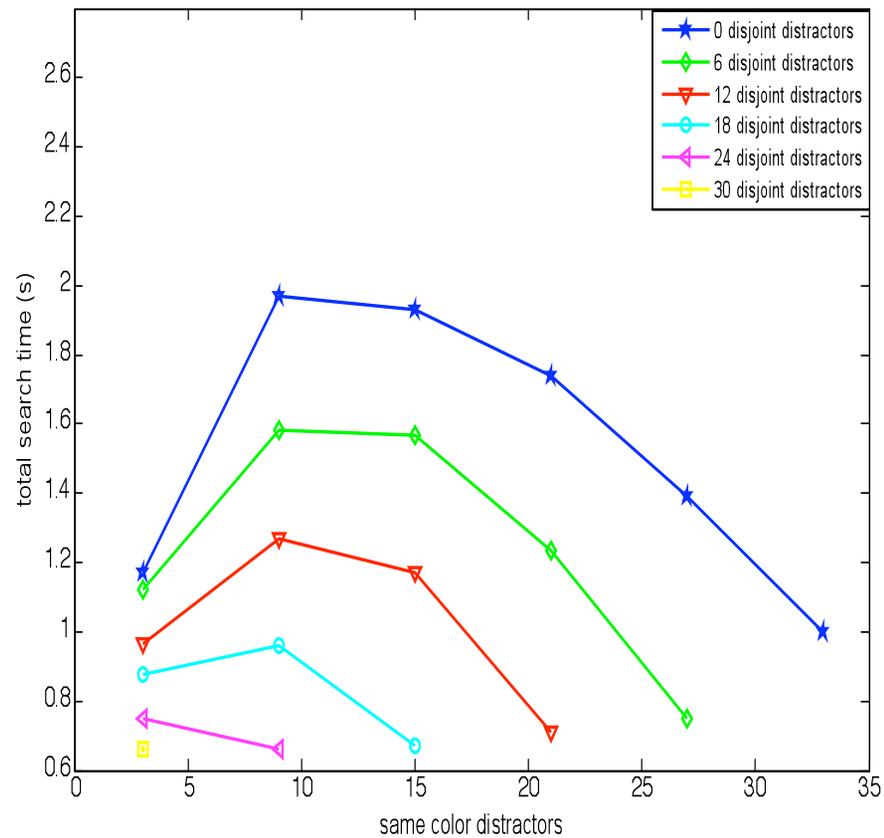
# ACT-R Model

- ◆ Target rectangle encoded and placed in goal buffer
- ◆ +visual-location> requests cause model to find object with highest activation
  - Includes a slot only for target color
  - If object activation is greater than \*saliency-thresh\*, chunk is placed in buffer; else nothing is returned
- ◆ If nothing is returned, model concludes that target is absent
  - Analogous to a memory retrieval failure
- ◆ If an object is returned and it is the target object, model concludes that target is present; else the model keeps looking
- ◆ If an object has been looked at, the object won't be looked at again

