

Modelling immediate serial spatial recall in a macaque (*Macaca mulatta*): A competitive queuing approach

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Comparative Cognition of Serial Order

Modelling serial recall

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Serial Order

Humans vs.
Primates
An Empirical Gap

Botvinick et al.
(2009)

Task
Benchmark Effects of
Human ISR

CQ Model

Architecture
Serializing
Mechanisms

Results

Accuracy &
Repetitions
Transpositions
Item Confusions
Protrusion & Fill-in

Conclusions

- In the field of comparative cognition, there has been much interest in the serial ordering capabilities of human and nonhuman primates
- In humans, the ability to store and retrieve novel sequences of items and events is critical for many acts of cognition
 - vocabulary acquisition (Baddeley et al., 1998)
 - learning and production of action sequences (Agam et al., 2005)
- Given its centrality to human higher-level cognition, an obvious question is how the sequence processing abilities of nonhuman primates compares

Sequence Processing In Primates

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- Studies of several primate species—chimpanzees, capuchin, and rhesus monkeys—have revealed that they are capable of remembering and recalling fixed sequences of:
 - motor actions (Custance et al., 1999; Whitten, 1998)
 - visual images (Schwartz et al., 1991; 2000)
 - spatial locations (Hikosaka et al., 1999)
- Like humans, they appear to represent sequences by learning each item's ordinal position (Chen et al., 1997; D'Amato Colombo, 1988, 1989; Orlov et al., 2000)
- Non-primate species (viz. Pigeons, Rats) show no such capacity to develop ordered representations of sequences

An Empirical Gap

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- Despite these similarities between humans and primates, an important gap exists
- In humans, memory for serial order is examined using the *Immediate Serial Recall (ISR) task*
 - requires one shot learning
 - recall of the entire sequence
- Primate studies use paradigms in which subjects are exposed to repeated presentations of the same sequence and only a sub-set of the sequence must be reproduced
- *A recent study by Botvinick et al. (2009) has filled the gap*

Botvinick et al. (2009)

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- Examined the ISR capabilities of a 6-year old rhesus monkey *Macaca mulatta* named Jelly
- Employed a spatial ISR task similar in design to spatial ISR tasks used with Humans
- The task involved a fixed set of eight locations organised in a grid
- Lists containing 3- or 4-items were constructed using random sub-sets of the locations

