

Beyond the number domain

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In a world without numbers, we would be unable to build a skyscraper, hold a national election, plan a wedding or pay for a chicken at the market. The numerical symbols used in all these behaviors build on the approximate number system (ANS) which represents the number of discrete objects or events as a continuous mental magnitude. Here, we first discuss evidence that the ANS bears a set of behavioral and brain signatures that are universally displayed across animal species, human cultures and development. We then turn to the question of whether the ANS constitutes a specialized cognitive and neural domain – a question central to understanding how this system works, the nature of its evolutionary and developmental trajectory and its physical instantiation in the brain.

Universality and domain-specificity

The case that the approximate number system (ANS) is cognitively universal is based on four sources of evidence: cognitive development [1,2], comparative cognition [3–5], cross-cultural cognition [6] and neurobiology [7–9]. Collectively, these four types of evidence have established a case for a culturally, developmentally and evolutionarily universal system for representing 'numbers' as mental magnitudes. Less clear, however, is whether the neural system supporting the ANS is exclusive for numerical representation.

Numerical cognition is often considered to be a quintessential cognitive domain [5,7–11]. What constitutes a cognitive 'domain', however, remains controversial. Most would agree that a domain defines a set of specialized (although not necessarily modular) processing mechanisms that become engaged only when presented with particular types of information [12]. In addition, domain-specific cognitive faculties are typically hypothesized to require specialized neural architecture [13]. The degree to which numerical cognition satisfies either of these criteria of domain-specificity is currently unresolved [14–16].

In what follows, we discuss evidence supporting the developmental and evolutionary primacy of the ANS. We then weigh evidence for and against the idea that there are unique behavioral and neural signatures for approximate numerical processing. In particular, we consider whether non-numerical magnitudes such as time, size, ordinal position and brightness recruit the same cognitive and neural machinery as numerical magnitudes. Endorsing and extending prior reviews [17,18], we conclude that

the cognitive and neural systems mediating the ANS are largely co-extensive with those mediating other types of quantitative judgments, thereby calling into question the notion of a domain-specific system devoted to numerical processing.

A primitive system for representing 'number'

The primary behavioral signature of the ANS is Weber's law (Box 1), which holds universally across species, human development and human cultures [1,2,8,9]. For example, when monkeys and college students are tested in the same numerosity comparison and addition tasks, Weber's law similarly predicts their performance [4,19] (Figure 1). Moreover, numerical discrimination in infancy is reliably predicted by numerical ratio [20,21], indicating that the behavioral signatures of the ANS emerge within the first year of human life. Finally, Amazonian peoples without verbal counting systems show ratio dependence when comparing relative numerosity, despite the lack of an exact appreciation for large numerical quantities [6]. Ratio-dependent nonverbal number discrimination, evident across species, cultures and development, indicates a universal analog mental code for representing number approximately.

Neurobiological studies of the ANS in adult humans have yielded a highly reproducible set of brain areas that contribute to numerical cognition. Specifically, regions of the parietal cortex along the intraparietal sulcus (IPS) seem critical for approximate numerical cognition. Patients with parietal lesions can be impaired in making numerical judgments (Figure 2), whereas other cognitive abilities remain normal [8,9,22,23]. Furthermore, studies of patients with semantic dementia (and anterior temporal lobe atrophy) have shown that numerical skills can be spared in cases in which other semantically demanding tasks such as picture categorization or picture naming are impaired [24]. Approximate numerical judgments, thus, require an intact parietal lobe, and doubly dissociate from other types of semantic judgments, which require temporal lobe processing. Human neuroimaging studies converge with the neuropsychological evidence and implicate the IPS specifically, and parietal cortex more generally, in numerical processing [8,9]. In adulthood, the IPS shows a ratio-dependent blood-oxygen-level-dependent (BOLD) response to numerical stimuli [25,26] and is more engaged during numerical processing than shape and color judgments [27].