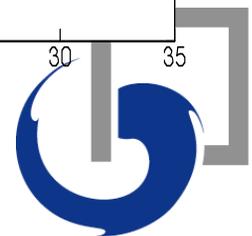
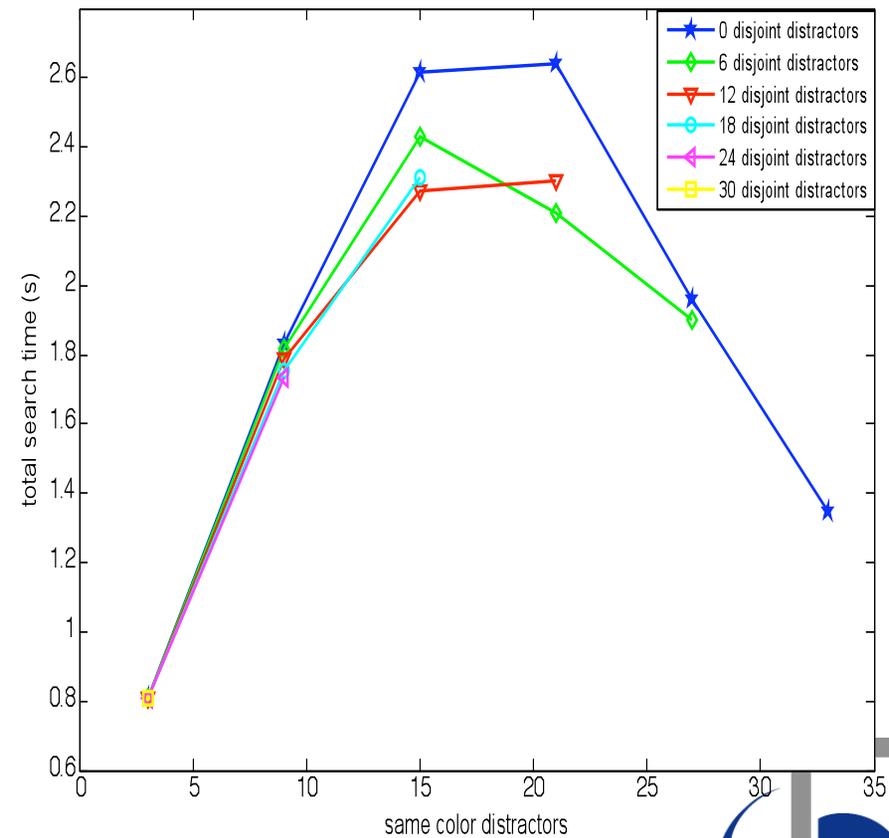


