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## Relative numerical middle in rhesus monkeys

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#### Abstract

Animals show vast numerical competence in tasks that require both ordinal and cardinal numerical representations, but few studies have addressed whether animals can identify the numerical middle in a sequence. Two rhesus monkeys (Macaca mulatta) learned to select the middle dot in a horizontal sequence of three dots on a touchscreen. When subsequently presented with longer sequences composed of 5, 7 or 9 items, monkeys transferred the middle rule. Accuracy decreased as the length of the sequence increased. In a second test, we presented monkeys with asymmetrical sequences composed by nine items, where the numerical and spatial middle were distinct and both monkeys selected the numerical middle over the spatial middle. Our results demonstrate that rhesus macaques can extract an abstract numerical rule to bisect a discrete set of items.


Key words: Number bisection, middle, rhesus monkeys, comparative cognition, center, abstract concepts.

## 1. Introduction

Animals have an intuitive number sense which support the capacity to distinguish which of two sets of objects is numerically greater [1,2], to perform simple summations and subtractions [36], to identify a specific ordinal position in a sequence [7-9], and to compare proportions [10,11]. While humans and animals share the Approximate Number System, ANS, a fundamental difference between humans and animals is that only humans are capable of precise calculations afforded by the acquisition of a counting system and symbol for number. The ANS has two behavioral signatures: the magnitude and distance effects $[12,13]$. The magnitude effect refers to the fact that when distance is held constant it is easier to process smaller than larger values, it is easier to discriminate $2 v s .3$ than $88 v s .89$ dots. The distance effect refers to the observation that as the disparity (distance) increases between two numerical sets, accuracy increases ( $2 v s .8$ is easier than $2 v s .3$ ). Despite the abundance of scientific evidence documenting the existence and attributes of the ANS there are few studies that address whether animals have a "middle" concept [14]. Here we ask whether rhesus monkeys can abstract a numerical rule to identify the central item in a series of discrete items.

Empirical investigation of the "middleness" concept dates back to 1934, when Yerkes trained chimpanzees to identify the middle container in a sequence of three containers for food reward. When the chimpanzees were then presented with longer sequences, comprising five, seven or nine containers, they were unable to select the middle item [15]. The failure in generalize to longer sequences could be due to the task design which made it difficult to open each container. Subsequent tests with containers that were easier to open showed that chimpanzees could successfully identify the middle item in a 5 -item sequence [16]. A single female chimpanzee even learned to pinpoint the middle item in sequences containing up to 17 items [17,18]. This single chimpanzee also succeeded when the spacing between the items were unequal across the sequence [18]. Whether the chimpanzee used a middle strategy or instead learned to identify a specific ordinal position was unclear [19]. To differentiate these ideas it is necessary to test transfer to sequences of different lengths.

In a recent study, rhesus monkeys learned to select the middle item in horizontal sequences of three items [14]. They transferred the middle rule to longer sequences which were new in color and shape. Crucially, monkeys were also able to select the middle item when presented with sequences of seven items, suggesting that they did not rely on an absolute numerical strategy, which would have resulted in selecting the second item on either side. The monkey could however have used a spatial or numerical strategy to bisect the sequences.

Here, we investigated whether rhesus monkeys can flexibly use the abstract numerical concept of middle to navigate novel and expanded sequences, in a high-controlled computerized setting. The main goal of this study was to disentangle if monkeys relied on numerical or spatial information when identifying the middle item.

## 2. Methods

Subjects: The subjects were two socially housed male rhesus macaques (Macaca mulatta), named Arrow (5-year-old) and Tolman (6-year-old). Monkeys were separated for in cage testing.

Apparatus: This consisted of a 15 -inch touch-sensitive computer monitor (Elo TouchSystems, Menlo Park, CA) connected with a food pellet reward delivery system (Med Associates, St. Albans, VT). The monitor was fixed to the front of the macaque's home cage and the pellet reward was connected with a food container behind the monitor. A program written in PsychoPy3 $3^{40}$ presented the stimuli, controlled the reward delivery and collected data.