Adult-like neural signatures of approximate numerical processing emerge as early as four years of age in children

Box 1. Analog representation of approximate number

Weber's law states that the difference in intensity needed to discriminate two stimuli is proportional to their objective intensities or, $\Delta I/I=k$, where I is stimulus intensity and k is a constant that signifies the resulting sensitivity to changes (or differences) in stimulus intensity. Under Weber's law, discrimination performance is modulated by the ratio of the intensities rather than their absolute difference.

Weber's law adequately predicts performance on numerical tasks but it does not address the initial process that translates a set of objects into a numerical representation. Currently, two competing models attempt to explain the process of forming an approximate numerical representation. In the mode-control model [40], an accumulator is serially incremented by a constant amount for each object or event, and the accumulated signal indexes the total number of objects or events in the set. A second model [100] invokes a parallel summation mechanism in which the objects in a set are detected in parallel and passed to a summation stage that accumulates signals across the object detection stage, ultimately indexing the total number of objects in the set. In their accumulation stages, both models postulate that objective, discrete numerical value is analogically translated into a continuous subjective representation of numerical value or an analog magnitude representation.

who are not yet proficient verbal counters [14,28]. Moreover, measurements of stimulus-evoked electrical activity on the scalp (event-related potentials [ERPs]) indicate that these signatures develop even earlier, within the first months of life [29,30]. In short, although there are probably developmental changes in the neural processes underlying the ANS, the IPS seems to be involved throughout development.

In parallel, neurophysiological studies in monkeys have identified populations of neurons in parietal cortex that are sensitive to the cardinal value of elements in a visual array or sequence of elements [31–34] or the number of times an action is performed [35]. This line of research indicates that ventral intraparietal (VIP) neurons might provide a numerical 'readout' of accumulated sets of objects, events or actions. A recent neurophysiological study has demonstrated that, in contrast to the cardinal value response of VIP neurons, number-sensitive neurons in the lateral intraparietal area (LIP) respond to the number of elements in their receptive fields in a monotonic fashion, with firing rate increasing or decreasing with numerical magnitude [34]. These observations invite the hypothesis that the representation of cumulative numerical magnitude is maintained by the monotonic LIP population and translated into cardinal representations of total numerosity in VIP. Alternatively, differences in the neural responses of these two intraparietal regions could reflect differences in the behavioral or neural protocols employed in the experiments. Yet, in either case, the numerical tuning functions of neurons in VIP and LIP provide evidence of a neural foundation for the behavioral distance and magnitude effects characteristic of the ANS.

The evidence for similar numerical processes, from a diverse set of methods, populations and species, makes a strong case that the basis of numerical representation is a primitive cognitive and neural system. However, is there neural machinery dedicated to number representation that is not used for representing size, length, time or other continuous variables? For that matter, are the behavioral

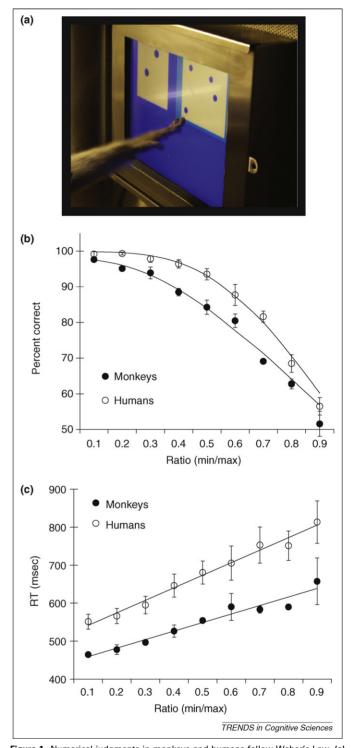


Figure 1. Numerical judgments in monkeys and humans follow Weber's Law. (a) In a recent study from our laboratory, monkeys and adults were trained to discriminate stimuli based on their best estimate of numerical value. Adults were specifically instructed to avoid verbally counting and to respond as rapidly as possible. For both groups, accuracy (b) and response times (c) were modulated by the numerical ratio between the stimuli. In addition, accuracy performance is predicted by a mathematical model of performance that adheres to Weber's law. Reprinted, with permission, from Ref. [19].