# ACT-R Model Results

## Hit responses

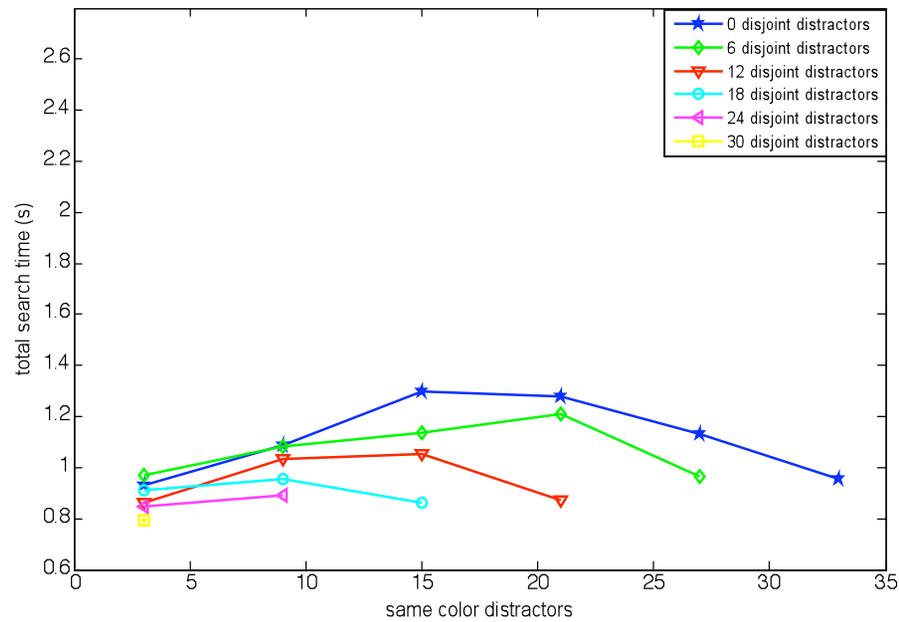


## Correct rejection responses

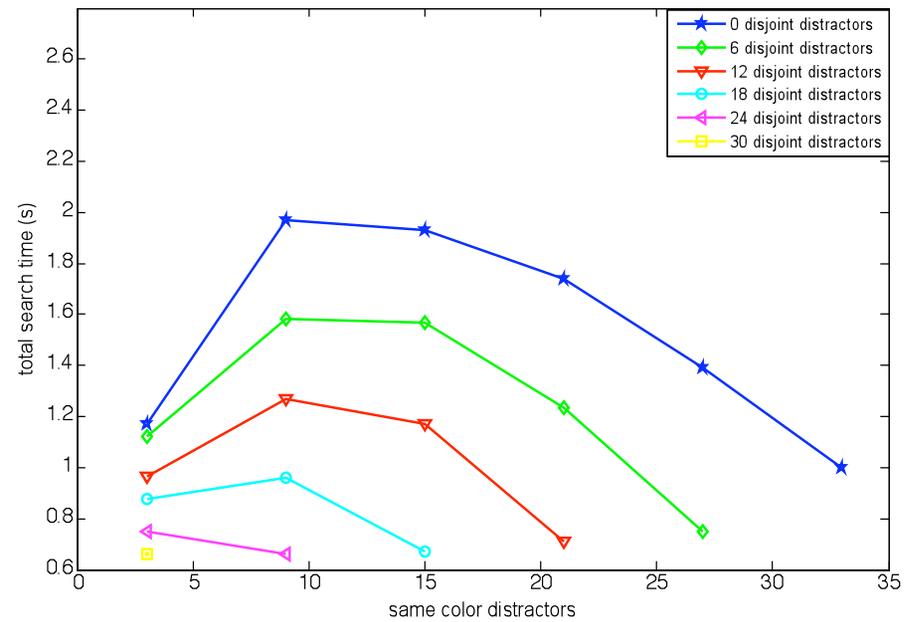


# Model Fit: Hits

## Participant data



## ACT-R data

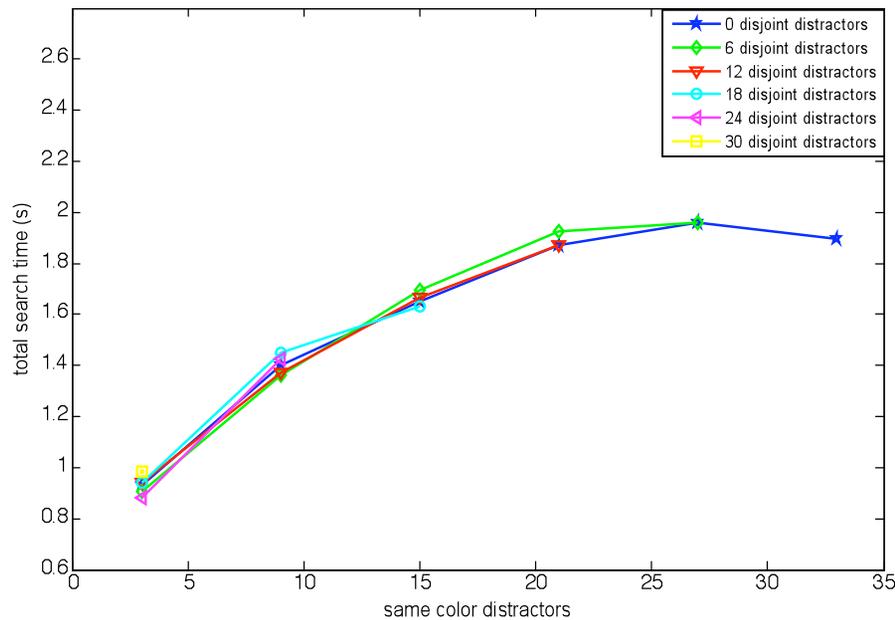


$R^2(19) = .74$   $MAD = 245ms$

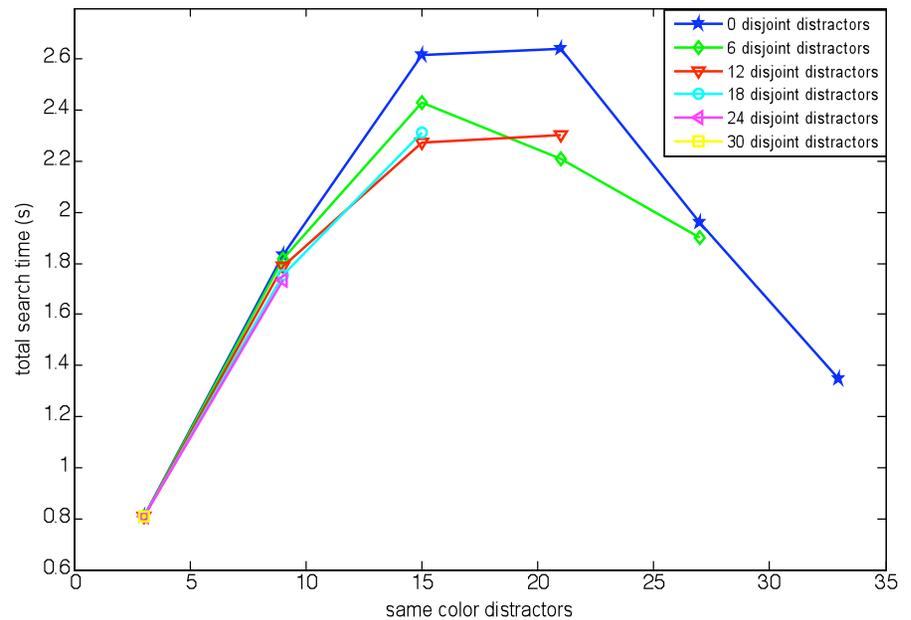