We first trained monkeys to select the middle dot in an array of three identical dots. To prevent monkeys from learning to touch a specific location on the screen, we presented the threedot array on 32 different absolute positions on the screen, balanced for left/right, up/down and we used two inter-dot distances $(0.75 \mathrm{~cm}$ and 2 cm$)$. On each training trial, monkeys earned a positive reward by touching the middle dot (Figure 1a). We then tested the monkeys with two transfer experiments; Figure 1b schematically represents the experimental procedure. In the Number Transfer Test we explored whether monkeys' performances showed a magnitude effect, which is a
characteristic signature of the ANS. Specifically we tested monkeys with sequences of $3,5,7$ or 9 identical dots (Figure 1c). If middle identification relies on numerical cues, responses would become less accurate as the number of dots increases. In the Asymmetrical Test we attempted to disentangle whether monkeys used a numerical or spatial strategy by presenting spatially asymmetric sequences where the spatial middle and numerical middle were not the same item. Monkeys were presented with 9-item sequences in non-differentially rewarded trials (Figure 1d).

## Figure ${ }^{88} 1$


a. Training


Number Transfer Test: close 3-dots (A1), far 3-dots (A2), close 5-dots (B1), far 5-dots (B2), close 7 -dots (C1), far 7-dots (C2), close 9-dots (D1), and the far 9-dots (D2). d. Stimuli used in asymmetrical test: asymmetrical left condition (E) and asymmetrical right condition (F). (https://www.nature.com/articles/s41598-020-74533-8).

## 3. Results

We conducted Bayes factor analyses using the version 0.9.12-4.2 of the Bayes Factor package in R and using the default parameter values for JASP 0.11.1. We used the classification by Lee and Wagenmakers (2013) to interpret Bayes factor (BF). We conducted frequentist analyses using the stats package in R and JASP 0.11.1.

Number Transfer Test. Performance did not differ on close and far trials (all p>. 05 and BF values rangin from 0.216 to 1.731 , see supplementary materials), leading us to merge trial types for subsequent analyses. Bayes factor analyses revealed that both monkeys transferred the middle concept from the 3 -item sequence to the novel numerical sequences with above chance expectations, see Table 1, Figures 2a, 2b, 2c and 2d.

| Monkey | Number of <br> dots | Number of <br> success | Number of <br> trials | $\mathbf{p}$ | Cohen's h | BF |
| :--- | :--- | :---: | :---: | :---: | :---: | :---: |
| Arrow | Three | 40 | 58 | $<.001$ | .729 | $>100$ |
|  | Five | 37 | 60 | $<.001$ | .879 | $>100$ |
|  | Seven | 25 | 60 | $<.001$ | .628 | $>100$ |
|  | Nine | 24 | 60 | $<.001$ | .690 | $>100$ |
|  | Three | 35 | 60 | $<.001$ | .508 | $>100$ |
|  | Five | 29 | 59 | $<.001$ | .627 | $>100$ |
|  | Seven | 20 | 59 | $<.001$ | .468 | $>100$ |
|  | Nine | 12 | 59 | $<.05$ | .256 | 2.839 |

Table 1. Data and results concerning the selection of the middle dot for each sequences composed of 3,5,7 or 9 dots for each monkey, in the Number Transfer Test. Both monkeys transferred the middle rule to longer sequences.

To test whether monkeys' accuracy decreased with magnitude we compared accuracy across trials of different numerical lengths. Bayes Factor analyses revealed strong evidence in favor of a magnitude effect for both monkeys. As shown in Figure 2e, accuracy diminished as the number of items increased: Arrow: $\chi^{2}(3)=11.817, \mathrm{p}=0.008, \varepsilon^{2}=0.099 ; \mathrm{BF}_{10}=10.299$; Tolman: $\chi^{2}(3)=18.013$, $\mathrm{p}<0.001, \varepsilon^{2}=0.151 ; \mathrm{BF}_{10}=192.092$; Kruskal-Wallis rank sum test and Bayesian repeated measure Anova. The Bayes factor indicates that the data are 10.299 (for Arrow) and 192.092 times (for Tolman) more likely under the model that includes numerical magnitude as a predictor, compared to the null model.


Figure 2. Results of the Number Transfer Test. Monkeys primarily selected the middle dot in all sequences (a. 3-items, b. 5-items, c. 7 -items, d. 9 -items) e. accuracy diminished as the number of items increased. f. Laterality index. Both monkeys showed a side effect in function of numerical
magnitude: Arrow showed a right bias while Tolman showed a left bias. In all figures, the central dot represents the mean, the black bars represents the standard errors, the dashed line indicates chance level.

