

# Reading in the brain

## 3. Symbol grounding: How the acquisition of symbols affects numerical cognition

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[www.unicog.org](http://www.unicog.org)



## Summary of the two previous talks

1. Reading acquisition leads to the specialization of a left ventral occipito-temporal region for letter strings (**Visual word form area**)
2. The VWFA provides a **quick non-conscious access** to left temporal language areas.

Today: **How is cognition affected by symbol acquisition?**

- Literacy improves **phonological awareness** and memory for meaningless **linguistic** material (Morais et al.)
- Are non-verbal **semantic** representations also altered as they become attached to a symbol? **The case of numbers**

# Two mathematicians



Srinivasa Ramanujan  
(1887-1920)

$$\frac{1}{\pi} = \frac{2\sqrt{2}}{9801} \sum_{k=0}^{\infty} \frac{(4k)!(1103 + 26390k)}{(k!)^{4 \cdot 396^{4k}}}$$

$\frac{1}{a} = \frac{A_1}{1} + \frac{A_2}{2} + \frac{A_3}{3} + \dots$  &c &c  $n = \frac{1}{1+4p}$   
 $\Rightarrow A_{n-1} = n \{ n A_1 A_{n-1} + \frac{n(n-1)}{2} A_2 A_{n-2} + A_{n-3} + \dots \}$  the last term being

$\frac{1}{a} = \frac{A_1}{1} + \frac{A_2}{2} + \frac{A_3}{3} + \dots$  according as  $n$  is odd or even  
 $A_1 = n$   
 $A_2 = n^3$   
 $A_3 = 3n^5 + n^4$   
 $A_4 = 15n^7 + 10n^6 + 2n^5$   
 $A_5 = 105n^9 + 105n^8 + 40n^7 + 6n^6$   
 $A_6 = 945n^{11} + 1260n^{10} + 700n^9 + 196n^8 + 24n^7$   
 $A_7 = 10395n^{13} + 17725n^{12} + 12600n^{11} + 5068n^{10} + 1148n^9 + 120n^8$

N.B. For  $\frac{1}{a}$  take  $(n+1)$  times the coeff't.; for  $\log \frac{1}{a}$  take  $n$  times the coeff't. and generally for  $(\frac{1}{a})^m$  take  $(n-m)$  times the coeff't.

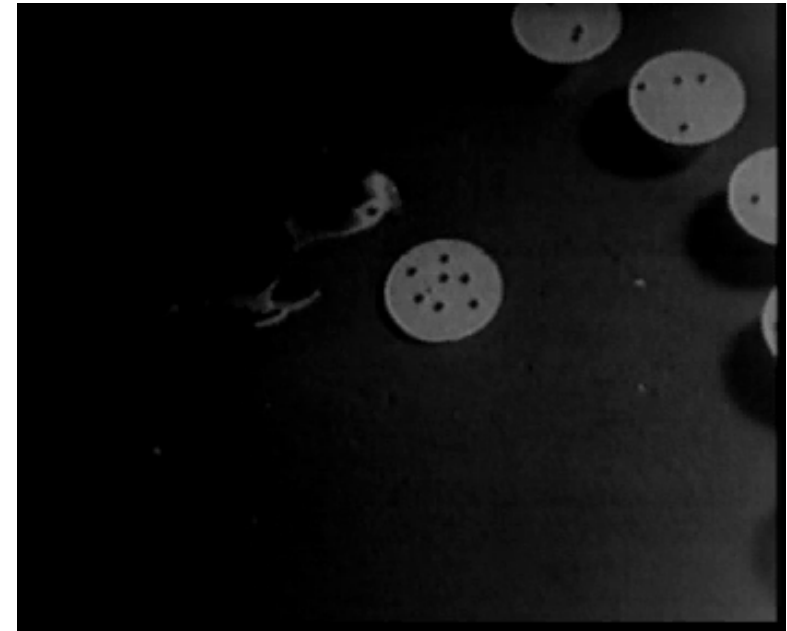
Ex. 1. Show that the sum of the coeff'ts of  $A_n = (a-1)^{n-1}$   
 sol. Put for  $a$ , then  $x^x = e^h$ .

Let  $x = \frac{1}{y}$ , then  $y^{\frac{1}{y}} = e^{-h}$  or  $\log y = -h$   
 $\therefore \frac{1}{y} = x = 1 + h - \frac{1}{2}h^2 + \frac{1}{6}h^3 - \frac{1}{24}h^4 + \dots$

$\therefore$  The sum of the coeff'ts of  $A_n = (a-1)^{n-1}$   
 2. To expand  $x$  in ascending powers of  $h$  when  $\sqrt[n]{x} = e^{\frac{h}{n}}$ .

sol. Let  $x = \frac{1}{y}$ , then  $y^{\frac{1}{n}} = e^{-\frac{h}{n}}$ .

Otto Köhler's parrott (ca. 1955)

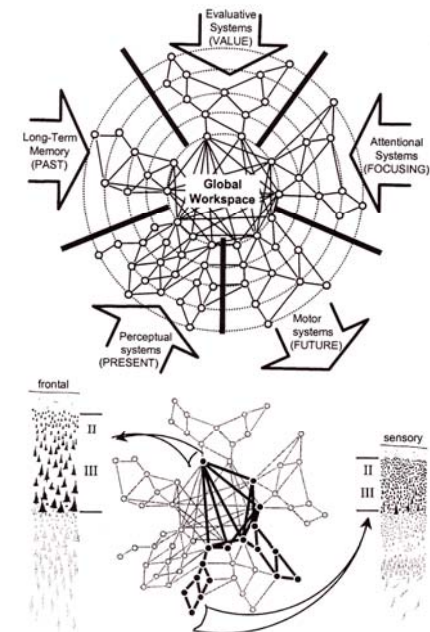


# A cognitive neuroscience perspective on mathematics



- During its evolution, our primate brain has been endowed with elementary representations that are adequate to certain aspects of the external world.
- These internalized representations of time, space, and number, shared with many animal species, provide the **foundations of mathematics**.

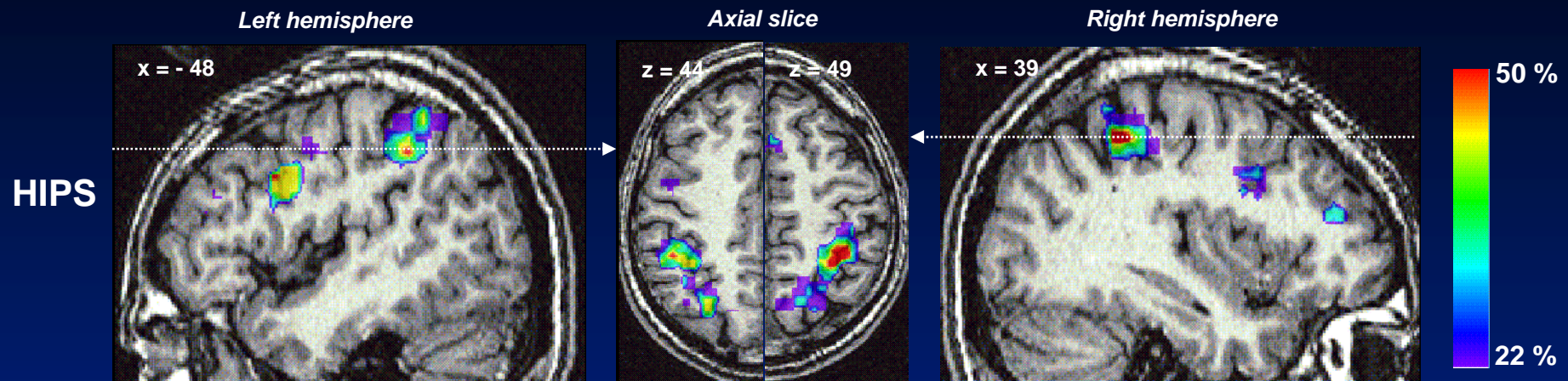
- Unique to humans, however, is the capacity to achieve **integration of those internal senses**
- The cultural construction of mathematics can be seen as a **search for coherence amongst internal representations** – which is reproduced at a faster pace during education
- What role does the **acquisition of symbols** play in this internal synthesis process? How does exposure to a system of Arabic numerals and number words change the organization of the number sense?



# Plan of the talk

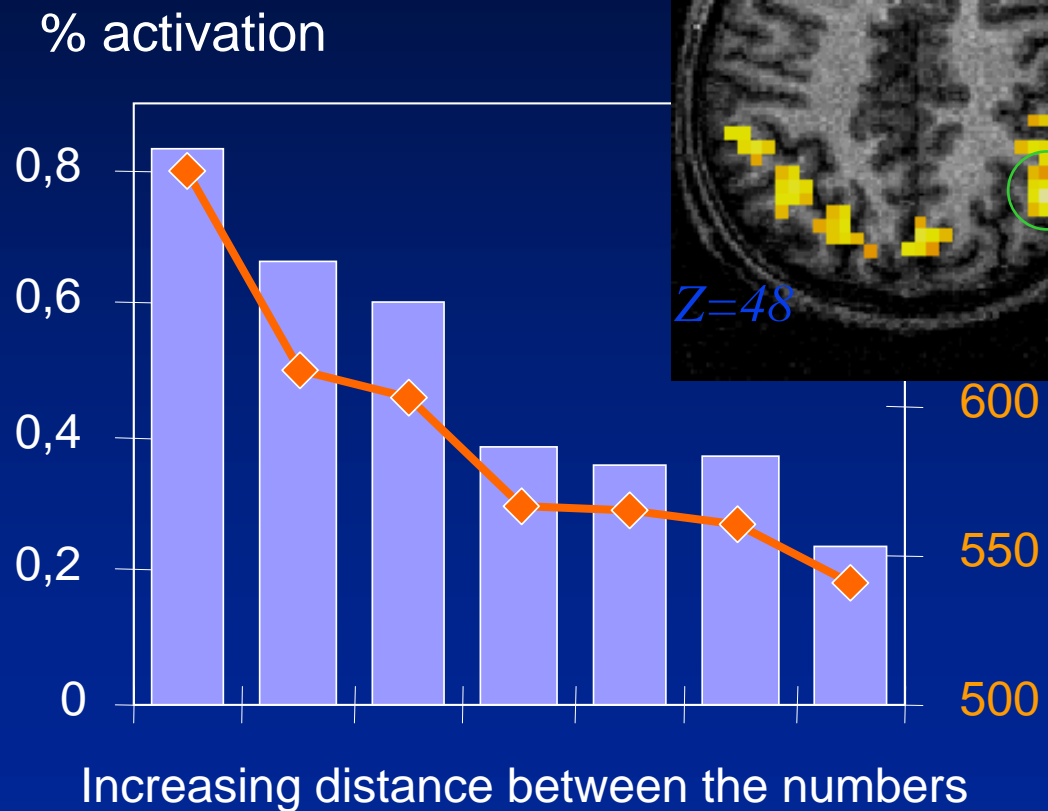
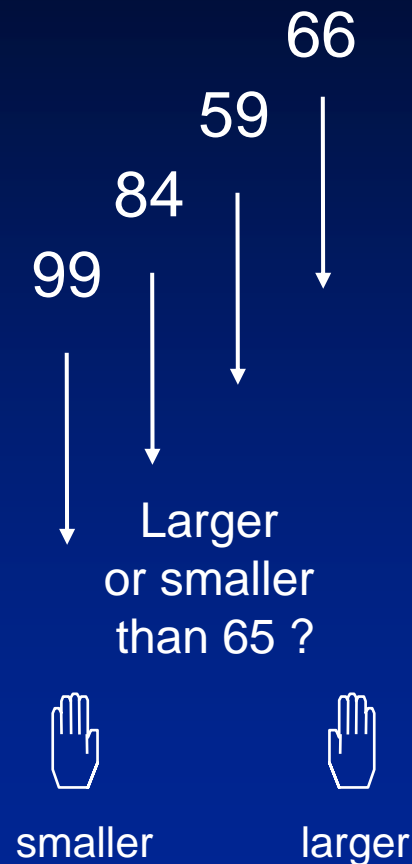
- **Neural coding of numerosity**
  - A quantity code is present in the intraparietal area of human adults and babies
  - Optimal decision mechanisms based on this code can explain human psychophysics
- **Understanding of number symbols**
  - Symbols are mapped onto numerosities
  - However, the numerosity code may be changed by learning symbols
  - Linear mapping of number onto space
- **Brain mechanisms of number-space mappings**

## Previous studies of number sense and the horizontal segment of the intraparietal sulcus (HIPS)

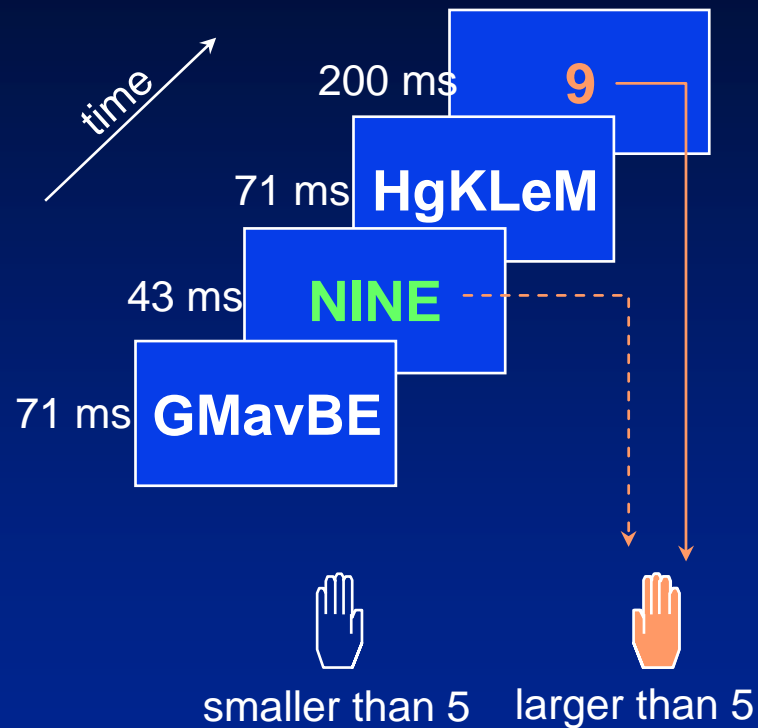


- All numerical tasks activate this region (e.g. addition, subtraction, comparison, approximation, digit detection...)
- This region fulfils two criteria for a semantic-level representation:
  - It responds to number **in various formats** (Arabic digits, written or spoken words), more than to other categories of objects (e.g. letters, colors, animals...)
  - Its activation varies according to a **semantic metric** (numerical distance, number size)

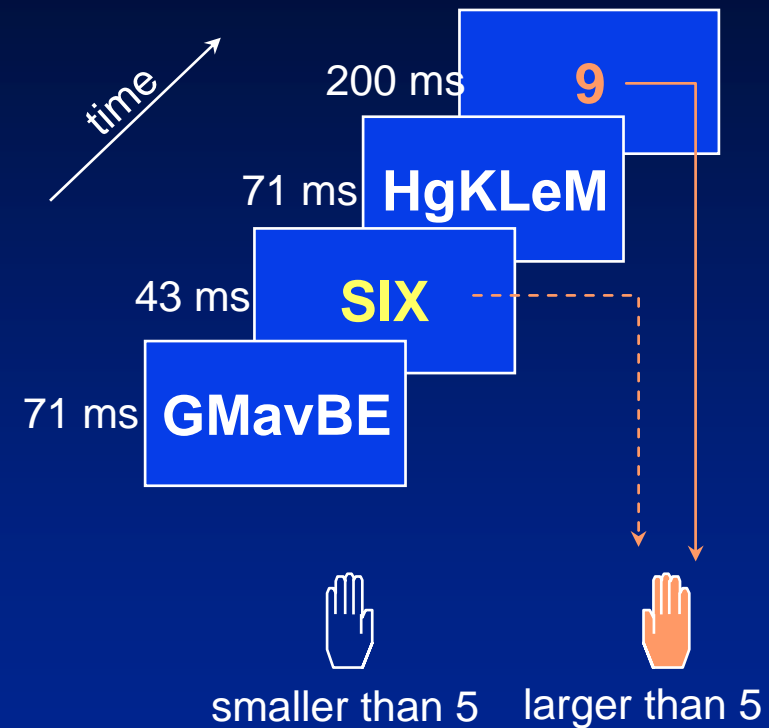
# Neural bases of the distance effect in symbolic number comparison