# Model Fit: Correct Rejections

## Participant data



## ACT-R data

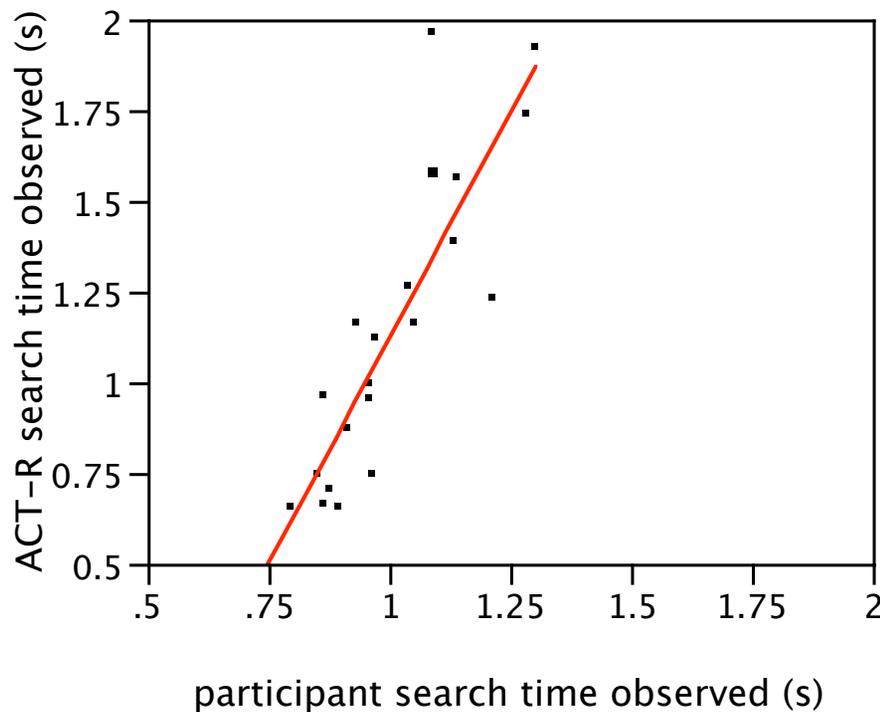


$$R^2(19) = .70 \quad MAD = 367ms$$



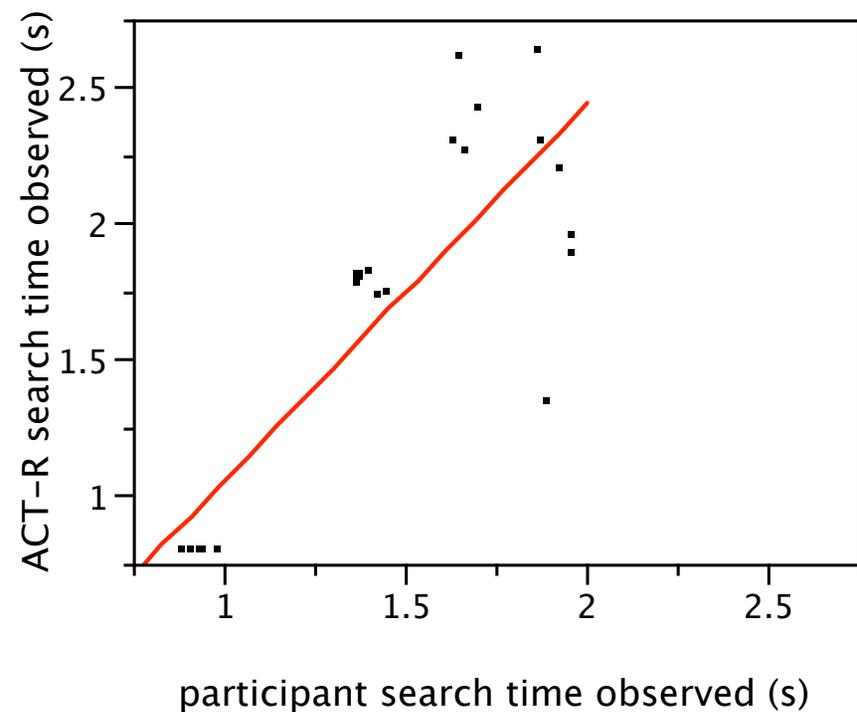
# Model Fit: $r$ Scatter

## Hit responses



$$R^2(19) = .74 \quad MAD = 245ms$$

## Correct rejection responses



$$R^2(19) = .70 \quad MAD = 367ms$$



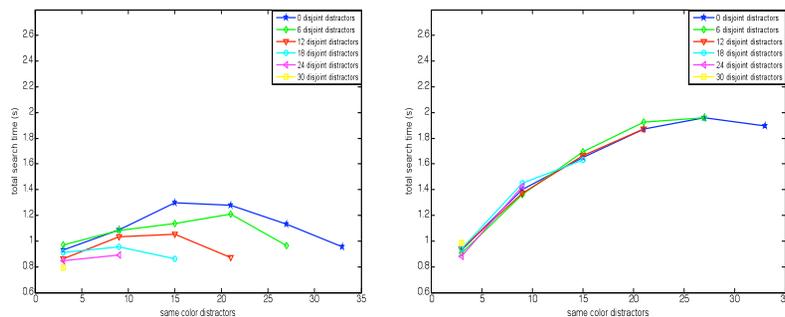
# Model Fit: Incorrect Responses

- ◆ Miss responses
  - Salience threshold calibrated to match miss rate
  - Therefore consistent miss rate for ACT-R (.07) and participant (.06) data
- ◆ False alarms
  - Small (but non-zero) for participants (.013)
  - Not modeled with ACT-R currently