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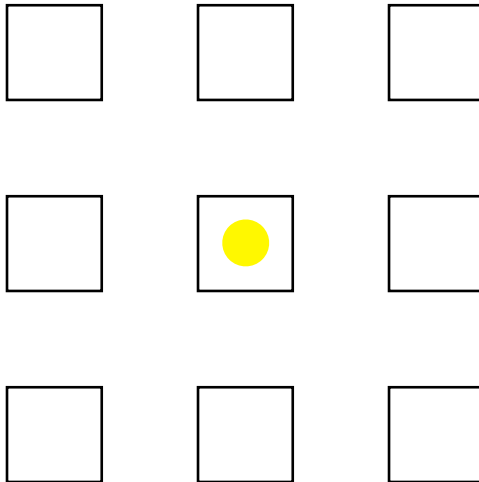
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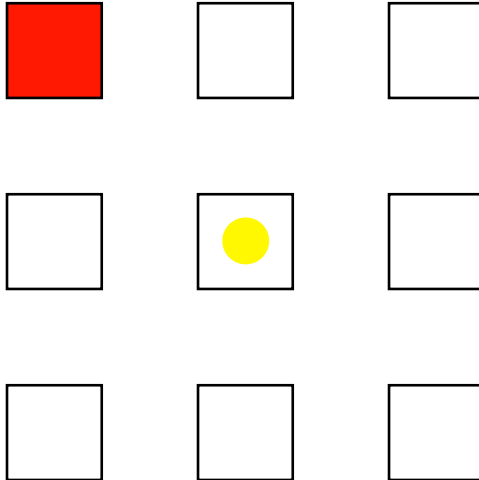
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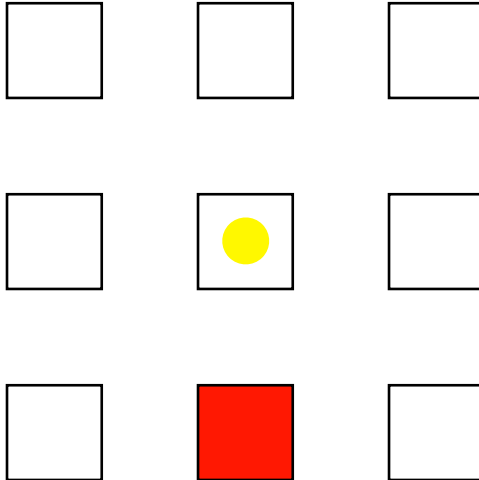
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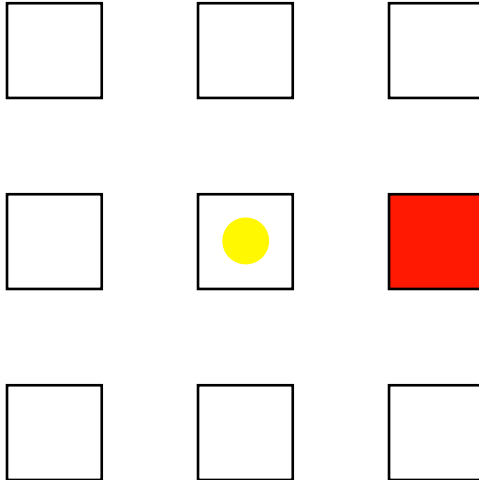
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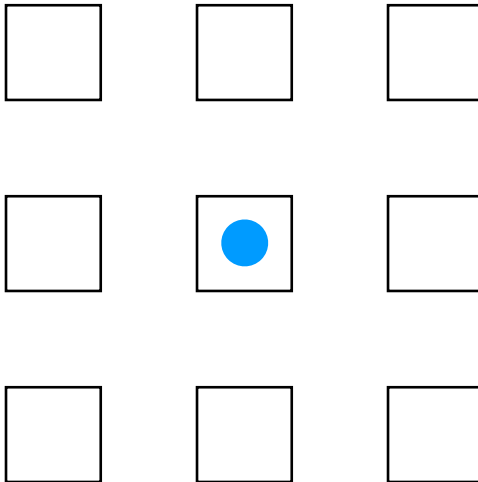
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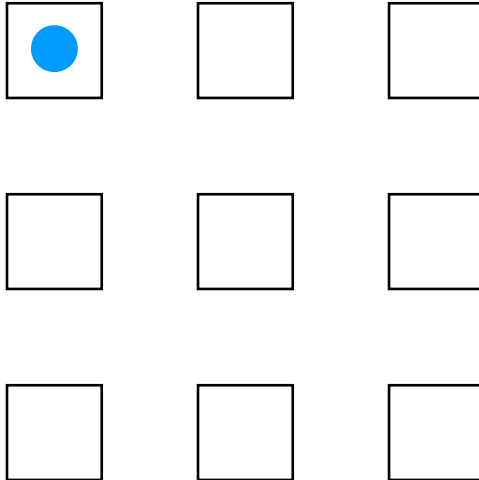
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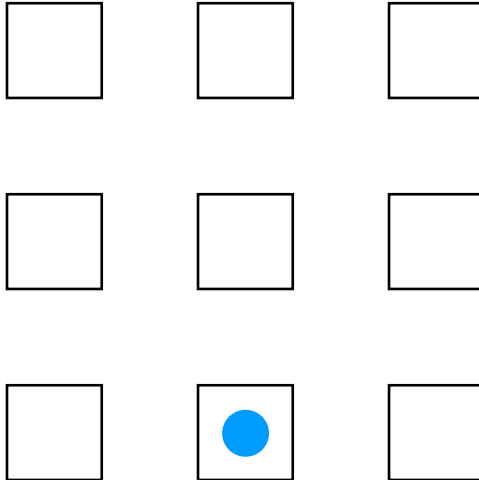
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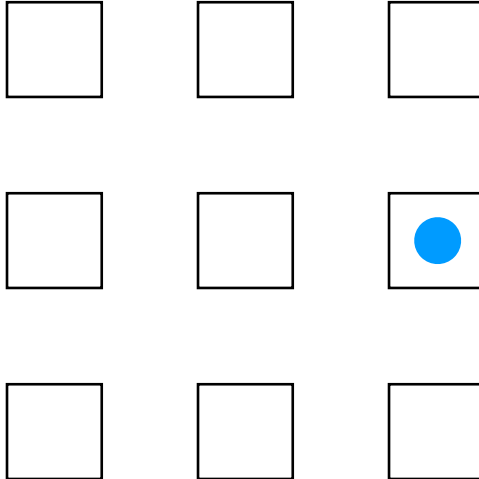
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Seven Benchmark Effects of Human ISR Shown By Jelly