# QUANTITY REPETITION PRIMING: A MARKER OF UNCONSCIOUS SEMANTIC PROCESSING?



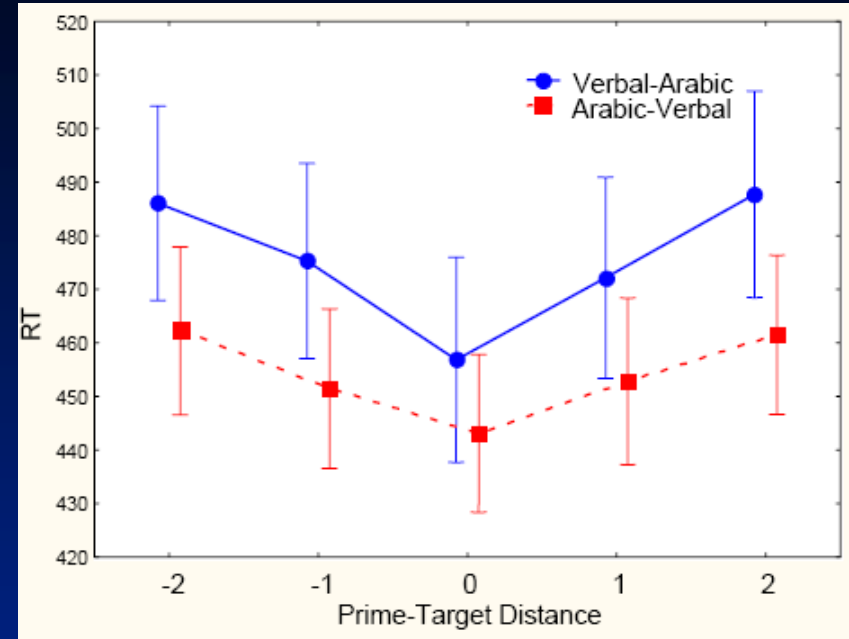
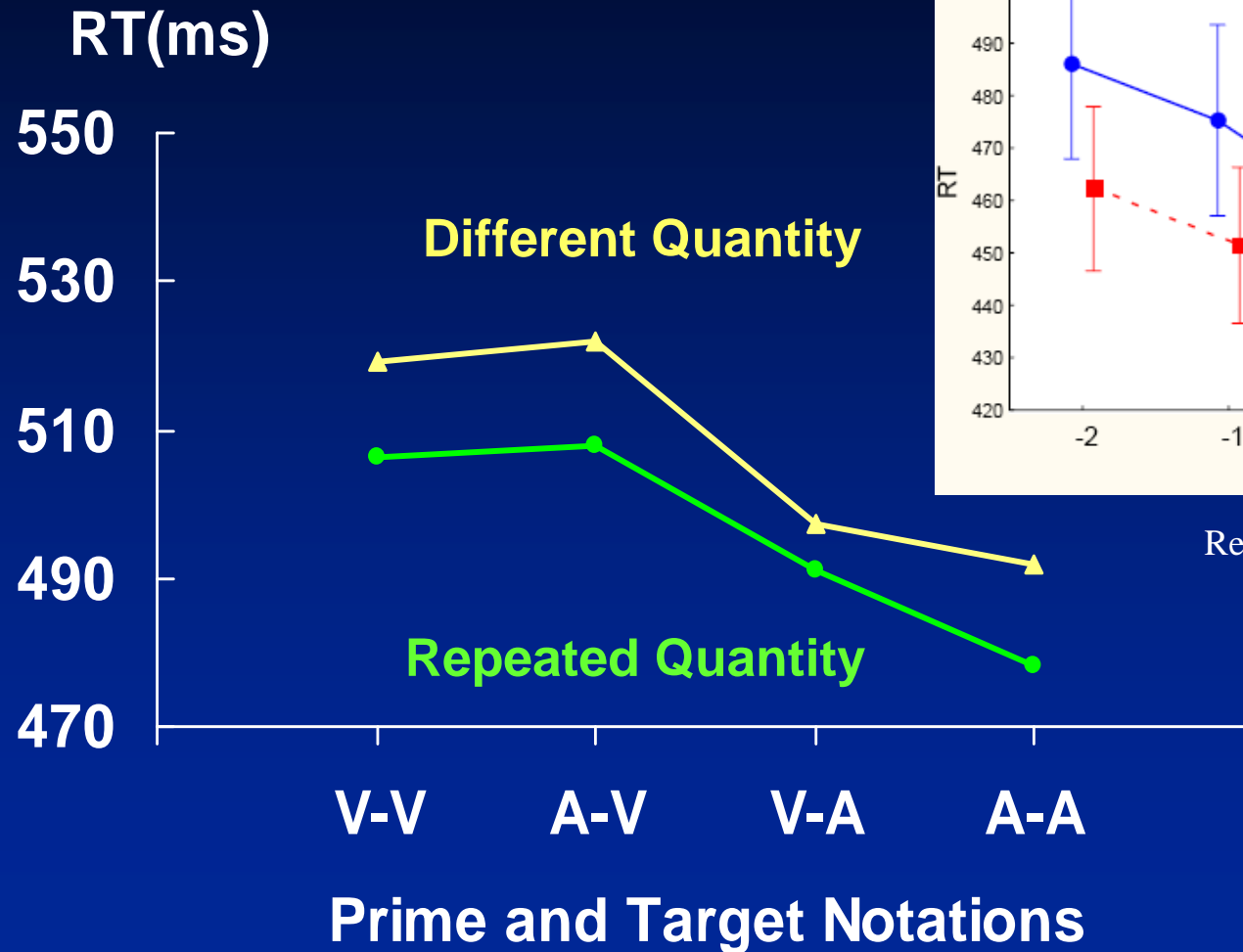
**Same Response**  
**Repeated Quantity**



**Same Response**  
**Different Quantity**



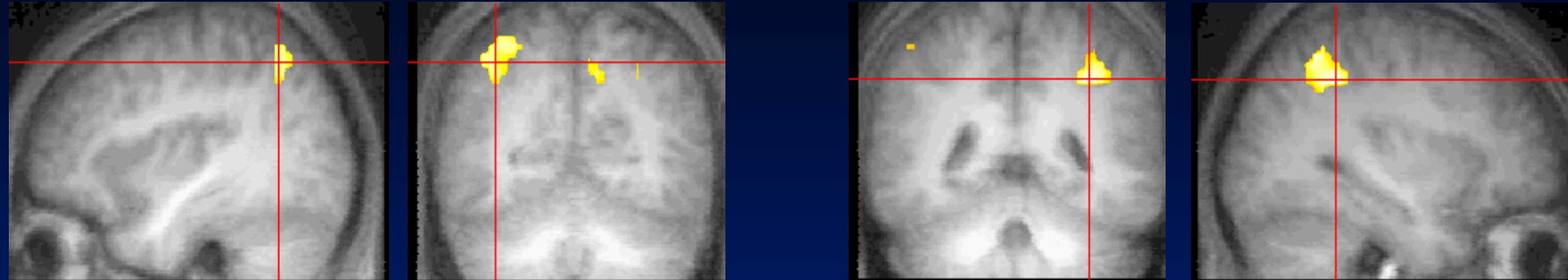
# Behavioral Quantity Priming irrespective of number notation



Reynvoet & Brysbaert (2004)

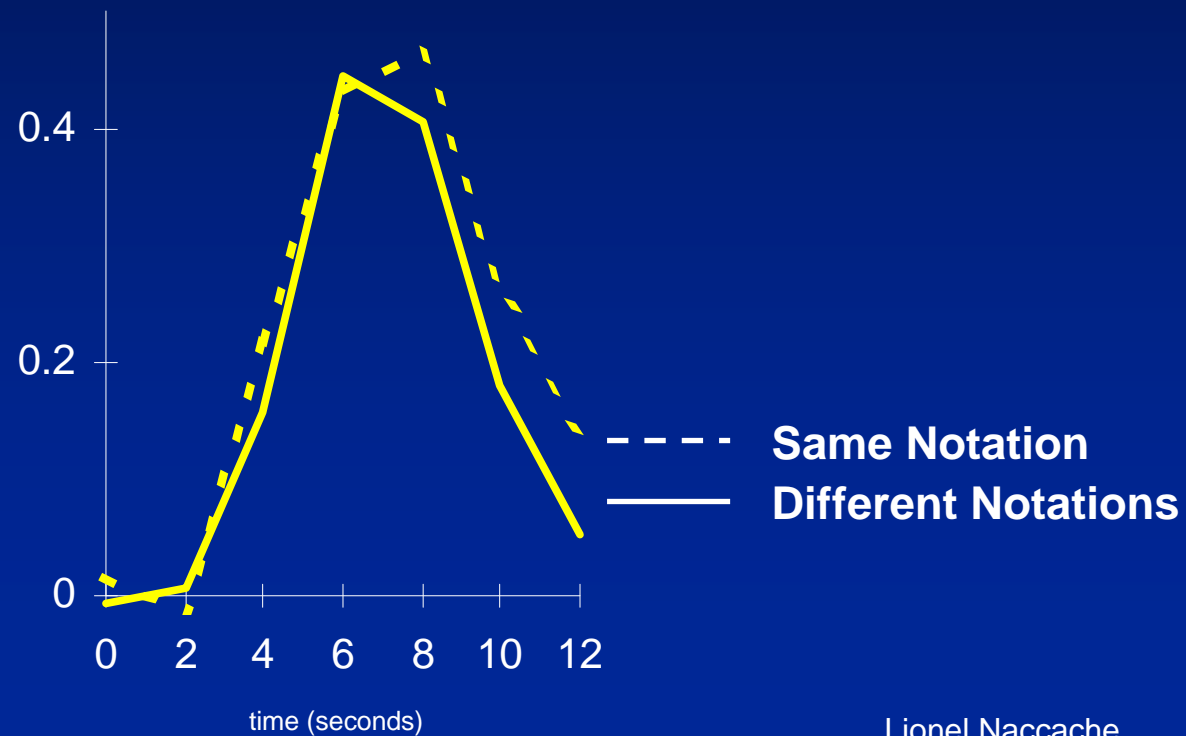
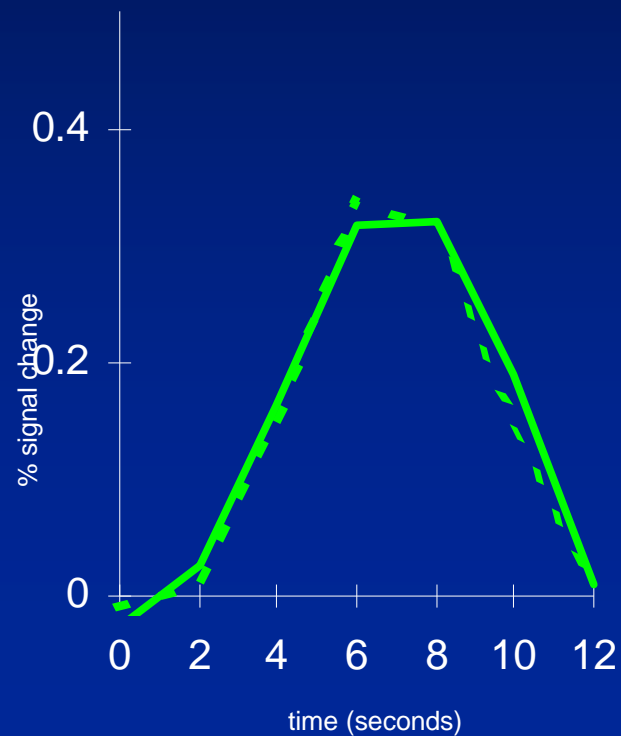
# UNCONSCIOUS PARIETAL PROCESSING OF QUANTITY

The intraparietal quantity system shows a notation-independent repetition effect

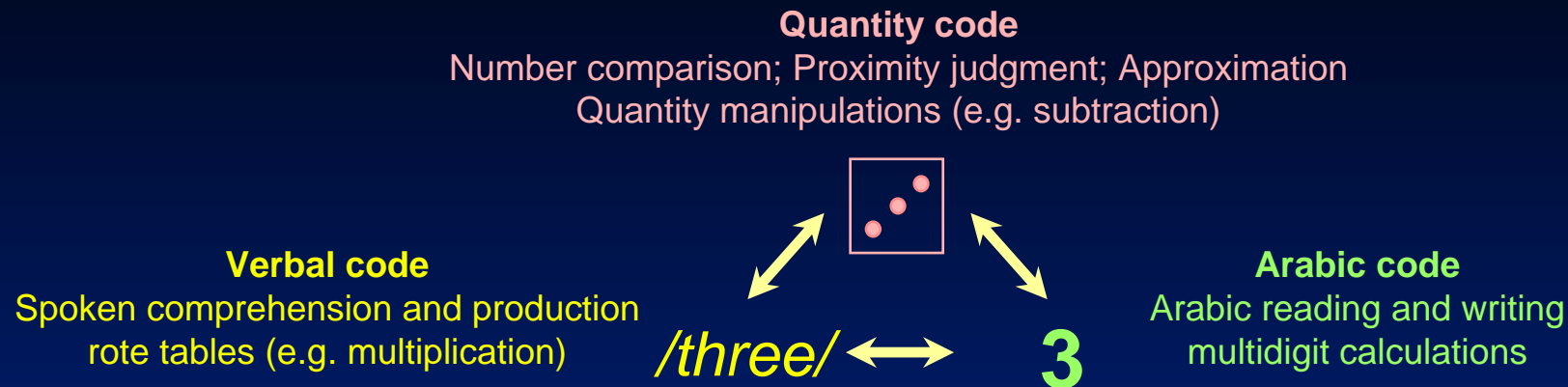


Repeated Quantity

Different Quantity

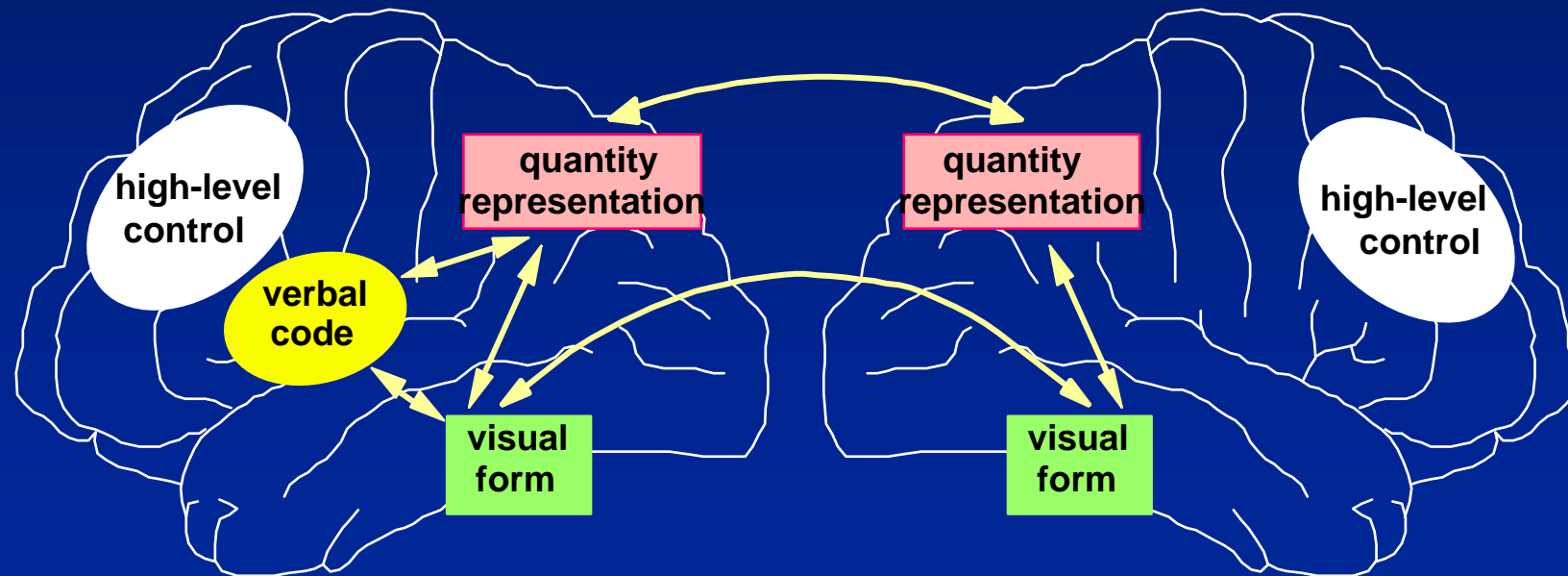


# Attaching symbols to quantities: The triple-code model of number processing



left hemisphere

right hemisphere



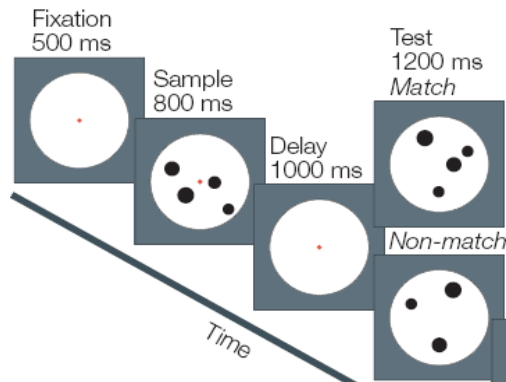
# Plan of the talk

- Neural coding of numerosity
  - A quantity code is present in the intraparietal area of human adults and babies
  - Optimal decision mechanisms based on this code can explain human psychophysics
- Understanding of number symbols
  - Symbols are mapped onto numerosities
  - However, the numerosity code may be changed by learning symbols
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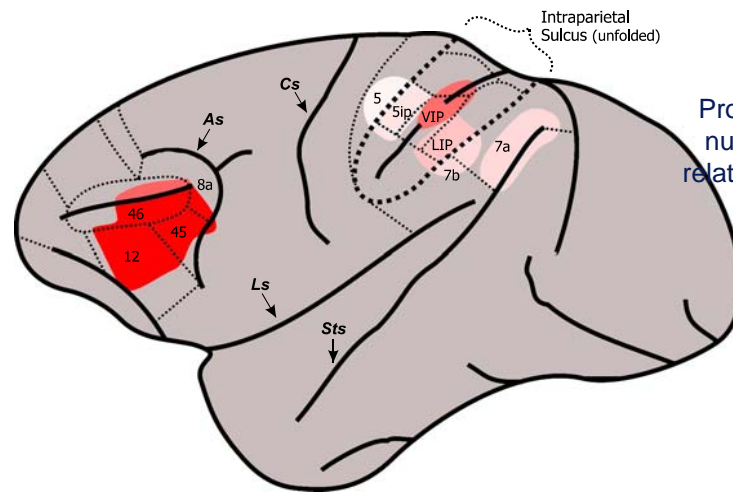
# Number neurons in the monkey

(Nieder, Freedman & Miller, 2002; Nieder & Miller, 2003, 2004, 2005)