# Discussion: Asymmetrical Shape

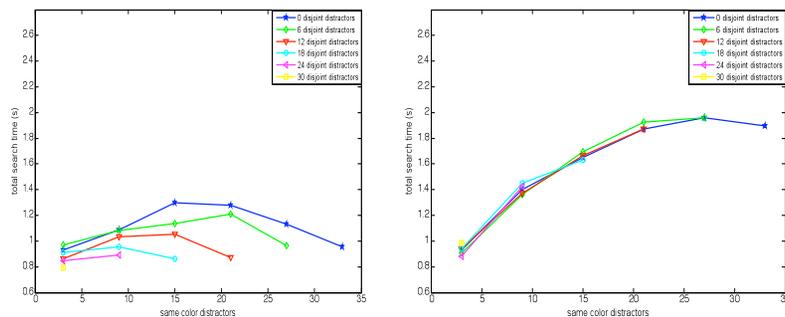
- ◆ Subjects utilizing color primarily to guide their search
  - High bottom-up activation percentage for color relative to orientation
  - Top-down guidance only for color
  - High ratio of top-down/bottom-up activation
  - However, a bit of bottom-up activation for orientation still necessary to produce the strong quadratic present in the hit responses



# Discussion: Asymmetrical 'Squishiness'

## ◆ Hit responses

- Disjoint distractors are not often attended (if ever); however, their presence acts to 'shadow' conjunctive distractors relative to the target
- Causes more accurate target pinpointing when a high number of disjoint distractors are displayed
- Works alongside serial search effects to separate level curves



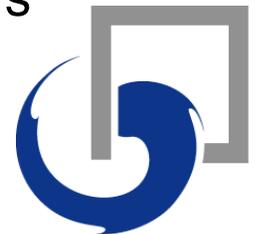
# Discussion: Asymmetrical 'Squishiness'

- ◆ Correct rejections
  - Subjects concluding 'target absent' by an analogous memory retrieval failure for the vision system
  - Disjoint distractors again not often attended; however, their presence acts to increase information content for conjunctive distractors
  - Assuming a constant threshold, may cause a higher proportion of conjunctive distractors searched before concluding 'target absent'
  - Works against serial search effects to overlap level curves
    - Overlapping may also be influenced by a strong tendency to search for color



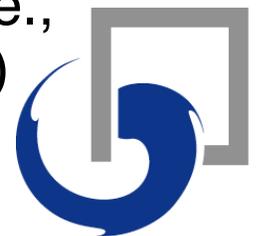
# Discussion: Future Predictions

- ◆ Modified experiment: remove disjoint distractors
- ◆ Predictions using previous hypotheses
  - Hit responses
    - Less efficient search overall
    - Level curves closer together (i.e., more overlap)
  - Correct rejections
    - Curious about the interaction between salience threshold and task
    - If threshold unaltered, search time should decrease (more prominently where larger numbers of disjoint distractors resided)



# Closing Remarks

- ◆ Strengths of model
  - Good correlations with participant data
  - Produces asymmetrical results for hit/cr conditions present in data
  - Interpretation of parameters are enlightening and seem plausible for the task
- ◆ Weaknesses
  - Search times still a bit long even after decreasing 'visual-attention-latency' to 25ms
  - Areas where longer search times exist in ACT-R model are not exchanged with more accurate responses (i.e., miss rate higher than participant data in these areas)