signatures of numerical judgments common to judgments of other magnitudes such as size, length or time? Here, we explore the possibility that the cognitive and neural processes involved in representing and manipulating numerical information reflect operations that are broadly

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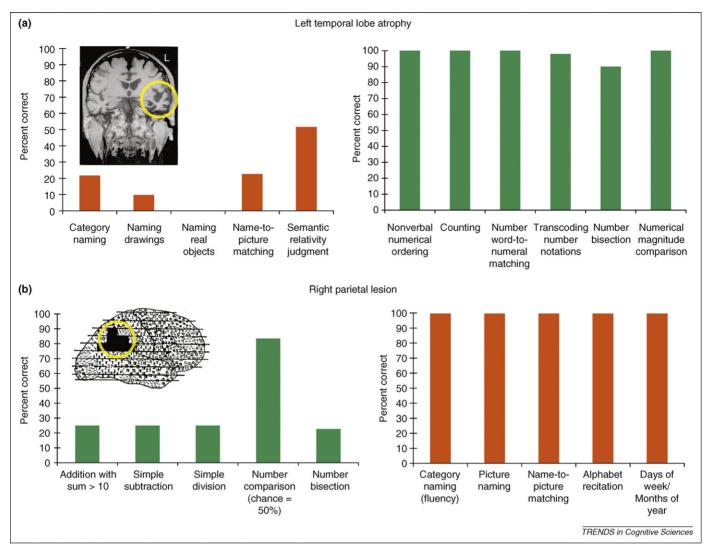


Figure 2. Brain damage reveals distinct functional localization of numerical and non-numerical semantic judgments. (a) Patients with temporal lobe atrophy can show impairments in categorization and recognition tasks involving animals, objects or letters, but be unimpaired on tasks requiring numerical computation, recognition and counting. (b) By contrast, patients with right parietal lesions can be impaired at tasks involving mathematical operations such as addition, subtraction, number comparison and bisection, but be unimpaired in categorization and recognition of non-numerical stimuli. Drawn, with permission, from Refs [23,24].

available for processing other types of quantitative information.

Cognitive similarities between number and other magnitudes

Magnitude judgments are those that invoke questions such as 'Which is more?' or 'Which is bigger?' Judgments of this nature can be applied to size, length, time, loudness, number or any uni-dimensional property of an object or set. In fact, several cognitive signatures of magnitude processing are common to numbers and many other quantitative dimensions. The shared cognitive signatures of quantitative judgments implicate both a common mental code for quantitative representation and a common mental comparison process for judging their magnitude.

Despite the prevalent view that numerical cognition operates within its own domain [5,7–11], the notion of a generalized magnitude system for representing number and non-numerical quantities is not new [1,17,18,36–43]. For example, Walsh [17] synthesized the behavioral and neurobiological evidence that time, space and number

share common processing mechanisms and proposed that they are linked to guide action because the computations necessary to determine the spatial location of an object depend crucially on quantitative computations such as 'how far', 'how many' and 'how long.' According to Walsh's [17] account, mental magnitudes are bound to one another through the computational demands of the motor control system.

One possible point of convergence in the cognitive processing of mental magnitudes is in the format of their underlying mental code. Psychophysical data collected over the past two centuries demonstrate that Weber's law characterizes a wide variety of magnitude judgments [36,37,40]. Beyond numerosity, time and spatial extent, Weber's law characterizes judgments of loudness, pitch, warmth, weight, brightness, perceived difficulty and many other continua. We can infer from Weber's law that the psychological format of these quantities takes the form of an analog magnitude (Box 1). Moreover, if these quantities share a common representational format, we might expect that mental transformations across quantitative dimen-

sions are feasible. Indeed, humans are facile at measuring one magnitude as a function of another magnitude; adults can measure brightness in terms of handgrip pressure, line length, number or loudness [44], providing evidence of a translational mechanism between quantitative representations.