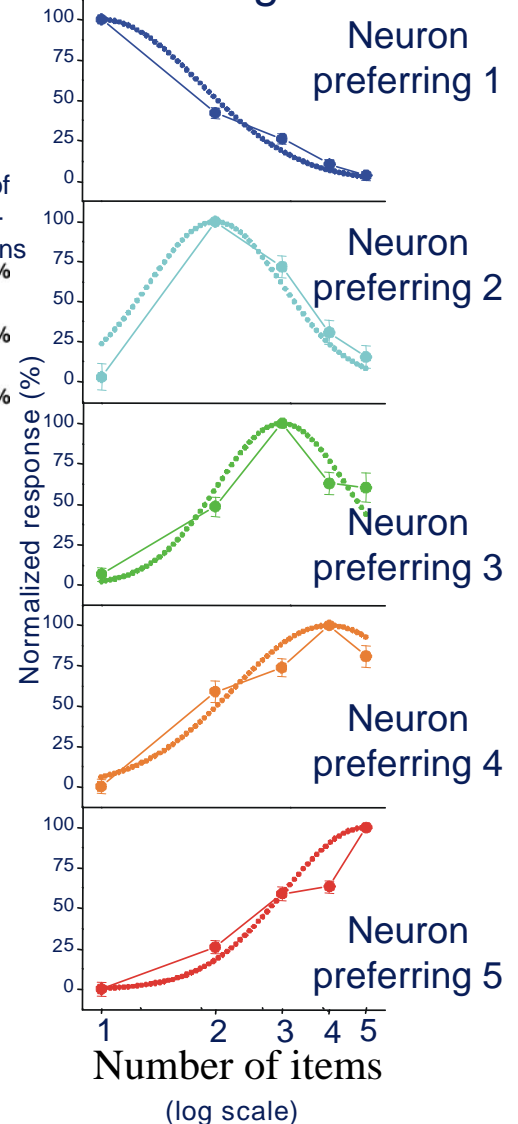
**Task:**  
same-different judgement  
with small numerosities



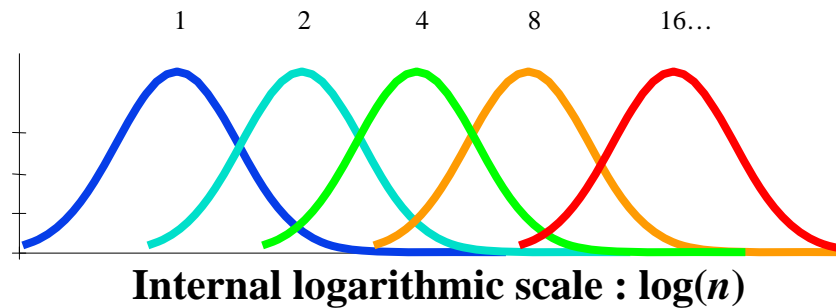
**Anatomy**



**Neuronal firing rates**



**The Dehaene-Changeux (1993) model:  
Coding by Log-Gaussian numerosity detectors**



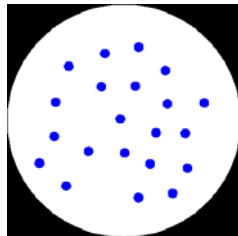
Nieder, A., Freedman, D. J., & Miller, E. K. (2002). Representation of the quantity of visual items in the primate prefrontal cortex. *Science*, 297(5587), 1708-1711.

Nieder, A., & Miller, E. K. (2003). Coding of cognitive magnitude. Compressed scaling of numerical information in the primate prefrontal cortex. *Neuron*, 37(1), 149-157.

# From numerosity detectors to numerical decisions: Elements of a mathematical theory

(S. Dehaene, *Attention & Performance* chapter, 2007)

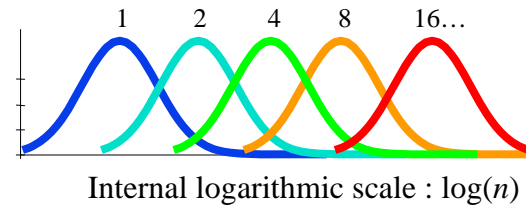
Stimulus of numerosity  $n$



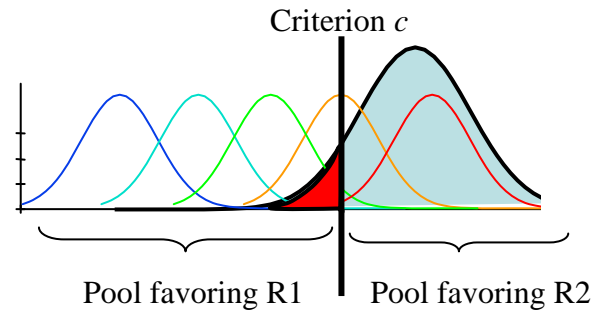
Response in simple arithmetic tasks:

- Larger or smaller than  $x$ ?
- Equal to  $x$ ?

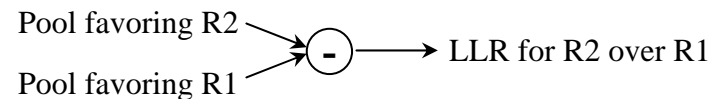
## 1. Coding by Log-Gaussian numerosity detectors



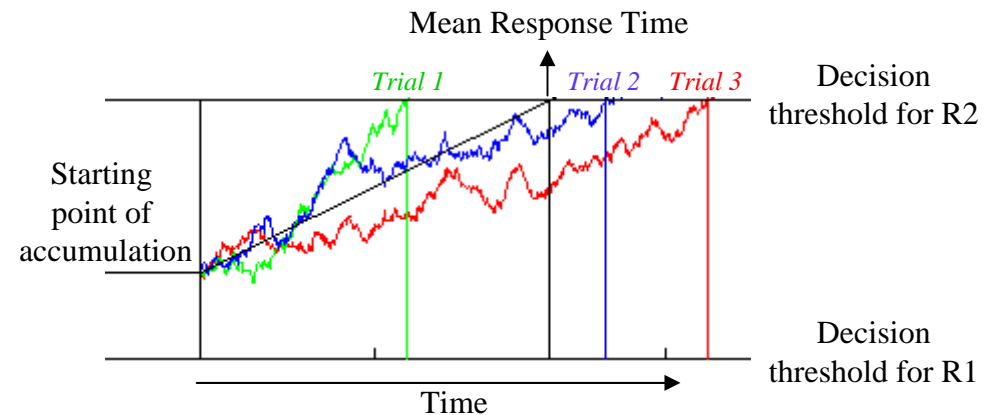
## 2. Application of a criterion and formation of two pools of units



## 3. Computation of log-likelihood ratio by differencing

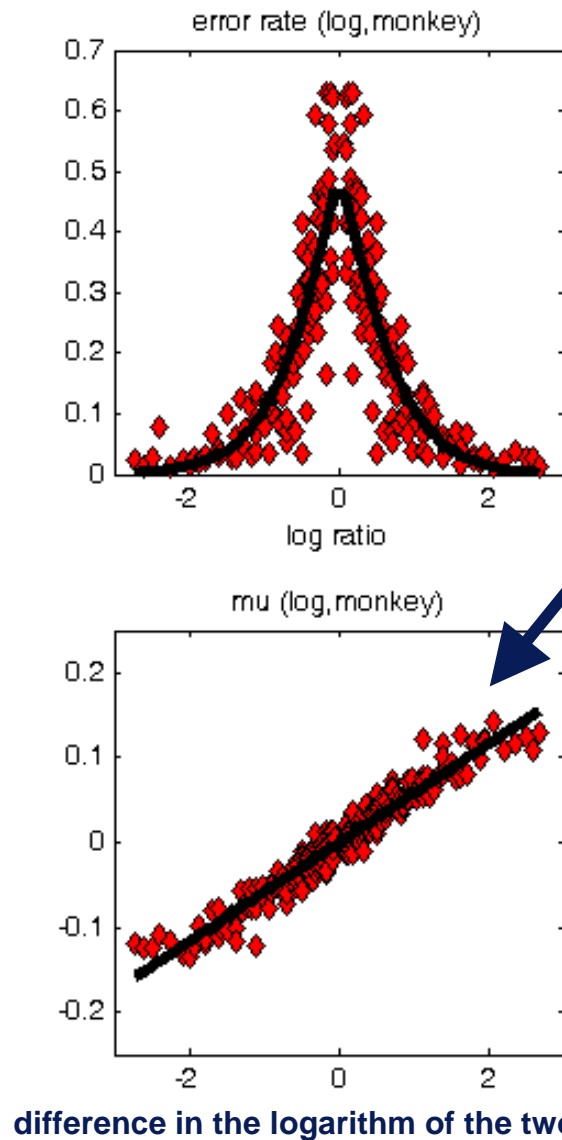
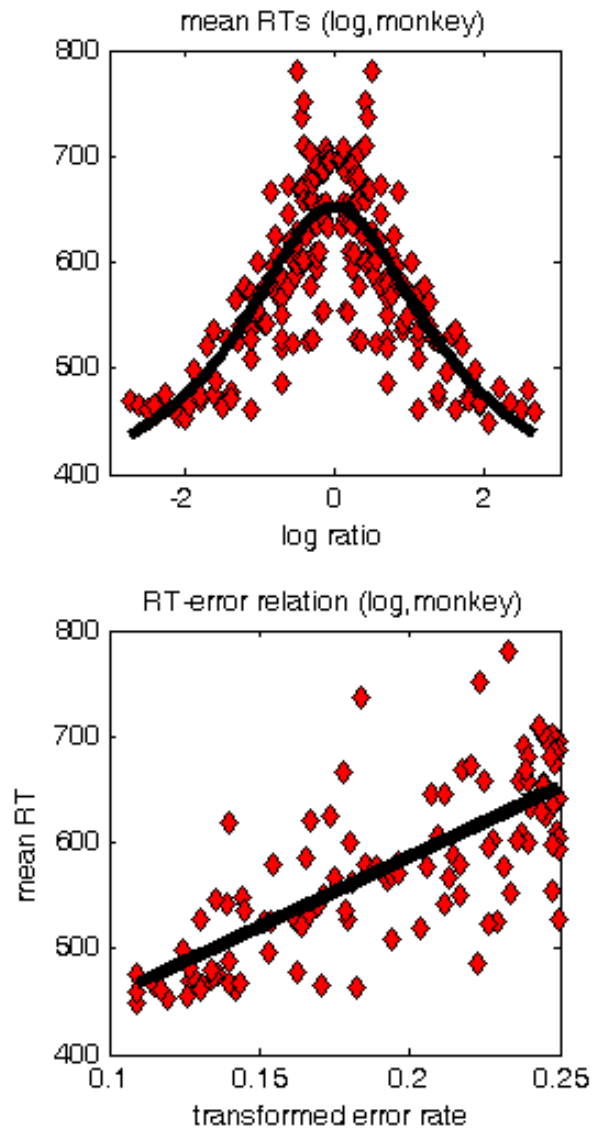


## 4. Accumulation of LLR, forming a random-walk process



# Example: Which of two numerosities is the larger?

Data from Cantlon & Brannon (2006)



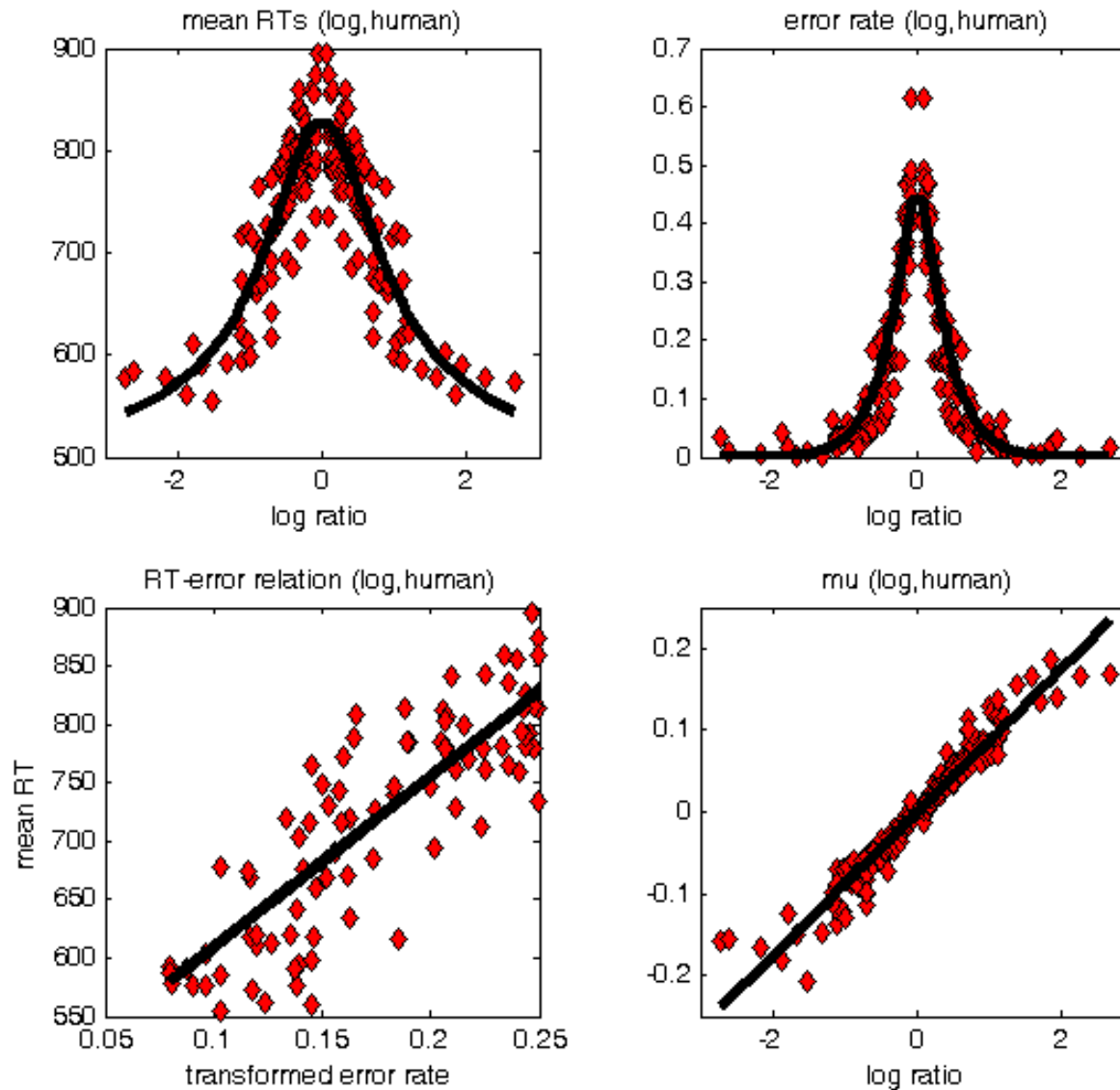
Subjects = monkeys  
Stimuli = sets of dots

Crucial hidden variable:  
Amount of information  
accumulated per unit of  
time

Varies linearly with the  
difference in the **logarithm**  
of the two numbers

## Example: Which of two numerosities is the larger?

Cantlon, J. F., & Brannon, E. M. (2006). Shared system for ordering small and large numbers in monkeys and humans. *Psychol Sci*, 17(5), 401-406.