# Closing Remarks

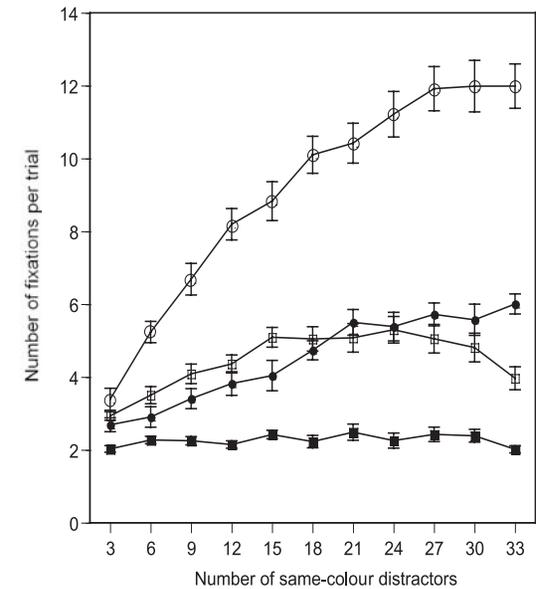
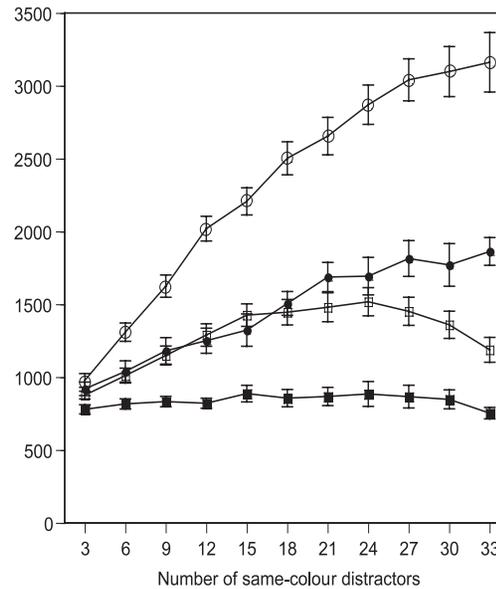
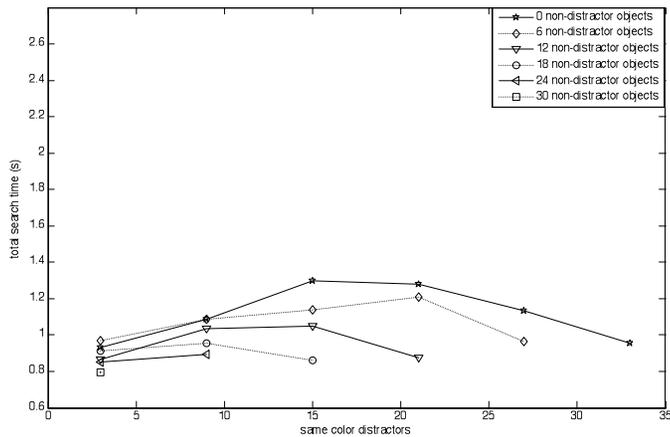
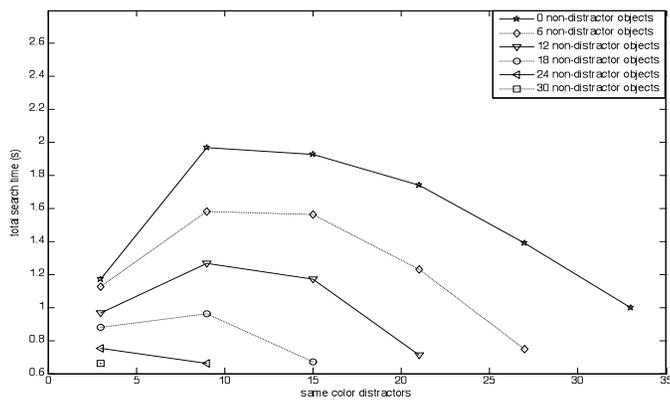
- ◆ Model predictions
  - Although disjoint distractors are not highly salient, their presence may actually improve search efficiency for the task by causing more accurate target pinpointing when the target is present
  - When the target is absent, disjoint distractors increase the information content of conjunctive distractors, affecting the average time elapsed before terminating the search
  - Next experiment aimed to challenge these predictions
- ◆ Code for the salience computations which works with the new vision module is available @
  - <http://chil.rice.edu/projects/salience/>