Representations of time and number in particular have long been hypothesized to originate from a common representational system. A seminal study by Meck and Church [40] shows that rats can simultaneously estimate time and number and their estimates of these quantities shift to the same degree when they are administered methamphetamine. Since the Meck and Church [40] study, a great deal of work has revealed parallel sensitivity for time and number discrimination in non-human animals and adult humans [40,45,46].

Beyond time and number, dual representation studies testing the simultaneous quantitative representation of dimensions such as size, brightness and angle also have reported parallel cognitive effects (e.g. interference) among distinct quantities [47–50]. The overall implication is that a common analog magnitude code underlies a wide variety of quantitative representations, thereby causing these representations to interact during simultaneous judgments.

Commonalities in an underlying mental code might also underlie the well-established link between quantitative and 1D spatial representations [51]. Adult humans seem to intrinsically map numerical representations onto a unidimensional spatial mental number line [18]. This spatial mapping of number has been termed the spatial-numerical association in response code (SNARC). However, beyond number-space relations, other research has demonstrated spatial mappings of non-numerical quantitative information such as pitch and ordinal position [43,52,53]. Furthermore, some evidence indicates that ordinal positions in arbitrary lists can be encoded as analog magnitudes [42,54]. One possibility, then, is that 1D spatial representations and magnitude representations interact because they are encoded in a common analog mental currency.

Neuropsychological studies provide further evidence that multiple quantities share cognitive representations. [55]. Patients who neglect the left side of space similarly neglect the left side of the mental number line. When the same patients are asked to indicate the spatial or numerical mid-point of two anchor values, their answers systematically shift in the same direction. A similar finding has been reported for left neglect patients on an interval timing bisection task [17,56]. Moreover, a recent study of color-number synaesthetes shows that the irrepressible perceptual bond that synaesthetes experience between specific colors and numbers can be explained by a systematic association between numerical magnitude and luminance intensity [57]. Thus, non-idiosyncratic intrinsic associations between number and other continuous dimensions also occur, perhaps as a result of their common underlying code.

A second possible point of convergence among quantitative judgments is the mental comparison process. Dualtask studies have revealed substantial overlap in the cognitive resources used in quantitative judgments of time, size and number but considerably less overlap between quantitative and non-quantitative tasks such as color or shape judgments, rotary tracking, phonological memory and visuo-spatial search [17,47,58,59]. Studies of this nature support the idea that global cognitive resources are shared to a greater degree among quantitative judgments than between quantitative and non-quantitative judgments. A common mental comparison process could be a cognitive source of these dual-task interference effects.

Several studies have examined the algorithm underlying magnitude comparison [38,39,60-62]. Rather than focusing on the mental currency or global resources of quantitative representations, these studies have examined the computations necessary to relate mental magnitudes to one another along a continuum. The mechanisms that mediate magnitude comparisons are hypothesized to operate on analog magnitude representations like those described for numerical values. The dominant theory of the cognitive processes underlying magnitude comparisons asserts that reference points of extreme values (i.e. the smallest and largest values) are used as anchors for comparisons along a given continuum. Each pair of stimuli encountered is compared to the reference points to determine which of the pair is closer to the smaller end, in the case of 'Which is smaller?', or closer to the larger end, for 'Which is larger?'. Response time in the decision process is determined by evidence accrual towards the target end of the continuum.

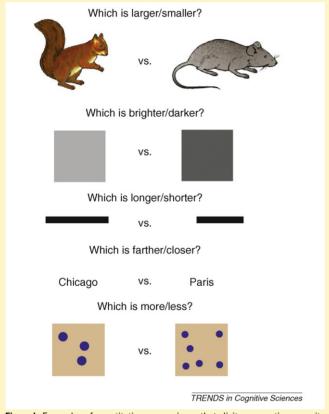
The primary evidence for the reference-point model of magnitude comparison is the semantic congruity effect (Box 2), which is observed when adult humans compare numerical values [60]. Semantic congruity effects, however, are not unique to the numerical domain and are instead found when a wide variety of stimuli are compared along a single dimension [38,39,60-62]. Additionally, the semantic congruity effect is not a uniquely human phenomenon because monkeys show semantic congruity effects for magnitude judgments [3]. The fact that a semantic congruity effect emerges in non-humans and holds for comparisons of many different uni-dimensional properties indicates that mental comparisons of numerical values recruit an evolutionarily primitive cognitive algorithm that applies to a wide variety of quantities. Together with the ubiquitous analog format of mental magnitude representations, this generalized comparison process could contribute to the common cognitive signatures of quantitative processing.