- Humans and monkeys have very similar competence for numerosity decision (though humans are slightly slower and more precise)

- RTs and errors have exactly the shape predicted by the theory

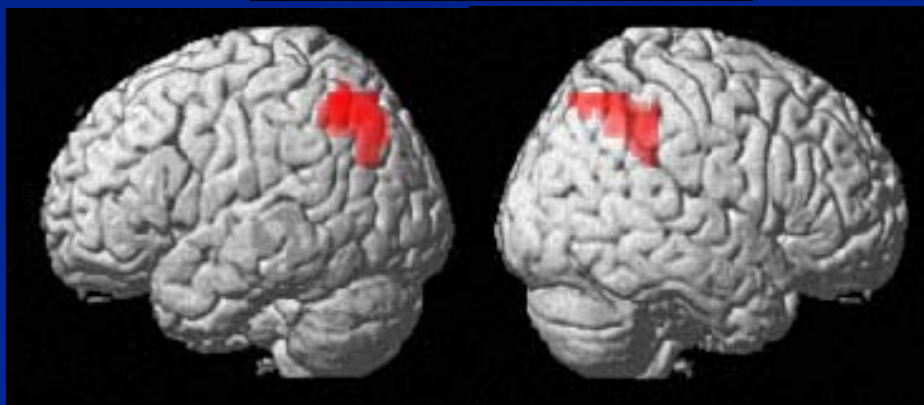
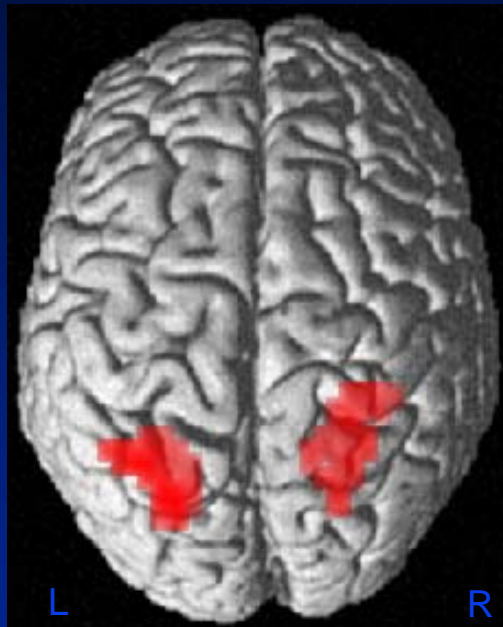
- Performance depends on numerosity ratio (or equivalently, difference of logarithms)



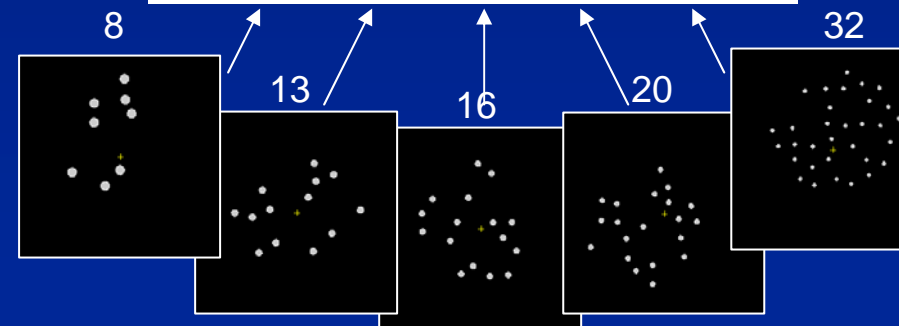
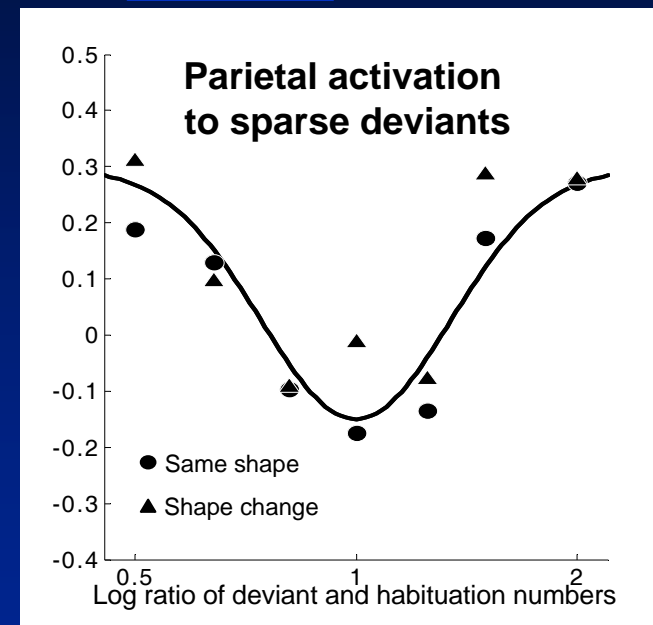
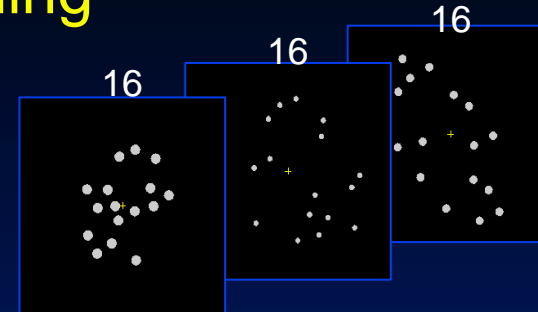
# Does human IPS contain number neurons? fMRI adaptation reveals Log-Gaussian turning in the human intraparietal sulcus

Piazza, Izard, Pinel, Le Bihan & Dehaene, Neuron 2004

Regions responding to a change in number

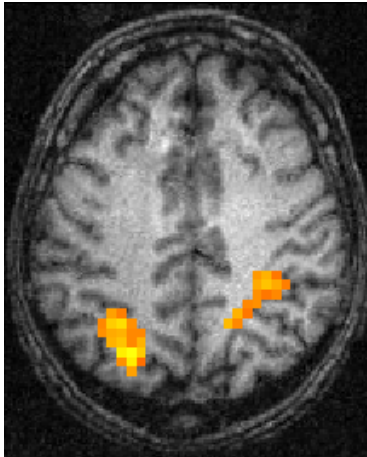


Adaptation to a fixed  
number



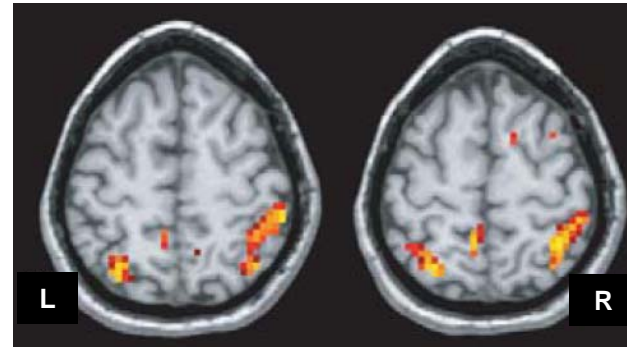
# A basic dorsal-ventral organization for shape vs number

## Initial study: effect of number change



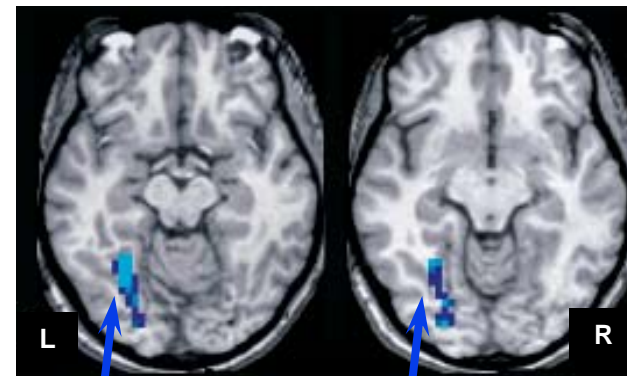
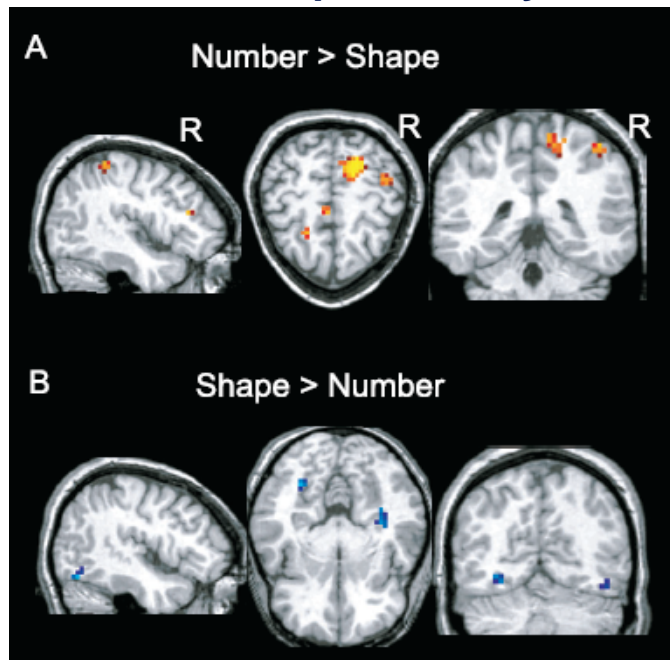
Number change in intraparietal cortex

Improved design by Cantlon, Brannon et al. (PLOS, 2006):



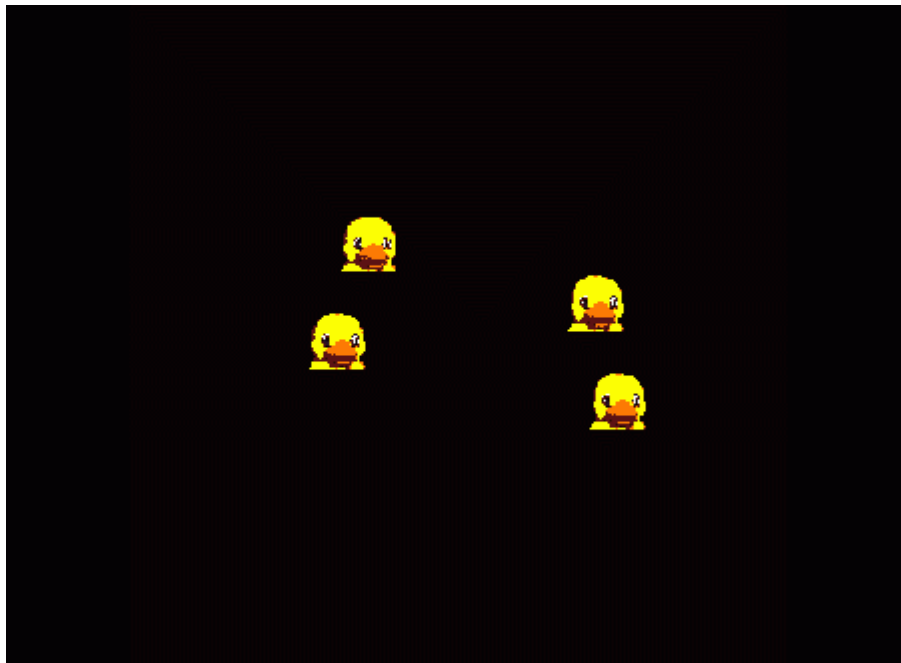
Number change > Shape change in bilateral intraparietal sulci

## Number and shape in four-year-olds



Shape change > Number change in left inferior temporal cortex

# Do infants show numerosity adaptation and recovery? An ERP experiment



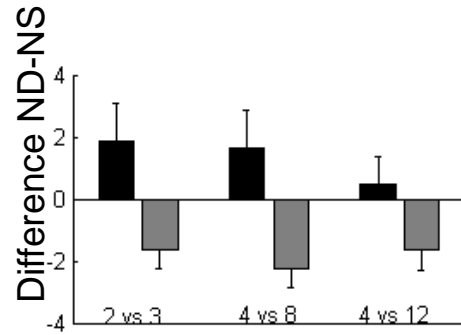
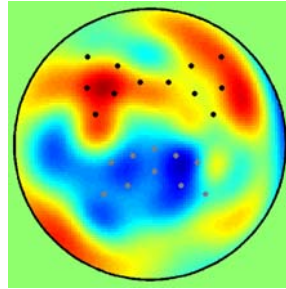
2 x 2 design : numerosity and/or object change

3 pairs of numerosities:  
4 vs 8 ; 4 vs 12 ; 2 vs 3

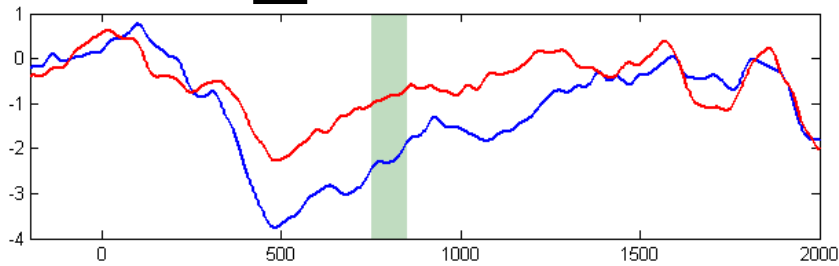
Twelve 3-4 month-old infants in each group

Véronique Izard  
Ghislaine Dehaene-Lambertz

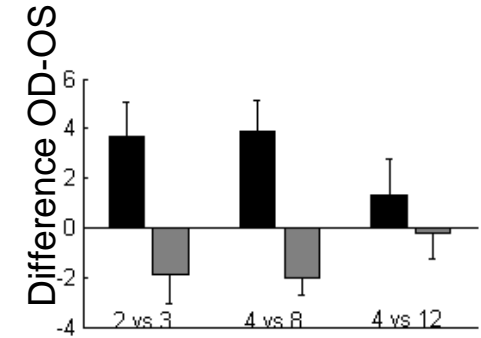
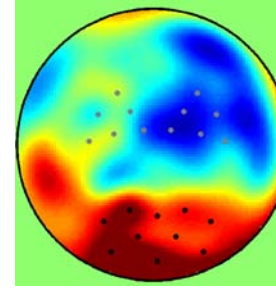
## Number Change



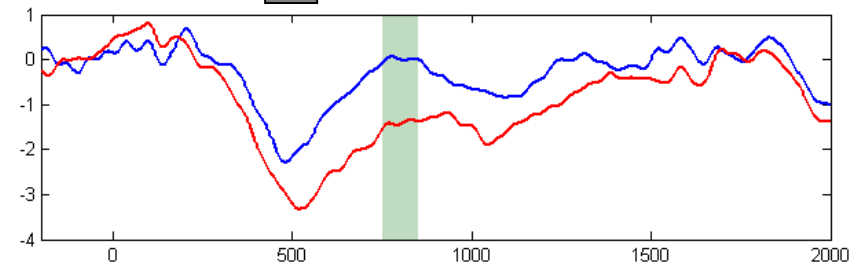
■ Prefrontal channels



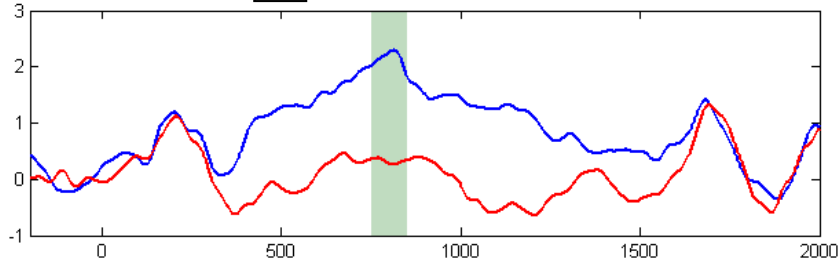
## Object Change



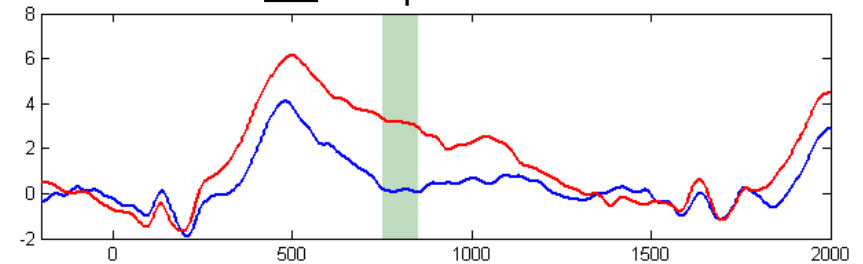
■ Central channels



■ Parietal channels



■ Occipital channels



— Deviant number — Standard number

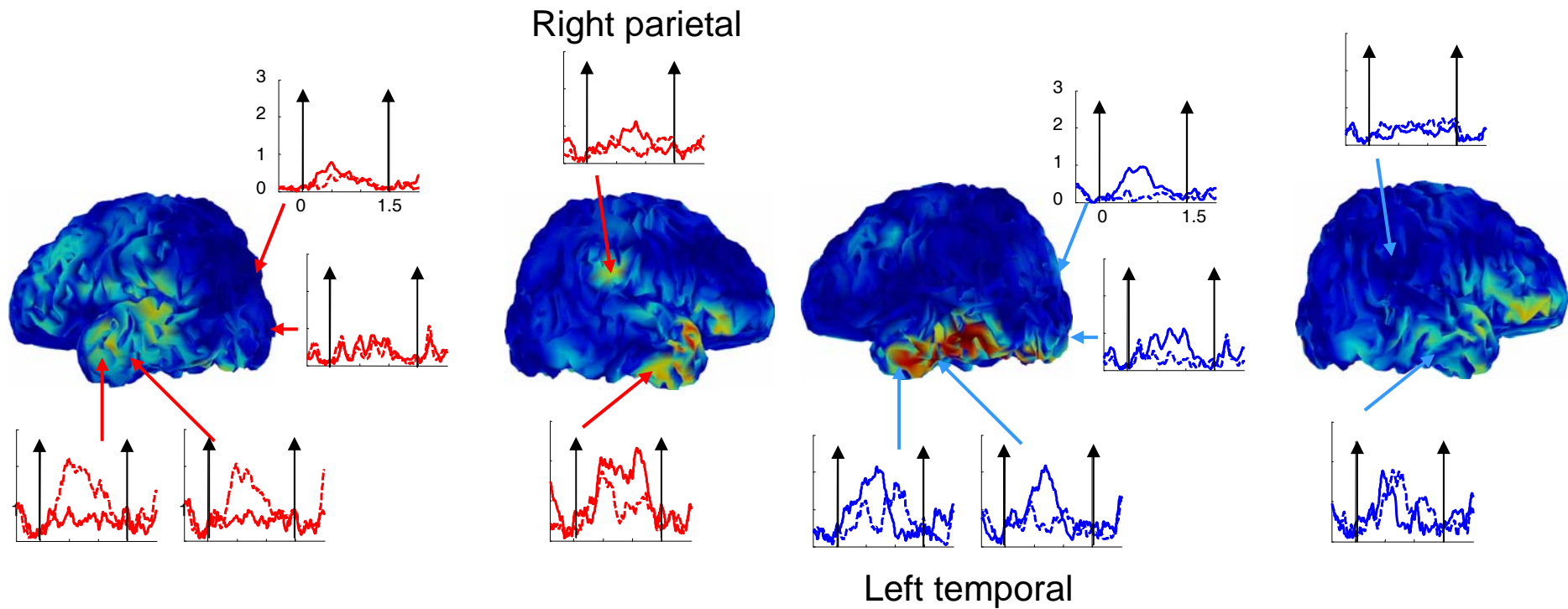
— Deviant object — Standard object

# A basic dorsal / ventral organization in 3-4 month old infants:

## Right parietal response to number, left temporal response to objects

Number Change

Object Change



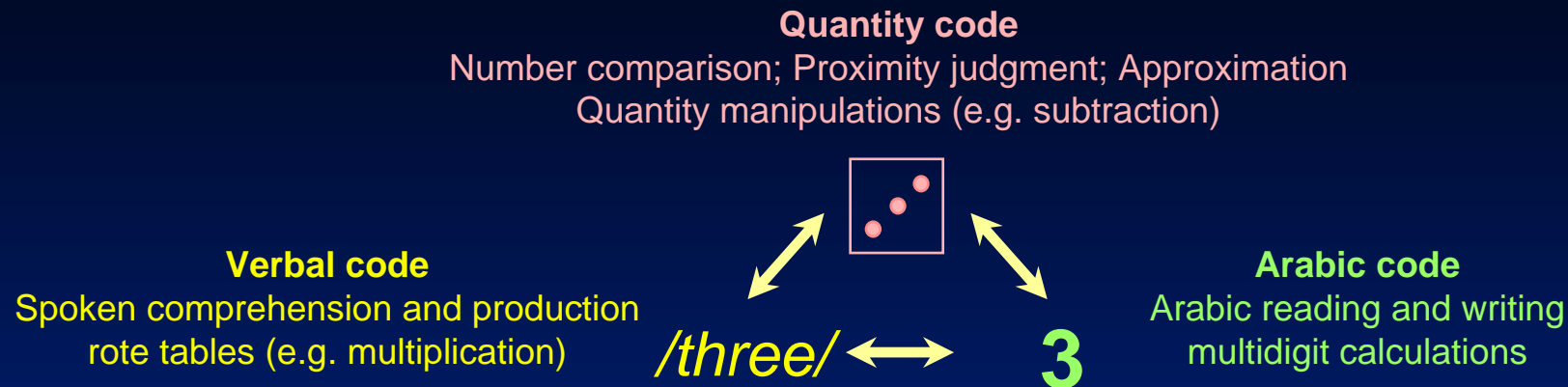
— Deviant number (DN)  
- - - Standard number (SN)