We next investigated whether monkeys showed a laterality effect and whether any such effect interacted with magnitude. We calculated a laterality index as the percentage of right-sided choices on the overall number of wrong choices. A laterality index of 100 would indicate that all wrong choices were to the right of the middle whereas a laterality index of -100 would indicate that all wrong choices were to the left. A laterality index of 0 would indicate that incorrect choices were equally likely on the left and right. Figure $2 \mathbf{2 f}$ shows that both monkeys exhibited a laterality bias that increased with the sequence length. Arrow was more likely to make rightward errors $\left(\chi 2(3)=37.169, \mathrm{p}<0.001, \varepsilon^{2}=0.312 ; \mathrm{BF}_{10}>100\right)$, whereas Tolman was more likely to make leftward errors $\left(\chi 2(3)=13.047, \mathrm{p}=0.004, \varepsilon^{2}=0.11 ; \mathrm{BF}_{10}=8.568\right)$ as the number of dots increased.

Asymmetrical Test. Performance did not differ for leftward and rightward asymmetric arrays for either monkey as indicated by the null evidence provided by the Bayes Factor (Arrow: $\chi^{2}(8)=7.915, \mathrm{p}=0.442$, phi $=0.297 ; \quad \mathrm{BF}_{10}=0.038$; Tolman: $\chi^{2}(8)=8.451, \mathrm{p}=0.395$, phi $=0.306$; $\mathrm{BF}_{10}=0.313$; Pearson's chi squared test and Bayesian contingency tables; Figure $\mathbf{S 2}$ in the Supplementary material depicts the distribution of the responses). One-tailed exact binomial tests was used to establish if the spatial middle and numerical middle items were selected with above chance expectations on each trial type. Monkeys selected the numerical middle, but not the spatial middle, with above chance expectation. Bayes factor analysis yielded extreme and strong evidence in favor of numerical middle identification, respectively for Arrow and Tolman, and null evidence for spatial identification (Arrow, numerical middle: number of successes=20, number of trials=72, $\mathrm{p}<0.001$, Cohen's $\mathrm{h}=0.434 ; \mathrm{BF}_{10}>100$; spatial middle: number of successes $=1$, number of trials=72, $\mathrm{p}=0.999$, Cohen's $\mathrm{h}=-0.440 ; \mathrm{BF}_{10}=0.015$; Tolman, numerical middle: number of successes $=17$, number of trials $=72, \mathrm{p}<0.001$, Cohen's $\mathrm{h}=0.339 ; \mathrm{BF}_{10}=13.63$; spatial middle number of successes $=6$, number of trials $=72, \mathrm{p}=0.817$, Cohen's $\mathrm{h}=-0.090 ; \mathrm{BF}_{10}=0.036$; Exact binomial test and

Bayesian binomial test). Both monkeys showed a strong evidence for the selection of the numerical middle over the spatial middle item on each trial type (Arrow, numerical middle: Mean=27.778, $\mathrm{SE}=4.648$; spatial middle: $\mathrm{Mean}=1.388$, $\mathrm{SE}=1.388 ; \mathrm{W}=21, \mathrm{p}=0.017, \mathrm{r}=1 ; \mathrm{BF}_{10}=28.505$; Tolman, numerical middle: Mean=23.612, $\mathrm{SE}=1.388$; spatial middle: Mean=8.333, $\mathrm{SE}=3.044$; $\mathrm{W}=21$, $\mathrm{p}=0.017, \mathrm{r}=1 ; \mathrm{BF}_{10}=25.623$; Paired Wilcoxon test and Bayesian Wilcoxon signed-rank test).

## 4. Discussion

A plethora of experimental research demonstrates animal numerical competence [3-5]. Here, we investigated whether rhesus monkeys spontaneously extract a numerical "middle" concept when they are trained to identify the numerical and spatial middle of a sequence of 3 discrete items. Monkeys preferentially chose the middle item in novel sequences of 3, 5, 7, and 9 items. Monkeys further showed a magnitude effect, with accuracy that decreased as the number of items increased. Although number and space were confounded in our first transfer test to novel numerical values, we dissociated the two with an asymmetric transfer test. We presented monkeys with asymmetrical sequences where the numerical middle item was either on the left or on the right side with respect to the spatial center. Monkeys preferentially chose the numerical middle and ignored the spatial center, providing strong support that they spontaneously encoded the numerical middle concept.