# Questions



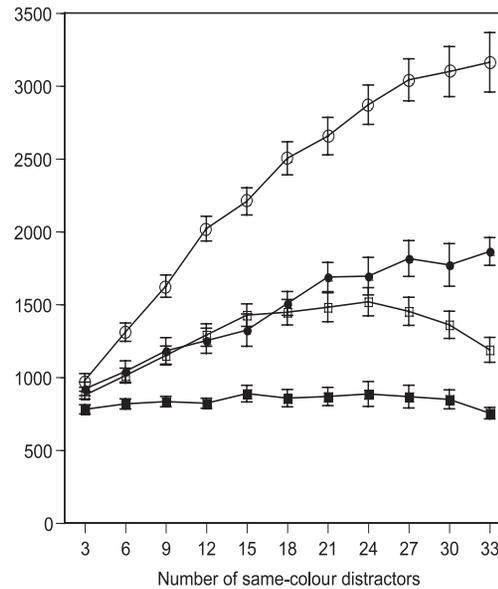
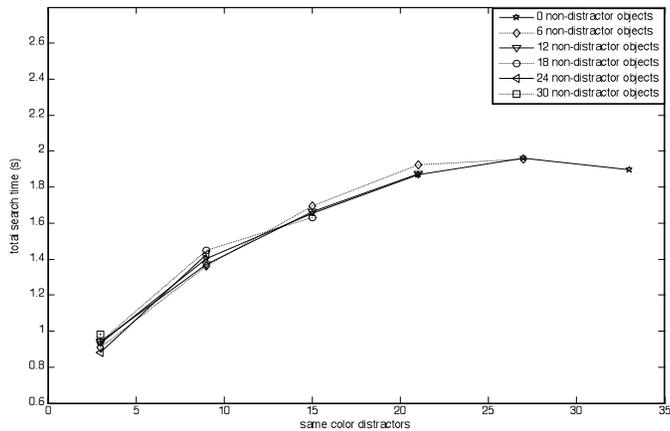
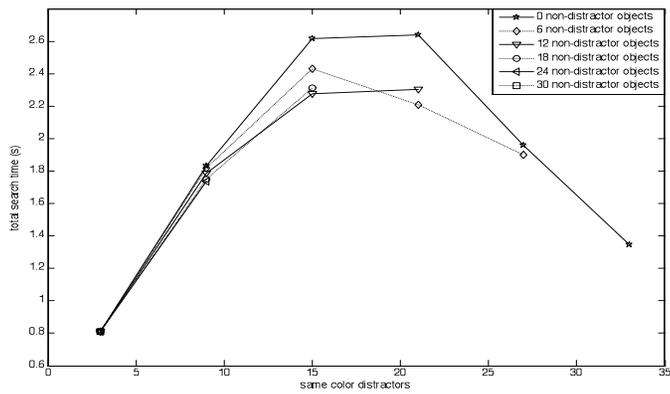
# Interpreting Results: Hit Responses



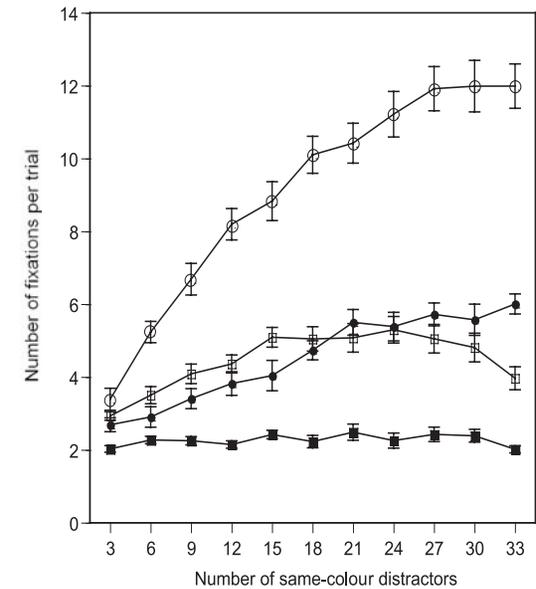
A  
 ○ Absent, Low Discriminability    ● Present, Low Discriminability  
 □ Absent, High Discriminability    ■ Present, High Discriminability    B



# Interpreting Results: CR Responses



A



B