— Deviant object (DO)  
- - - Standard object (SO)

# Plan of the talk

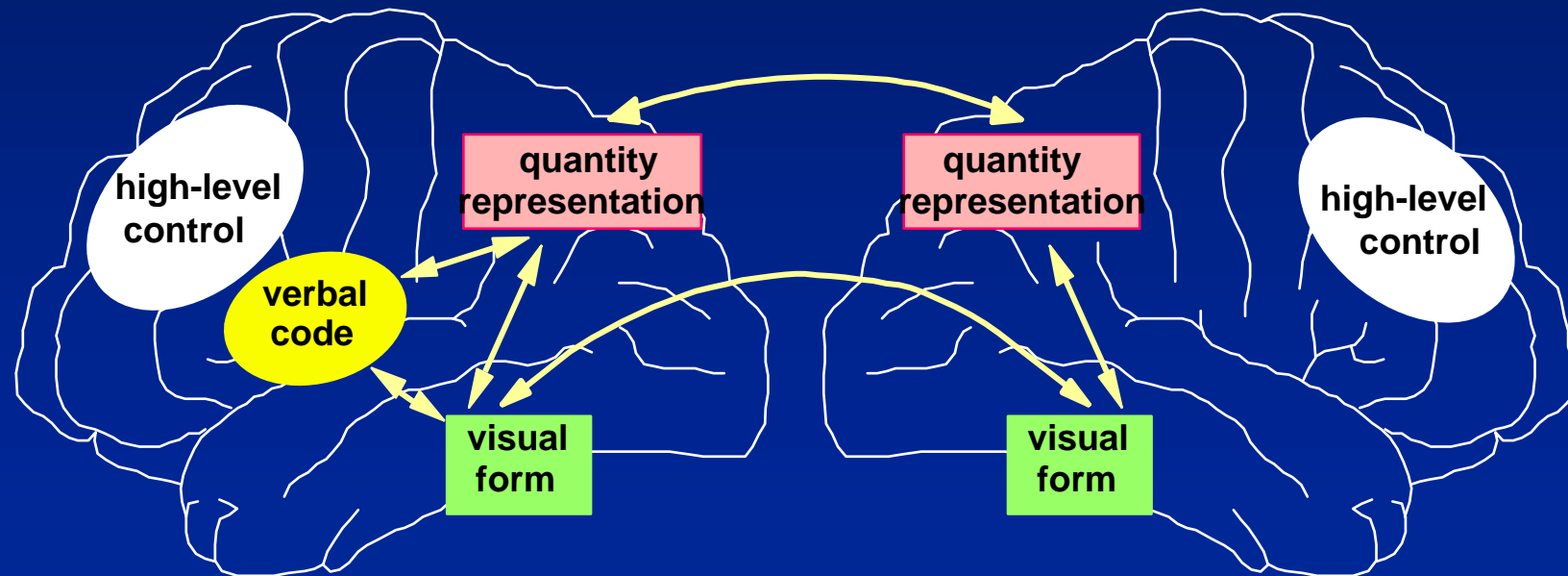
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# Attaching symbols to quantities: The triple-code model of number processing

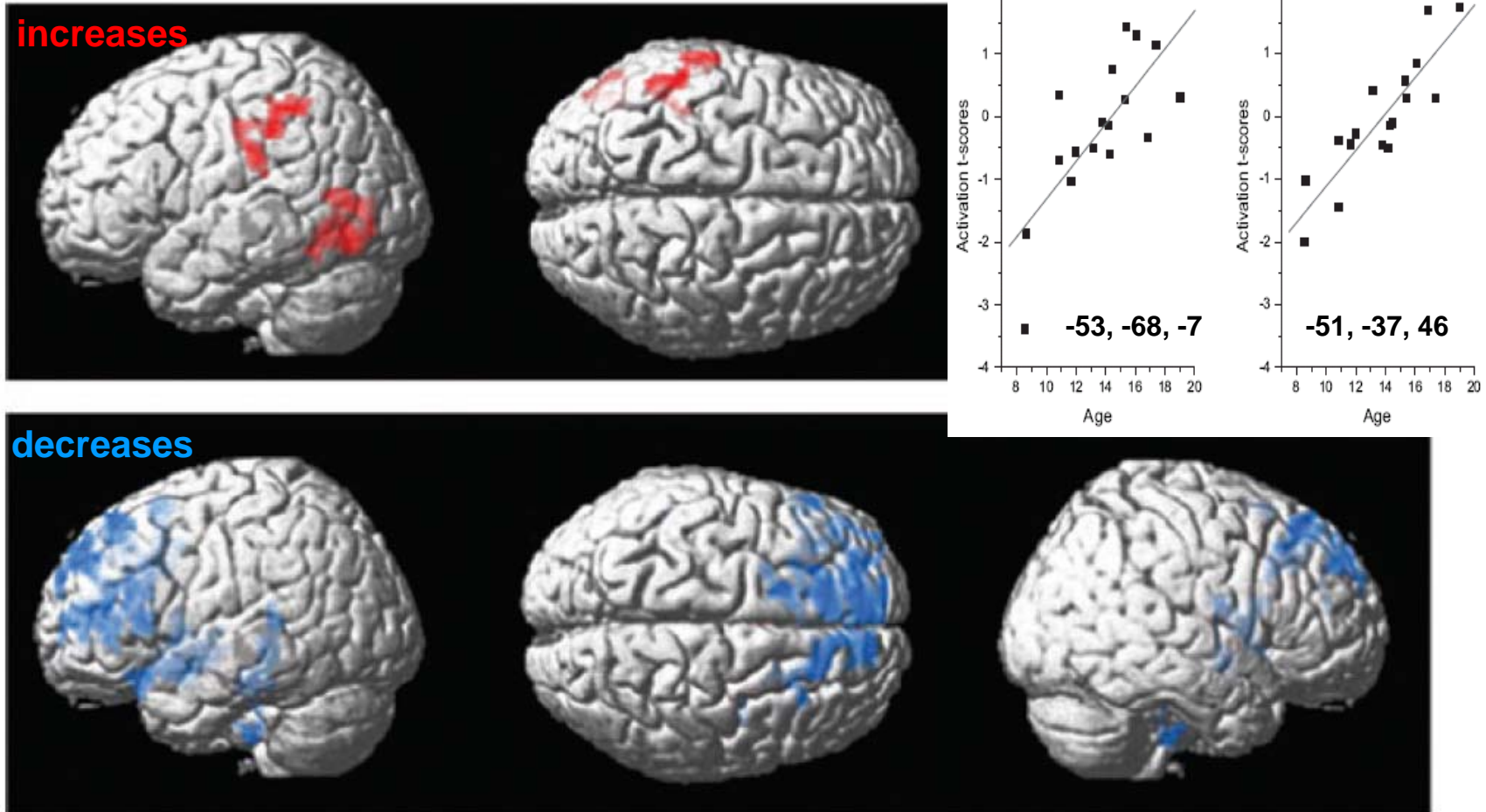


left hemisphere

right hemisphere



## Changes in activation with age during mental arithmetic



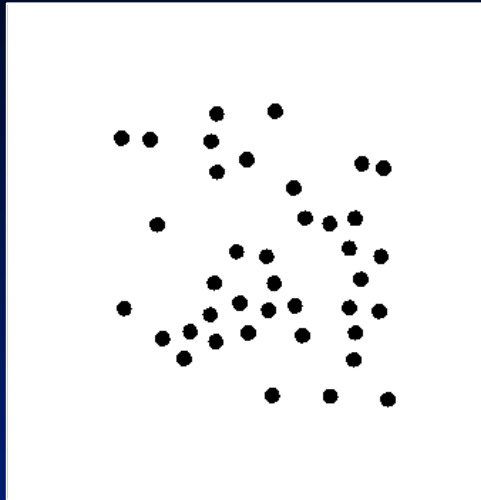
Rivera, S. M., Reiss, A. L., Eckert, M. A., & Menon, V. (2005). Developmental Changes in Mental Arithmetic: Evidence for Increased Functional Specialization in the Left Inferior Parietal Cortex. *Cereb Cortex*, 15(11), 1779-1790.

For a related result (increase in left parietal distance effect from 10 years-old to adults), see:  
Ansari, D., & Dhital, B. (2006). Age-related changes in the activation of the intraparietal sulcus during nonsymbolic magnitude processing: an event-related functional magnetic resonance imaging study. *J Cogn Neurosci*, 18(11), 1820-1828.



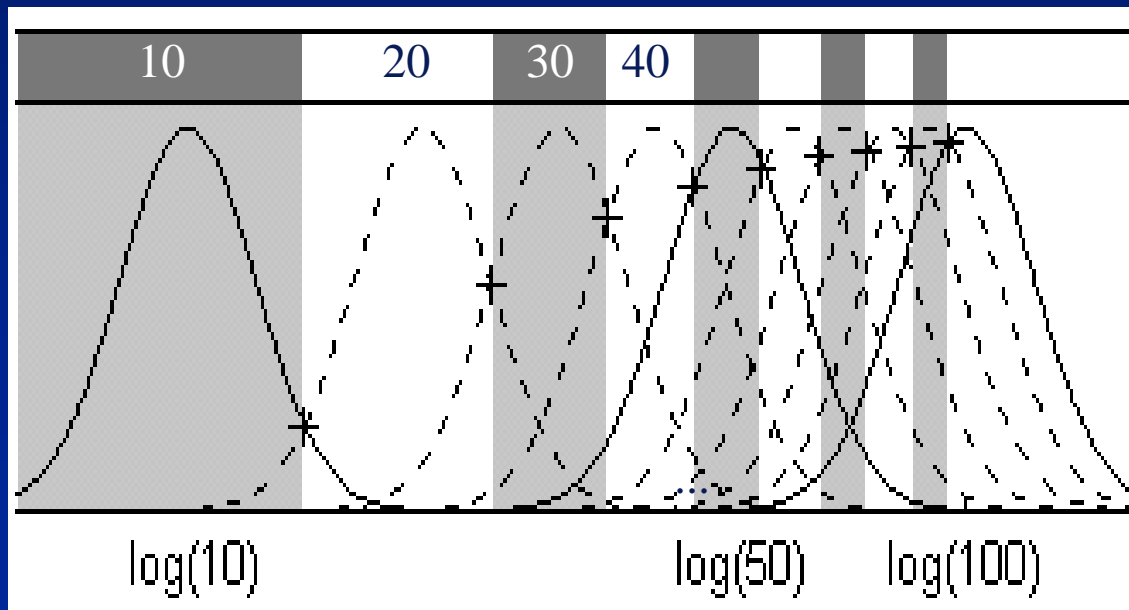
# Model of numerosity naming

(Izard & Dehaene, *Cognition* 2007)

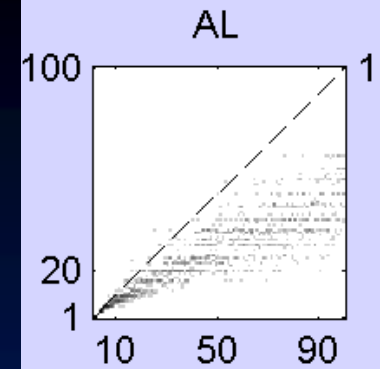


How many dots?

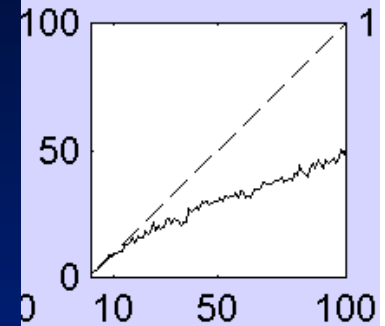
Theory:  
Each number word corresponds to a range on the analog number line



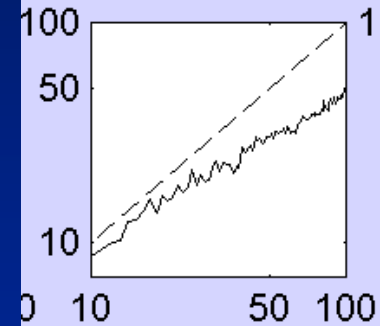
Distribution of the responses (linear plot)



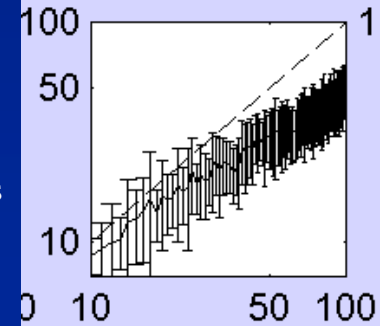
Mean response (linear plot)



Mean response (loglog plot)



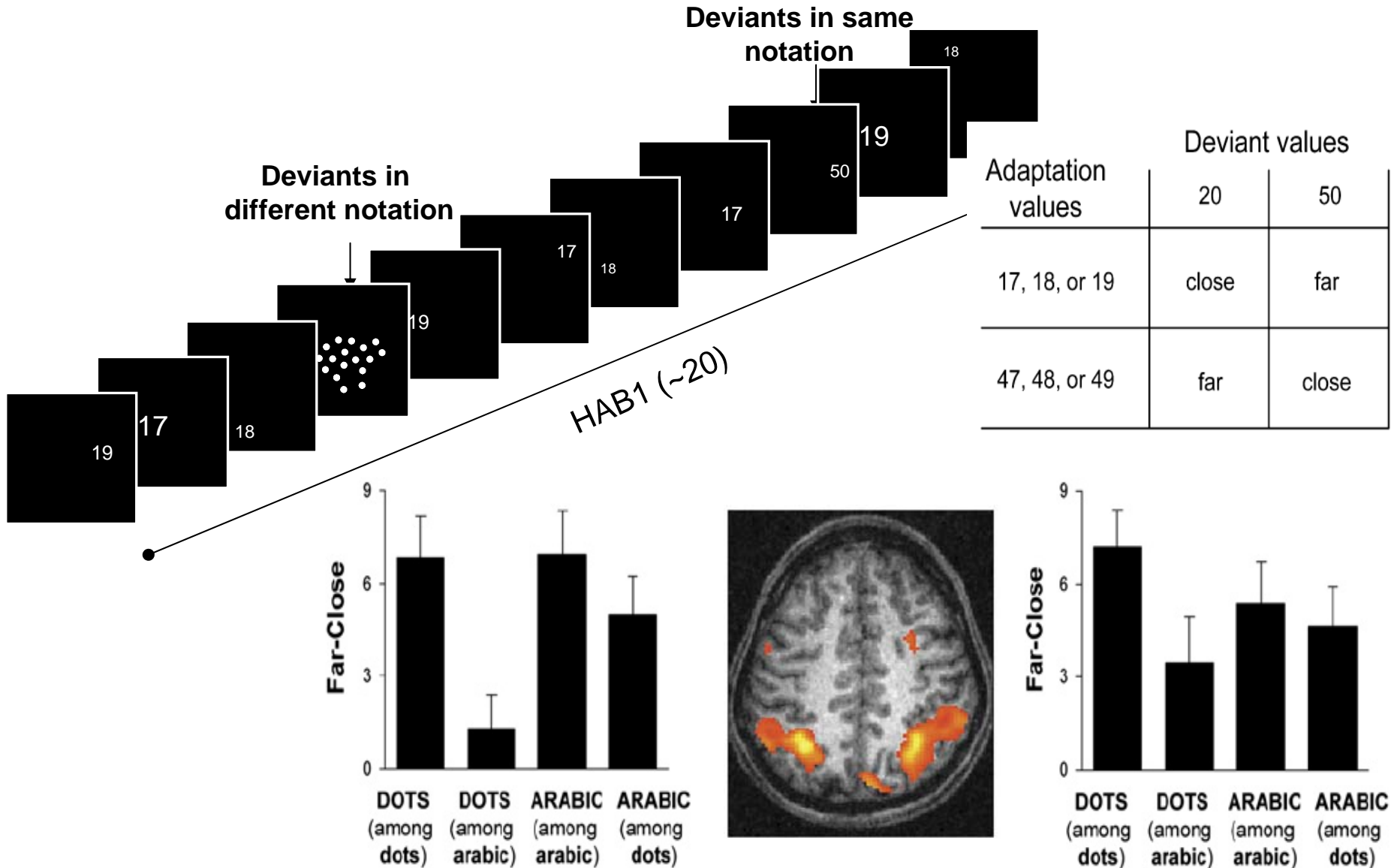
Standard deviation of the responses (loglog plot)