Current evidence from human developmental studies implicates similar developmental trajectories for discriminating quantities [63,64]. Infants of a given age show similar precision at representing magnitudes such as surface area, time and number [20,21,65–67] (Figure 3). Furthermore, the ratio that infants require to successfully discriminate a change in time and number systematically declines over the first year at the same rate. The degree to which judgments of different quantities overlap in infancy will have important implications for the origins of the common cognitive signatures of quantitative judgments observed in adulthood.

Box 2. The semantic congruity effect

It seems intuitive that judging whether a mouse is smaller than a squirrel should be psychologically equivalent to judging whether a squirrel is larger than a mouse. However, surprisingly, people are actually faster to report that a mouse is smaller than a squirrel than to answer that a squirrel is larger than a mouse! Conversely, people are faster to report the larger of two large animals such as an elephant and a horse. Thus, for identical stimuli, the speed of comparison depends on both the direction of the comparison and the size of the stimuli. This effect has been termed the 'semantic congruity effect'.

Semantic congruity effects emerge in performance whenever people compare two things along a single dimension (Figure I) and have been reported for judging animal size, brightness, line length, the distance between two cities, number, weight, the intelligence of animals and many other dimensions [38,39,60–62]. These findings implicate a generalized comparison process for relative judgments of quantities.



 $\textbf{Figure I.} \ \ \textbf{Examples of quantitative comparisons that elicit a semantic congruity effect.}$

Neural overlap between number and other magnitudes

Multiple sources of evidence, including neuropsychological and neuroimaging studies of humans in addition to neurophysiological studies of non-human primates, have converged on parietal cortex, particularly the IPS, as a substrate for numerical cognition. Classically, however, parietal cortex is associated with attention, visuo-spatial reasoning and the visual guidance of motor behavior [68–70]. Damage to parietal cortex can lead to hemi-spatial neglect and/or extinction in addition to an inability to use visual information to guide reaching, grasping or orienting.

Numerical cognition seems to depend on many of these same structures within the parietal lobe. In fact, patients with the neurological disorder Gerstmann's Syndrome

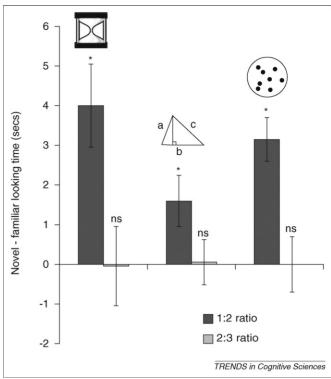


Figure 3. Infants can discriminate multiple quantities. Six-month-old infants show similar sensitivity to discriminations to time, surface area and number. During looking-time studies testing discrimination of each of these dimensions, infants look longer at novel values when they are in a 1:2 ratio to the familiar stimuli but they do not look longer to novel stimuli presented in a 2:3 ratio to the familiar stimuli [20,65,66]. These findings indicate that infants can discriminate time, surface area and number at a 1:2 ratio but not at a 2:3 ratio. However, although at 6 months of age babies require a twofold change in number, time or surface area to detect a change. by 9 or 10 months of age a 2:3 ratio is sufficient for discrimination.

present with an array of co-morbid cognitive impairments including numerical, visuo-spatial and motor deficits [71]. However, as indicated earlier, neuropsychological and neuroimaging studies have demonstrated that the neural processes related to numerical processing can be dissociated from other forms of semantic processing [22–25,27,28] in addition to general cognitive operations such as finger and eye movements, working memory and attention (but see Ref. [72]) [25,26,28,73–76].