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- List Length Effect
- Primacy Effect
- Repetition Effect
- Transposition Gradients
- Item Confusion Errors
- Fill-in
- Protrusions

Goal:

- Reproduce Jelly's data using a model based on serializing mechanisms and principles from human ISR

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A Competitive Queuing Approach

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- The architecture of the model is based on Competitive Queuing (CQ) models of serial behaviour (e.g., Grossberg, 1978; Houghton, 1990)
- Such models possess three core features:
 - fundamentally localist (refractory) representations of items
 - parallel response activation and activation gradient
 - a competitive output mechanism
- Electrophysiological recording data obtained with rhesus monkeys provide strikingly direct support for this sequence control mechanism (e.g., Averbeck et al., 2002; Averbeck et al., 2003a, 2003b)

Competitive Queuing Model

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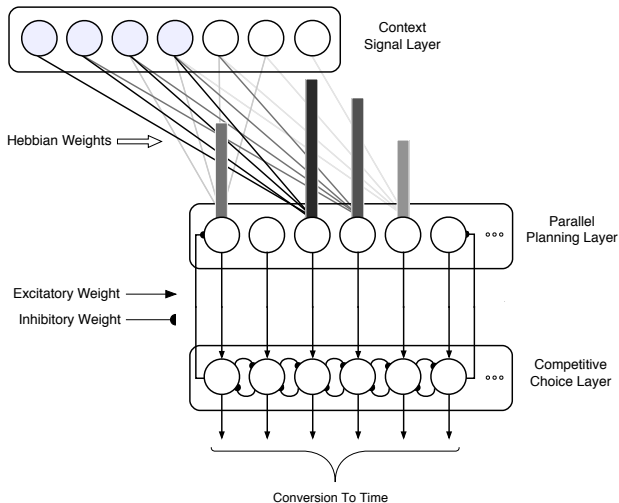
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Seriating Mechanisms

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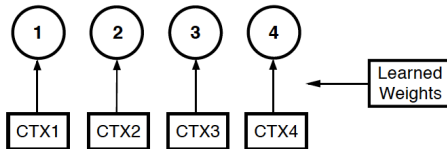
Transpositions

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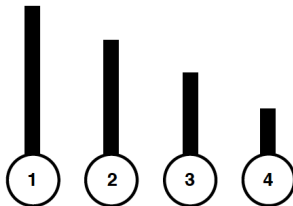
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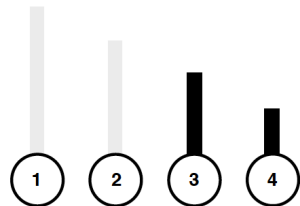
A. Item Marking



B. Primacy Gradient



C. Response Suppression



Simulation Results

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List Length, Accuracy, and Repetition Errors

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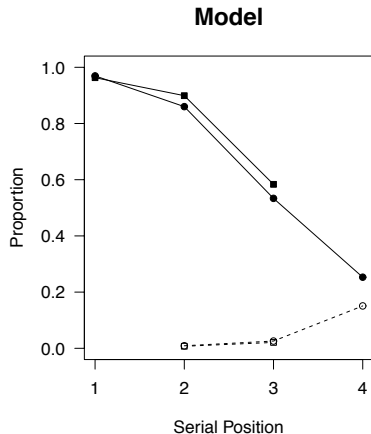
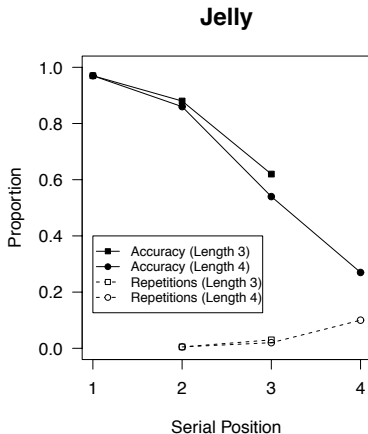
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Transposition Error Gradient