# An fMRI study of cross-notation adaptation

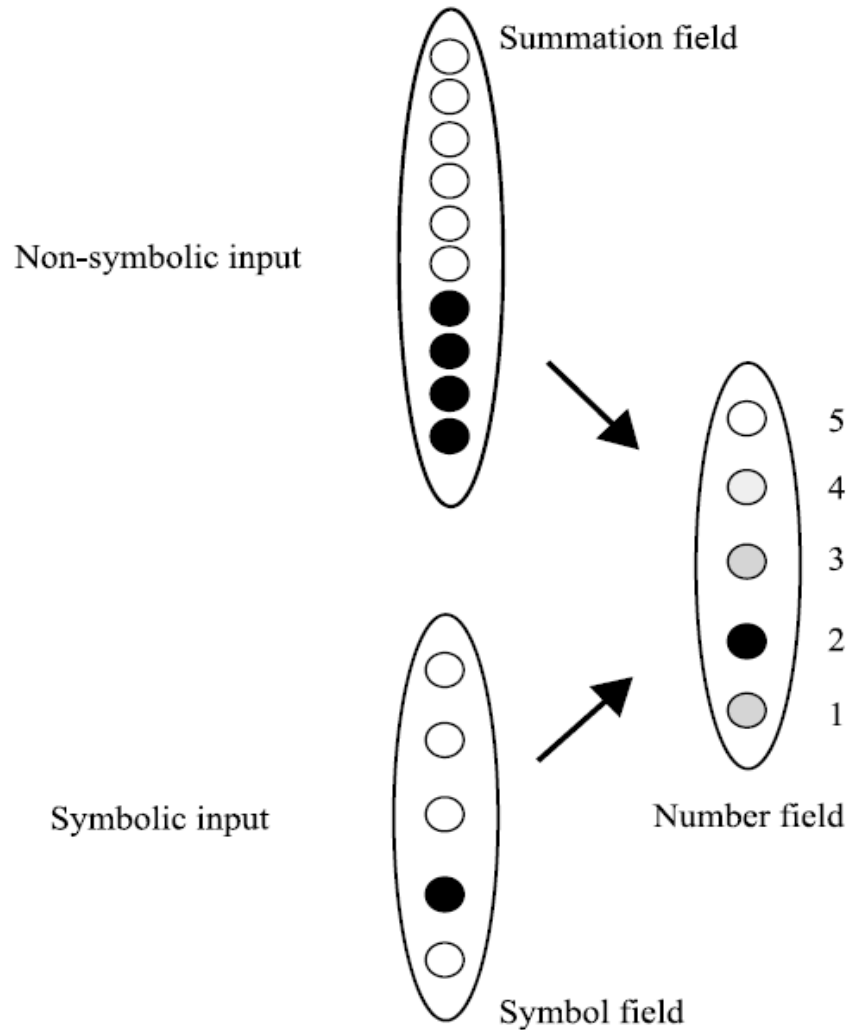
Piazza, Pinel and Dehaene, Neuron 2007

- Do the same neurons code for the symbol 20 and for twenty dots?



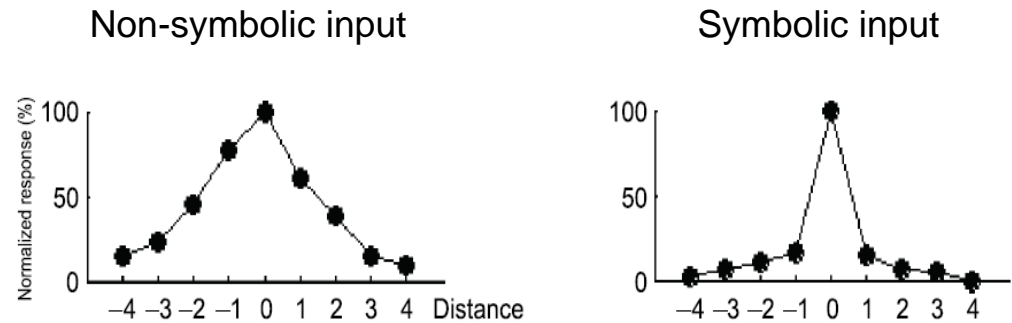
# How is the numerosity representation changed by learning symbols?

Verguts, T., & Fias, W. (2004). Representation of number in animals and humans: a neural model. *J Cogn Neurosci*, 16(9), 1493-1504.

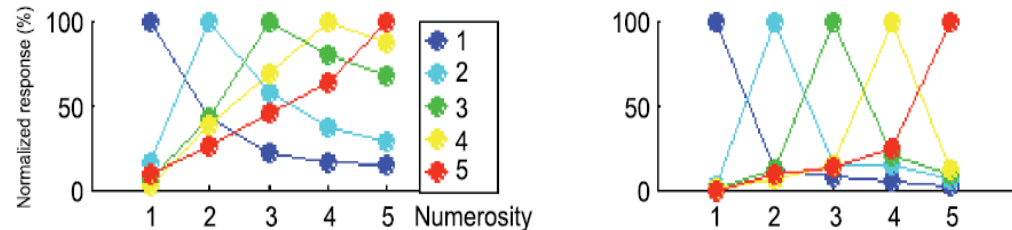


After learning, in the **same** neurons...

The numerosity tuning curves become narrower

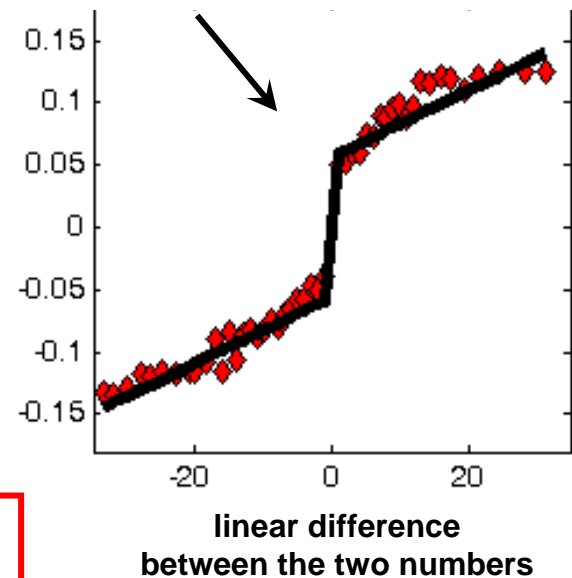
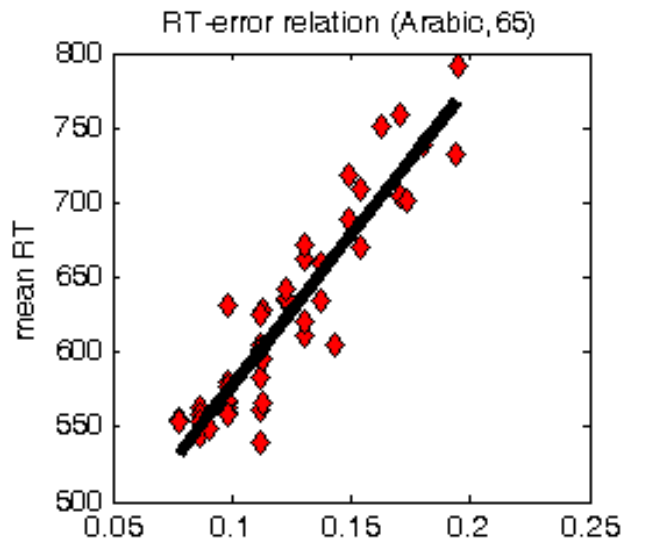
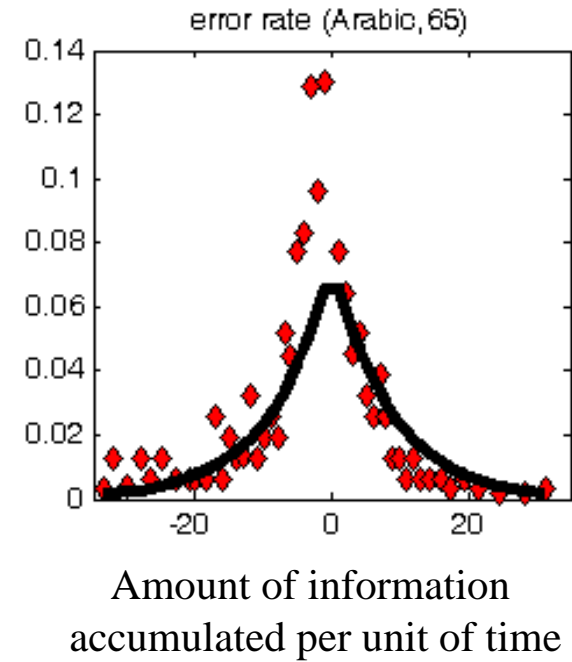
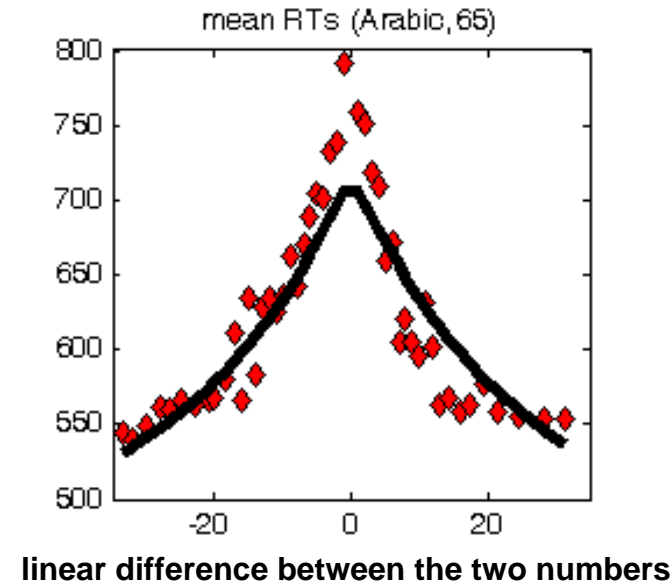
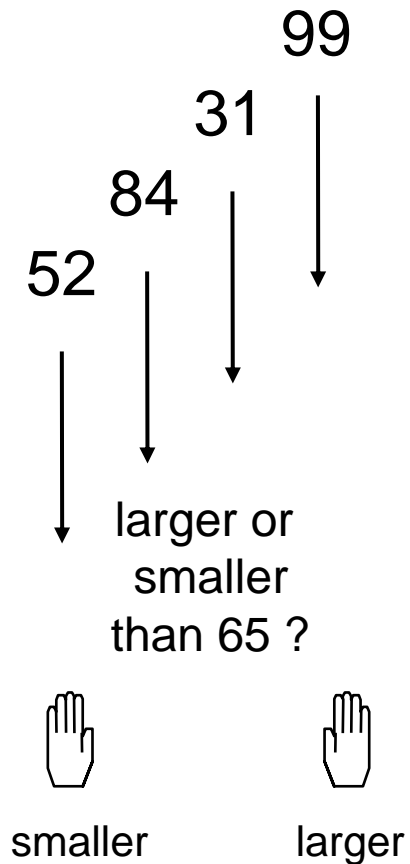


They cease to increase in width with number



# Which of two *Arabic numerals* is the larger?

Subjects = humans  
Stimuli = Arabic numerals



Performance depends on the **linear** difference of the two numbers

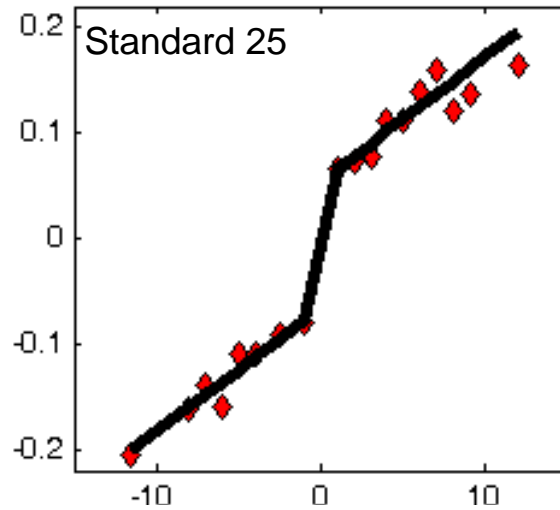
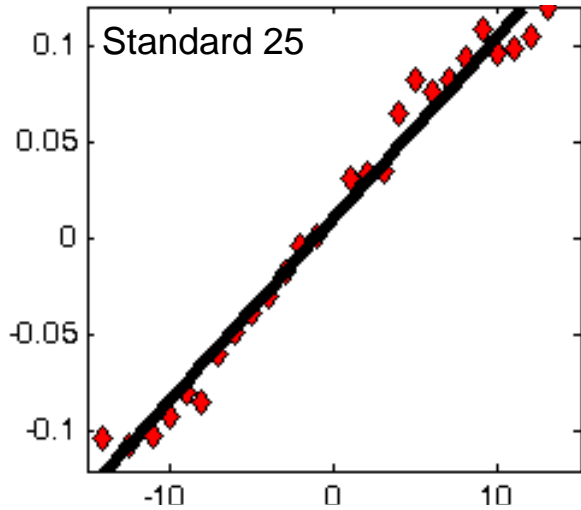
# Non-symbolic and symbolic comparison within the same subjects

10 human adults compared sets of dots or Arabic numerals to a fixed reference, either 25 or 55

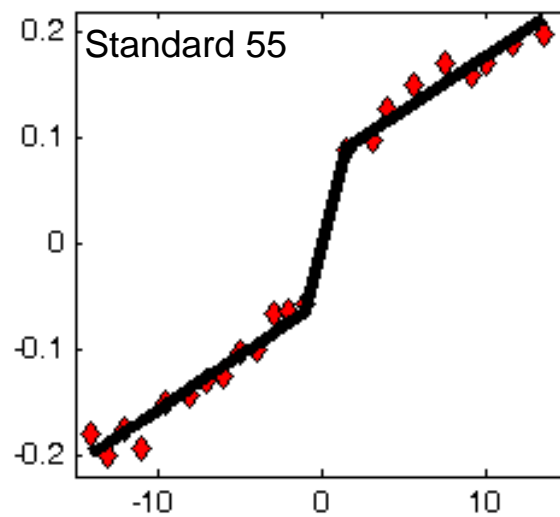
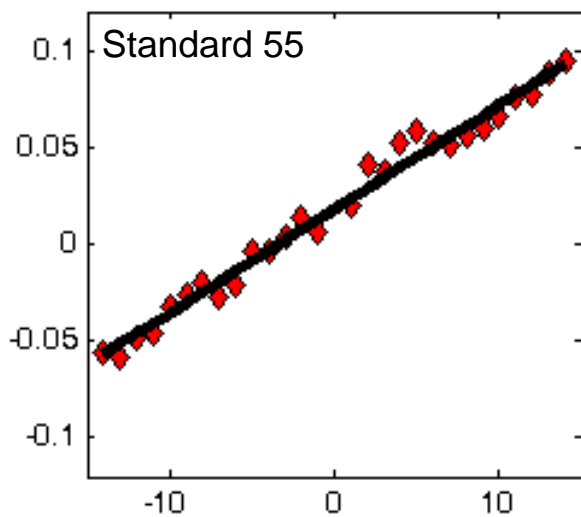
## Non-symbolic comparison

## Symbolic comparison

Amount of information accumulated per unit of time



Amount of information accumulated per unit of time



## Conclusion

The number representation is profoundly different for symbolic and non-symbolic numbers:

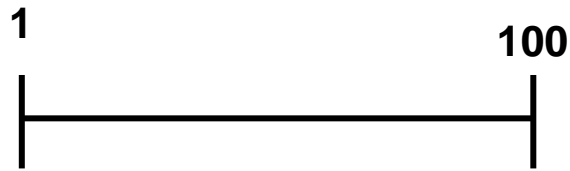
- Exact, not approximate representation
- Linear, not logarithmic representation

# Development of the linear understanding of number

(Siegler & Opfer, 2003; Siegler & Booth, 2004)

Number-Space mapping task:

« Please point to where number  $x$  should fall »



A major change occurs during mathematical education : switch from a logarithmic to a linear understanding of number

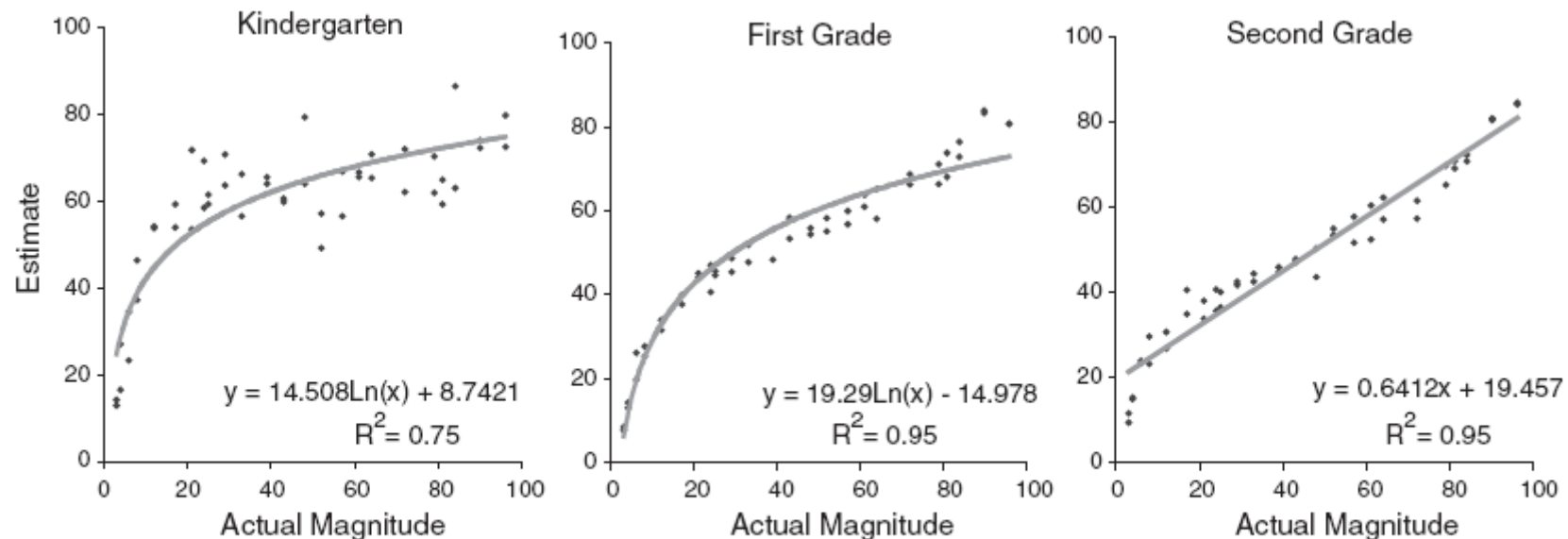


Figure 2. Progression from logarithmic pattern of median estimates among kindergartners (left panel) to linear pattern of estimates among second graders (right panel) in Experiment.