In prior research using a manual line bisection task, symbolic and nonsymbolic number has been shown to bias bisection even though the numerical exposure was task irrelevant [20,21]. In those studies adults, young school children, and preschool children were instructed to indicate the midpoint of a horizontal line that was flanked by two arrays of dots of unequal values. Nonsymbolic numerical displays systematically biased localization of the midpoint, toward the display depicting the larger magnitude, at all ages. Numerical information was thus automatically extracted from visual arrays of dots, even though number was irrelevant. That phenomenon testifies to the close relationship between spatial and numerical representations [21]. In our task, even though
monkeys could have exploited spatial cues to learn the training task, they relied on numerical but not spatial cues when faced with a transfer test in which they could have used either. Our findings are consistent with a previous study with chicks in which numerical and spatial information were redundant during training and dissociated at test. In that study, day-old chicks learned to peck the $4^{\text {th }}$ container in a series of 10 identical ones. When, at test, they faced a smaller number of containers, five, and a conflict between ordinal and spatial cue, chicks selected only the numerically correct container [22]. Numerical information appears to be very salient for animals and automatically processed even in circumstances in which other cues could drive behavior.

Dehaene et al (1993) first demonstrated the SNARC (spatial numerical association of response code) effect providing strong empirical evidence that humans represent numbers on a mental number line, usually oriented from left to right [23]. Subsequent work with pre-linguistic children, infants, newborns and non-human animals suggests that spatial representation of number emerges early in human ontogeny and it is shared by different species [24-27].

We found that the numerosity of a sequence affected middle identification biasing errors. One monkey's errors became increasingly right biased and the other monkey's errors became increasingly left-biased with sequence length. This was consistent with the distribution of choices, which was characterized by significant errors to the right of middle for Arrow and to the left of middle for Tolman. This lateral bias was not evident on the Asymmertical Test, possibly because of the unbalanced displacement of the items in the series. The two monkeys may have anchored to the left and right and scanned the environment from either side. This finding suggests that the mapping of number onto space may be more flexible in monkeys than humans and show strong individual differences. This pattern of results is consistent with recent evidence in adult gorillas, orangutans and birds [28,29]. Despite variability in the individual directionality of the SNA, its presence in most subjects suggests that mapping number onto space may be a widespread cognitive strategy. Idiosyncratic experiences may influence the individual orientation of the spatial numerical association.

The present study provides strong evidence that supports our previous finding that monkeys can identify the middle in a sequences of discrete items and extends the findings in two important ways [14]. First we show that monkeys transfer a middle rule learned with a small set of discrete items to a larger sest of dicsrete items. Second we demonstrate that despite traihaving learned the middle rule with sequences for which spatial and numerical cues were confounded, monkeys abstracted numerical information only. Middle identification should thus be considered part of the suite of quantitative abilities supported by the approximate number sytem.

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## Ethics

All procedures reported in this study were approved by the Institutional Animal Care and Use Committee (IACUC) of the University of Pennsylvania, and performed in accordance with their relevant guidelines and regulations. The PROTOCOL \# 806050 have been also reviewed by the Institutional Review Board (IRB) using the expedited procedure set forth in 45 CFR 46.110 and approved on 05-Feb-2019.

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## Author contributions

R.R., E.B. and M.P. developed the study concept and designed the study, R.R. and Z.C. carried out the experiment and collected all data. R.R. and Z.C. analysed the data. R.R. drafted the manuscript, and E.B., Z.C. and M.P. provided several critical revisions. All authors approved the final version of the manuscript and agree to be held accountable for all aspects of the work and ensure that
questions related to the accuracy or integrity of any part of the work are appropriately investigated and resolved.

## Competing interests

The authors declare no competing interests.

## Data availability

Our datasets Data and codes are stored and backed up on the Research Data Unipd server: URL: http://researchdata.cab.unipd.it/527/

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