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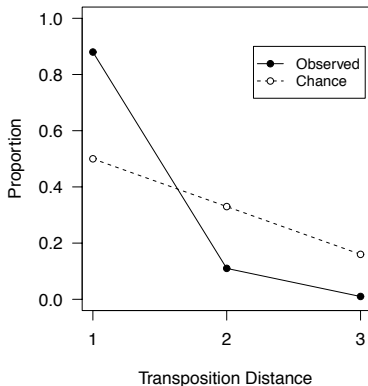
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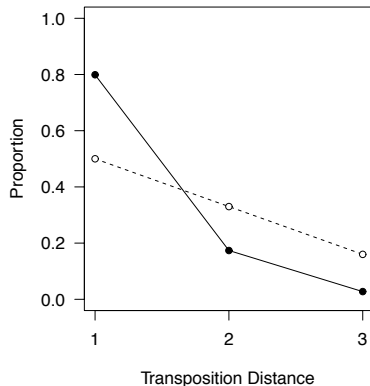
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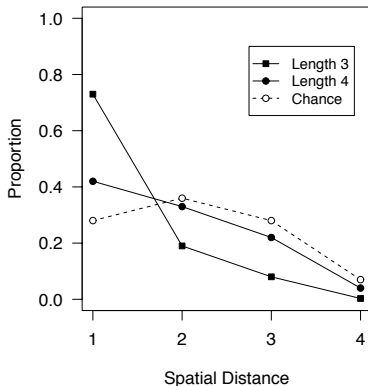
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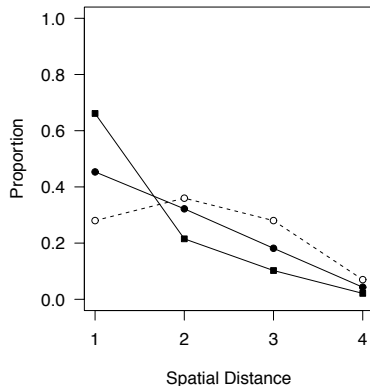
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Item Confusion Errors By Ordinal Position

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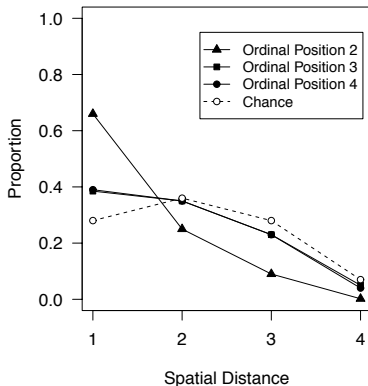
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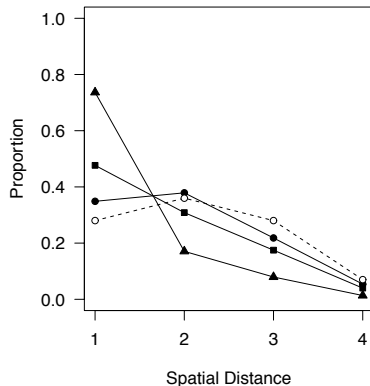
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Protrusion Errors

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- In human ISR, when an item intrudes from the immediately preceding trial it will tend to maintain the same ordinal position that it held on that trial (Conrad, 1960; Henson, 1996)
- Such position-preserving intrusions are known as protrusions (Henson, 1996)
- Like humans, Jelly produced protrusions—**33%** of his intrusions preserved their position from the previous trial
- The percentage of intrusions that were protrusions in the CQ model was **31%**

Fill-in Errors

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- In human ISR, when people recall an item a position too soon, they tend to follow-up by recalling the item that was displaced by the error (Henson, 1996; Page Norris, 1998; Surprenant et al., 2005)
- e.g., if recall of the list ABCDE begins with the production of B, the next response is most likely to be A (a fill-in error) rather than C (an infill error)
- Like humans, Jelly produced more fill-in than infill errors—the ratio of fill-in to infill was **4:1**
- The corresponding ratio in the CQ model was **2:1**

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- Results suggest that core mechanisms and principles of human ISR may be appropriate for understanding sequence processing in some nonhuman primate species
- One limitation is that the data used to infer the structure of the model are based on observations of a single animal
- It will be important to apply the model to other animals of the same species, as well as animals from different species
- Fagot and De Lillo (2012) have recently directly compared the spatial ISR performance of two baboons (*Papio papio*) with humans, and these data are a priority for future modelling efforts