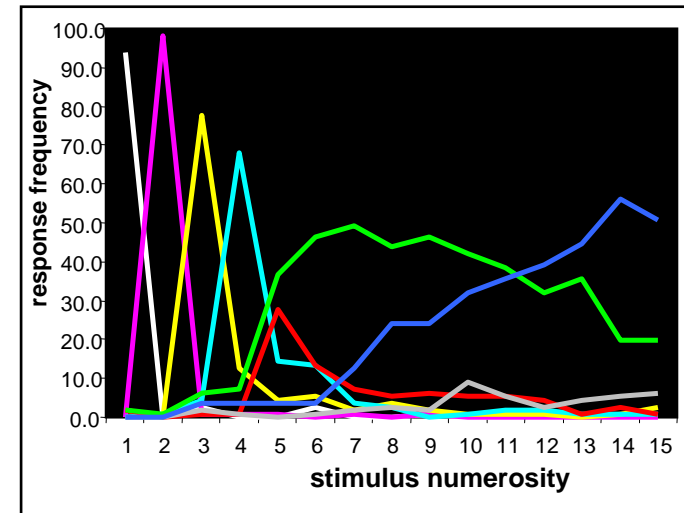
# Numerical cognition without words in the Mundurucu

Pica, Lemer, Izard, & Dehaene, Science, 2004

- pug ma = one
- xep xep = two
- ebapug = three
- ebadipdip = four
- pug pōgbi = one hand
- xep xep pōgbi = two hands
- adesu/ade gu = some, not many
- ade/ade ma = many, really many

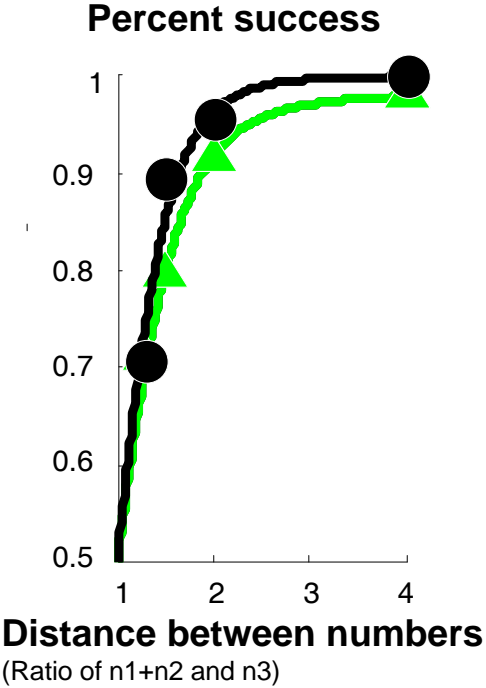
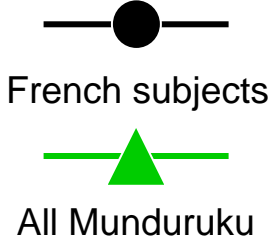
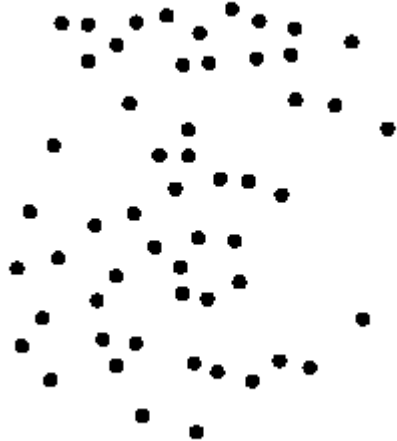
**A reduced lexicon of number words**

**Mundurucu number words refer to approximate numerosity**



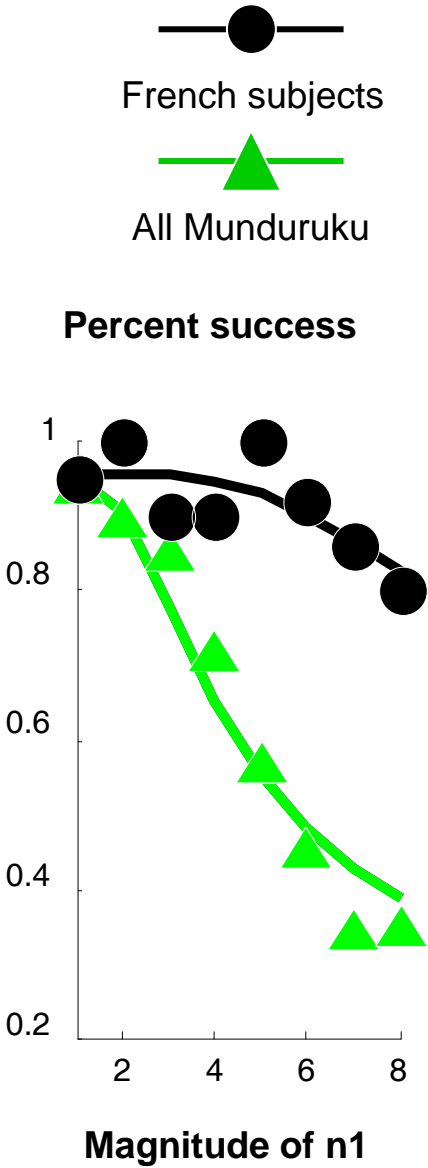
**Mundurucu adults and children can do approximate arithmetic with non-verbal numerosities (e.g.  $40+30$  is larger than  $50$ ) but not exact arithmetic (e.g.  $7-6=1$ )**

# Success in approximate addition and comparison





# Failure in exact subtraction of small quantities



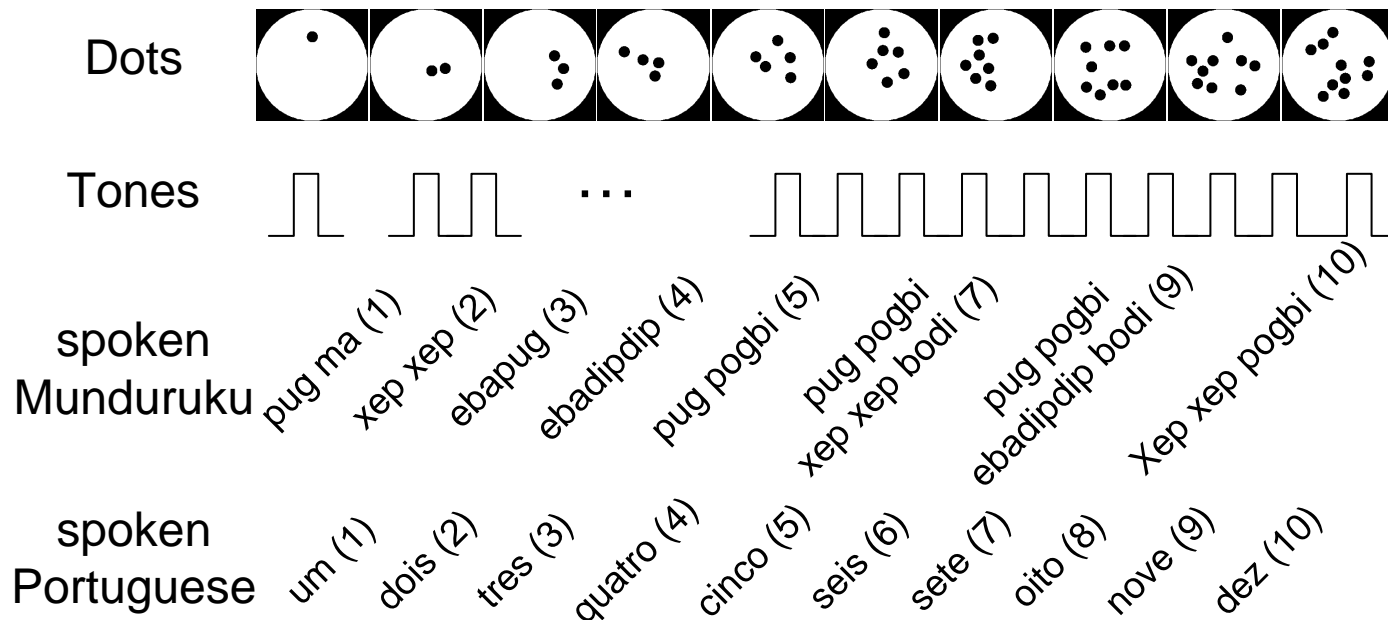
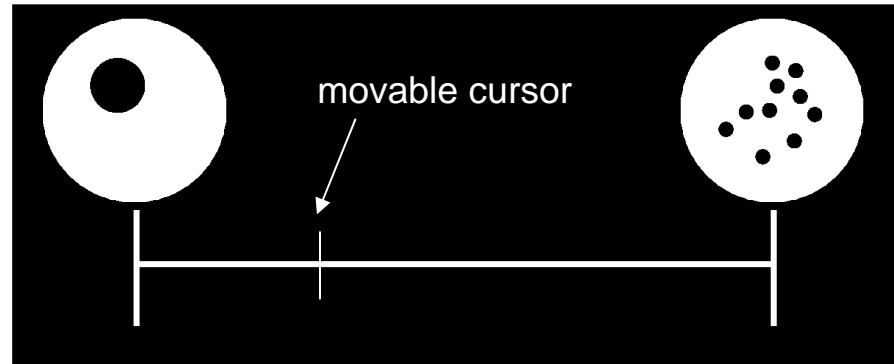
## A trace of approximate number sense in Mundurucu sculpture?

In this Mundurucu necklace, two miniature hands (out of 35) only have three fingers!



# Number-Space mapping in the Mundurucu

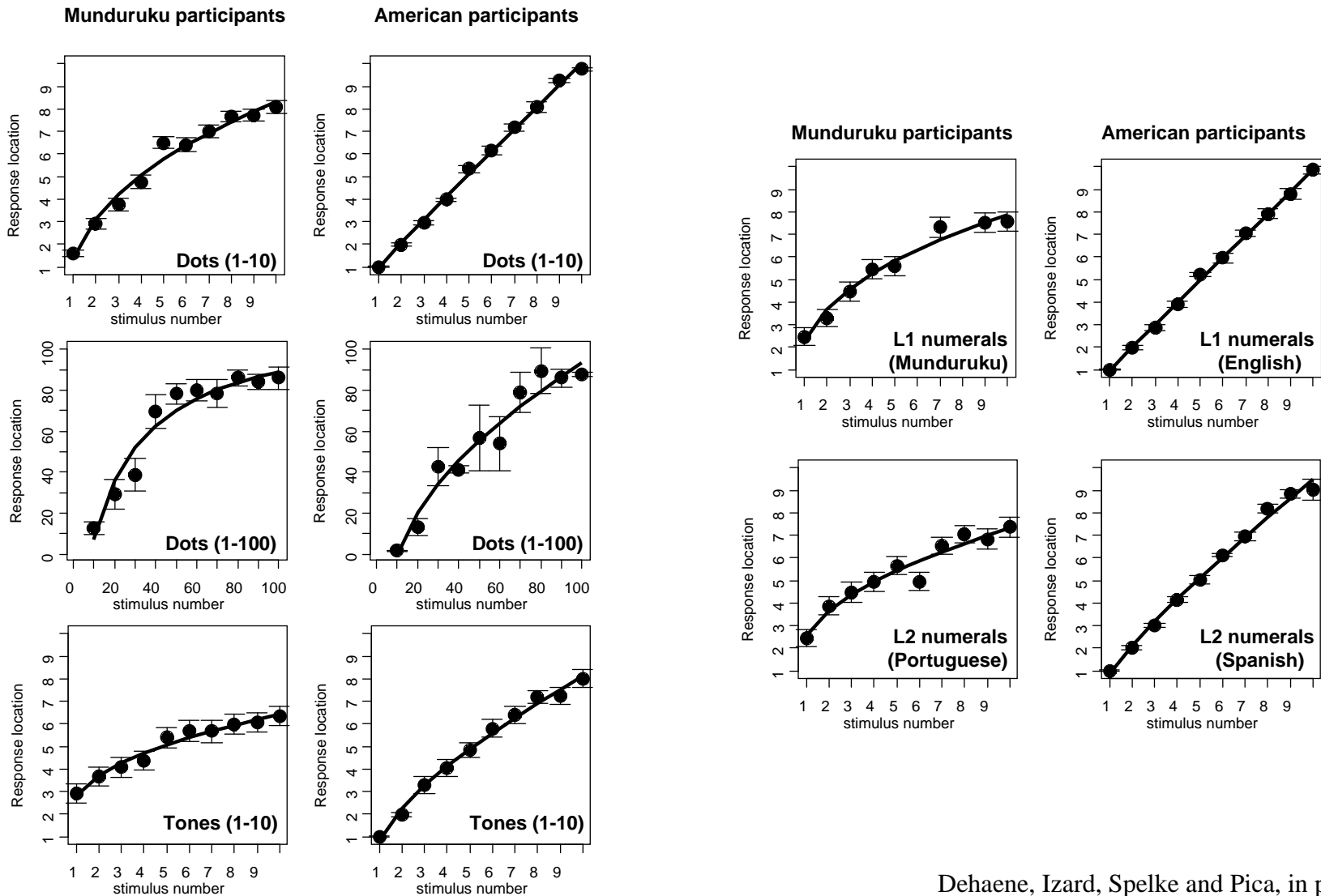
Mundurucu children and adults were asked to point to the location corresponding to a certain number. Would they show a compressive mapping even in adults? And for numbers as small as 1-10?



# Logarithmic Number-Space mapping in the Mundurucu

Mundurucu children and adults show a compressive mapping

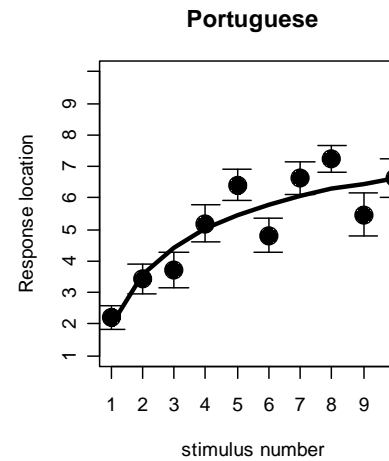
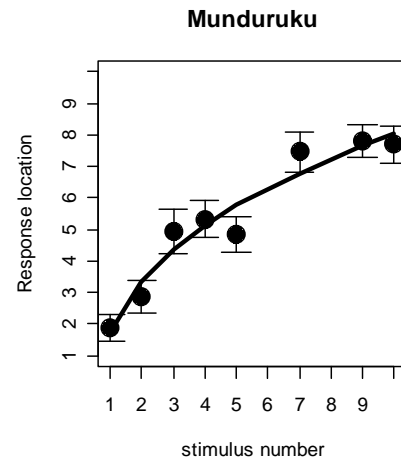
- For dot patterns or series of 1-10 tones
- For Mundurucu words and even for Portuguese numerals



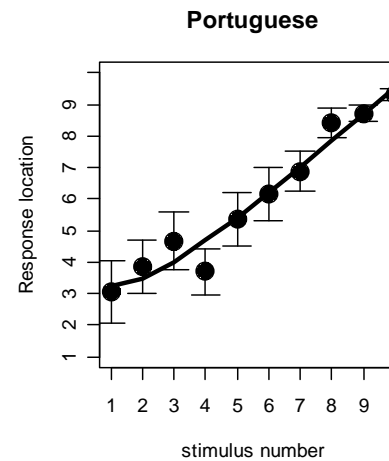
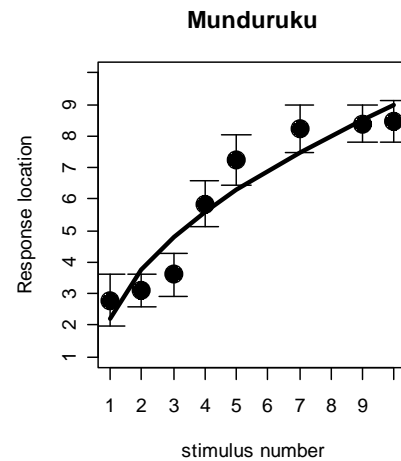
# Effect of education on log versus linear responding in Portuguese, but not in Mundurucu

Mundurucu participants only

Very little education

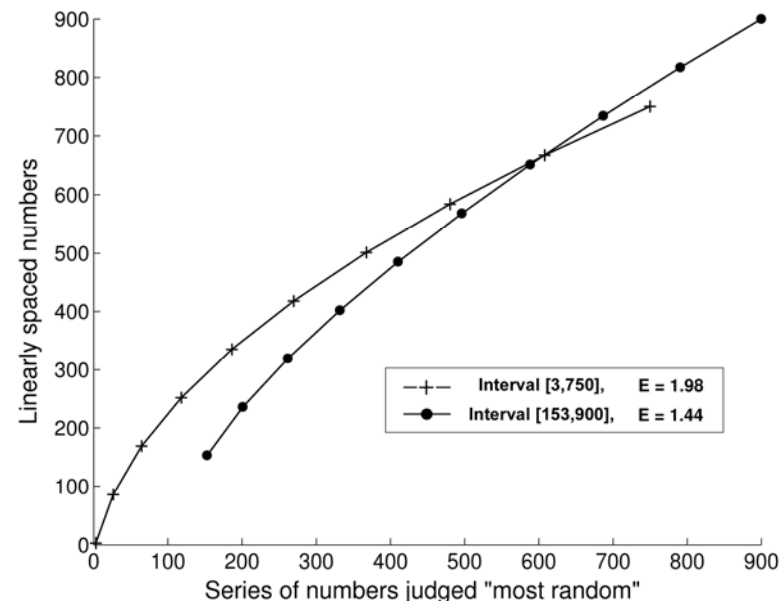
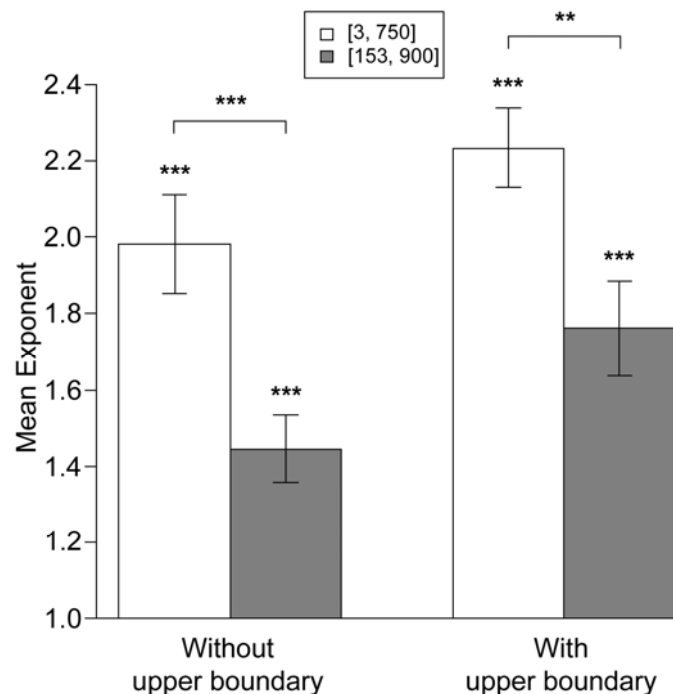


More education



# A logarithmic representation of number words remains dormant in educated adults

- For very large numbers: what's in the middle of « one thousand » and « one billion »?
- For smaller numbers : bias in judgement of random sequences (Banks & Coleman, 1981):
  - We asked subjects to listen to random sequences of number words and rate whether each sequence comprised « more small numbers » or « more large numbers »
  - In fact, sequences were generated by a power law whose exponent varied according to a staircase procedure
  - The indifference point does not correspond to a linear sequence, but to a compressed sequence with (objectively) more small numbers, as if sampling uniformly from a compressed scale.
  - This result is very robust and resists number-space training or exposure to linear sequences



# Plan of the talk

- Neural coding of numerosity
  - A quantity code is present in the intraparietal area of human adults and babies
  - Optimal decision mechanisms based on this code can explain human psychophysics
- Understanding of number symbols
  - Symbols are mapped onto numerosities
  - However, the numerosity code may be changed by learning symbols
  - Linear mapping of number onto space
- Brain mechanisms of number-space mappings

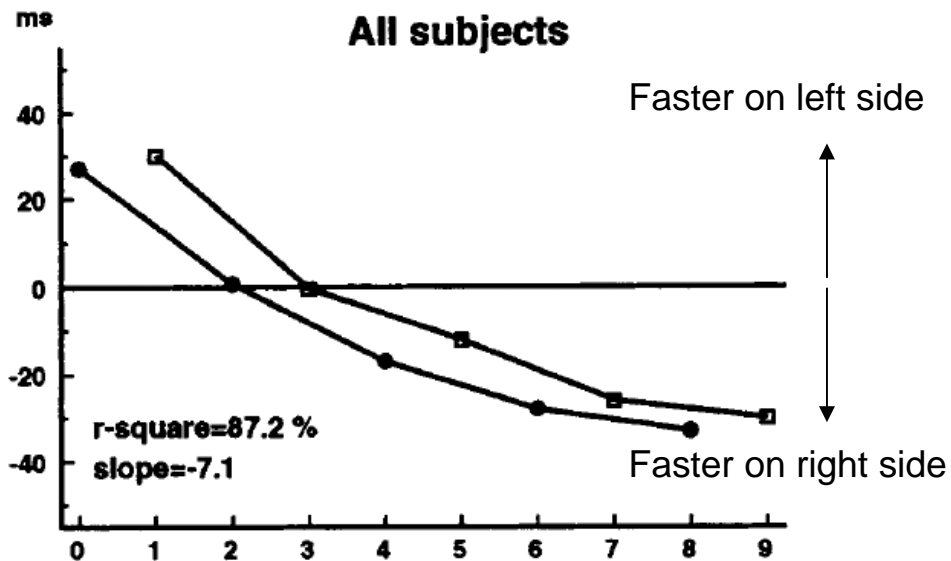
# Behavioral evidence for interactions between Number and Space

Spatial-Numerical Association of Response Codes

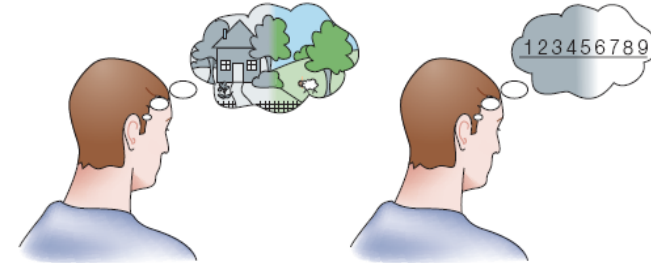
= SNARC effect

(Dehaene et al., 1993)

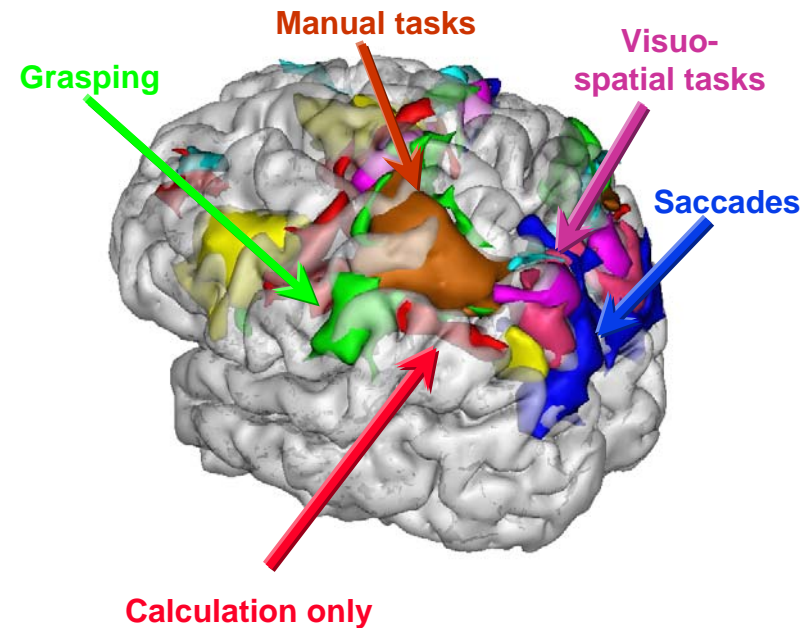
RT(right key) minus RT(left key)



Hemispatial neglect in numerical bisection task (Zorzi et al., 2002)



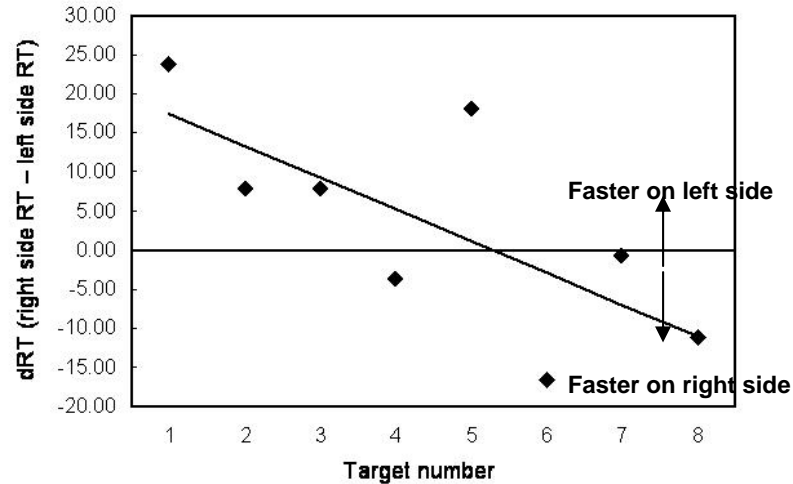
Might these effects arise from parietal cross-activation?





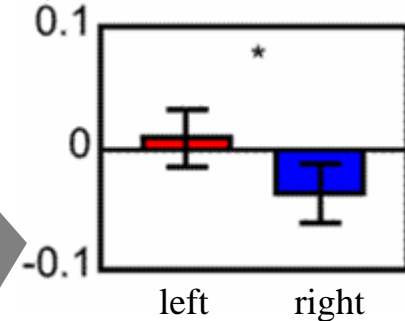
# Brain mechanisms of Spatial-Numerical Association (SNARC): an fMRI experiment

Parity judgement  
with variable mappings  
+ calculation  
+ saccades

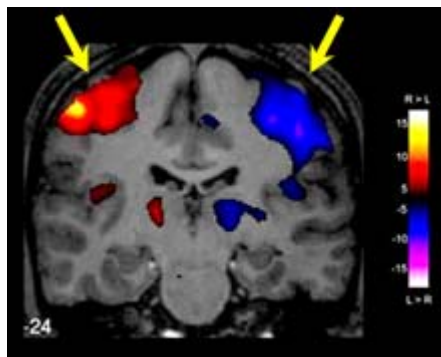


**Cross-talk from the number code in the intraparietal sulcus to the spatial code in area LIP may explain the SNARC effect**

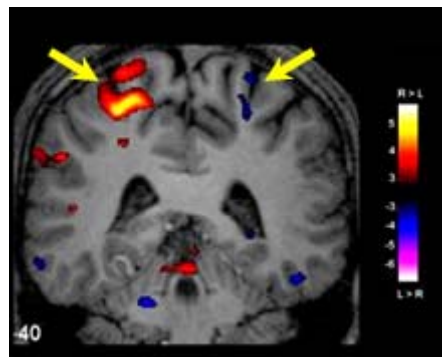
Large - small numbers contrast



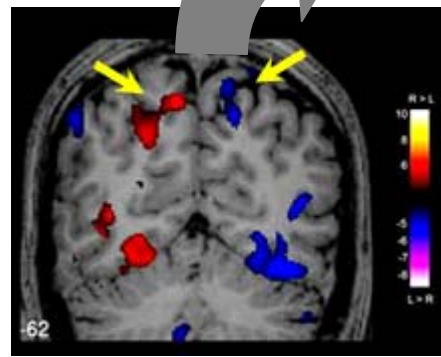
Three different intraparietal regions for spatial direction of



Hands (anterior)

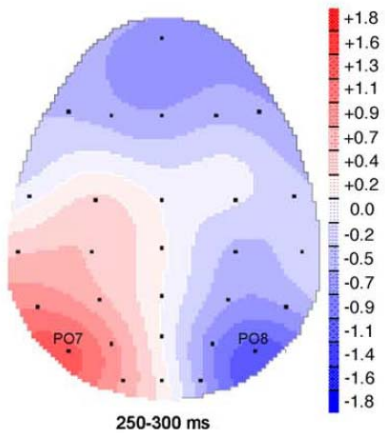


Space (middle)

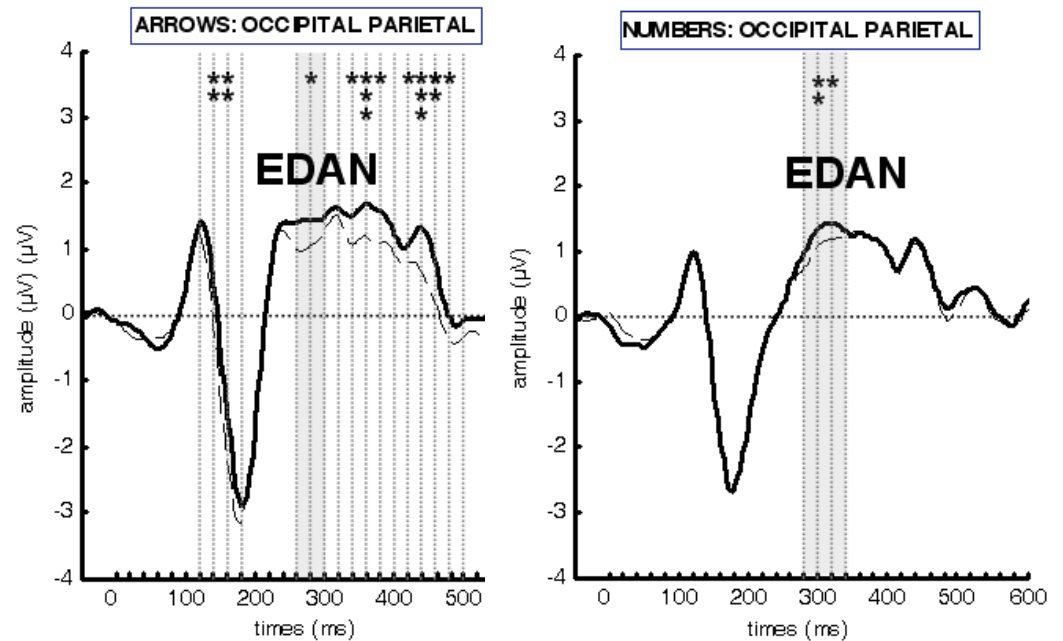
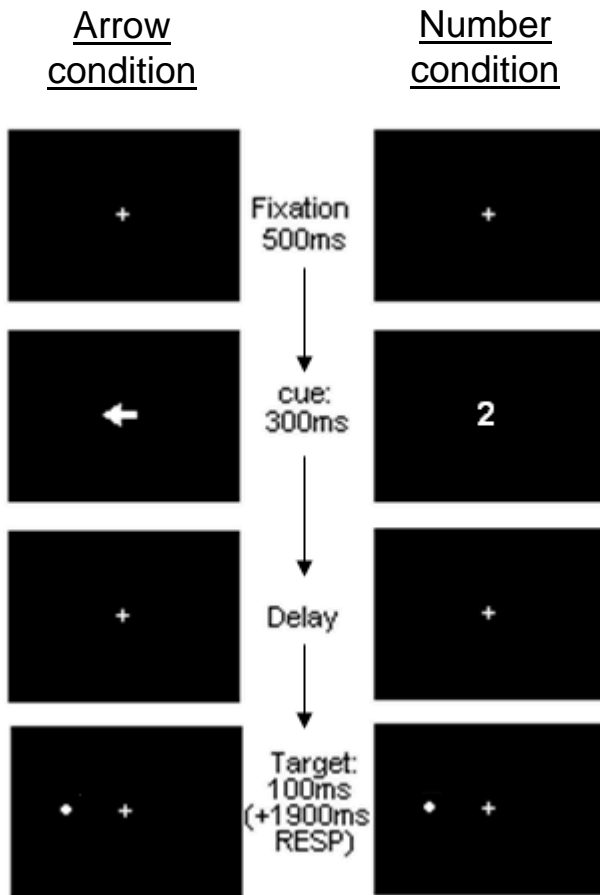


Saccades (posterior)

# Do numbers elicit automatic shifts of spatial attention? An ERP study



- The EDAN waveform indexes a lateralized orientation of spatial attention (~300 ms after a cue)
- Would an EDAN be elicited by irrelevant numbers?
- Task: detect a small dot (left or right of fixation) preceded by a non-informative arrow or number



« Ipsilateral » arrows or numbers  
 induce a greater positivity than  
 « Contralateral » arrows or numbers

Ranzini, Hubbard & Dehaene, in preparation

# Conclusions: from animal number sense to human arithmetic

- All humans start in life with an **elementary number sense** based upon populations of **number neurons in the intraparietal sulcus**.
- **Number symbols** probably acquire their meaning by linking neural populations coding symbol shapes to those coding for nonsymbolic numerical quantities (a physical solution to the « grounding problem »)
- The acquisition of number symbols **profoundly transforms** the number system
  - We develop an **exact representation of large numbers**
  - We move from a **logarithmic** to a **linear** representation of numbers
  - These two changes may happen in **left parietal cortex**
  - **Cross-talk with posterior parietal cortex** may explain our intuition that numbers map onto space, a metaphor that plays an essential in higher mathematics.