Although neuropsychological and neuroimaging studies have reported dissociations between numerical performance and performance during other semantic and cognitive operations, the crucial question is whether similar dissociations can be found between numerical processing and processing of other magnitudes such as brightness or size. To our knowledge, such data are not yet available from neuropsychological studies. In fact, association rather than dissociation among quantitative deficits seems more likely: the extant neuropsychological literature indicates that some neurological deficits in quantitative representation (particularly time, space and number), resulting from parietal lesions, can co-occur [17,55,56].

A few neuroimaging studies have directly compared brain responses to different types of quantitative information [15]. Collectively, these studies do not provide a compelling case for the specificity of numerical processing in the brain. For instance, Pinel and colleagues [77] compared brain responses during numerical processing with other types of quantitative processing. Subjects were given a task in which they had to judge the approximate brightness, size or numerical value of two Arabic numerals that were presented simultaneously on a computer screen. The values for each dimension were varied to equate difficulty. Under these conditions, all three tasks (brightness, size and number) activated a broad swath of the cortex along the IPS relative to baseline, and each of the three tasks evoked distance-related activations in this area. More importantly, activation associated with each task varied along adjacent segments of the IPS and only partially overlapped. Anterior portions of the horizontal segment of the IPS responded more strongly during numerical comparisons than during either of the other two types of comparisons. The authors argued that this pattern of activity reflected 'distributed but overlapping' organization of quantitative processing in the IPS.

Several other fMRI studies using a similar design have reported somewhat conflicting results [75,78–80]. None of these studies reported the same anterior–posterior organization of quantitative selectivity observed by Pinel and colleagues [77]. Taken together, observations using the same basic technique indicate substantial overlap among brightness, size and numerical representations in parietal cortex, thus raising the question of whether representation of these dimensions is truly independent at the neural level.

Additional studies have identified regions of parietal cortex that respond equally to judgments of line length, size and number [81,82]. For example, Fias and colleagues [81] demonstrated a convergence of activity in the IPS for judgments of line length, angle aperture and number. Similar findings have been reported for ordinal judgments of the positions of the letters in the alphabet [82] and the positions of arbitrarily ordered items from a memorized list [42,83]. Judgments of such ordinal, but discrete, information can also be interpreted as a magnitude judgment [54] and might be accomplished in much the same way as comparisons of numerical values.

A similar case can be made for timing judgments. Interval timing is hypothesized to recruit a widely distributed cortico-striatal circuit including the thalamus, striatum and frontal and parietal cortices [84]. Although within-subject data are necessary to determine whether neural loci are identical across tasks, similar posterior parietal regions to those reported for numerical judgments have also been implicated in judgments of time [84–90]. For example, in a functional magnetic resonance imaging (fMRI) study by Rao and colleagues [88], posterior parietal activity during the comparison of the duration of two tones was greater than during the comparison of their pitch. Consistent with this claim, patients with damage to right posterior parietal cortex can exhibit impairments in judging the relative duration of two tones but remain unimpaired in judging tone pitch [91]. Although the specific role of parietal cortex in the cortico-striatal circuit underlying interval timing is unknown, it is possible that it is important for comparisons of temporal intervals. Notably, a common feature of interval timing tasks and numerical, size, ordinal position and brightness judgment tasks described earlier is that they all require comparisons of mental magnitudes (Figure 4).

Recent neurophysiological data from non-human primates further implicate a common, evolutionarily primitive neural substrate in the representation of multiple distinct magnitudes [92]. In one study, monkeys were trained to perform a line-length matching task and a numerical matching task. During stimulus presentation or a subsequent delay, single neurons in area VIP responded selectively to visual stimuli based on their numerosity or length. Although some neurons responded only to numerosity and others only to line length, a subset of cells ($\sim 20\%$) responded to the magnitudes of both the line lengths and the numerical values. These data support a case, originally proposed by Pinel and colleagues [77], for 'distributed but overlapping' neural coding of quantitative dimensions in the IPS.

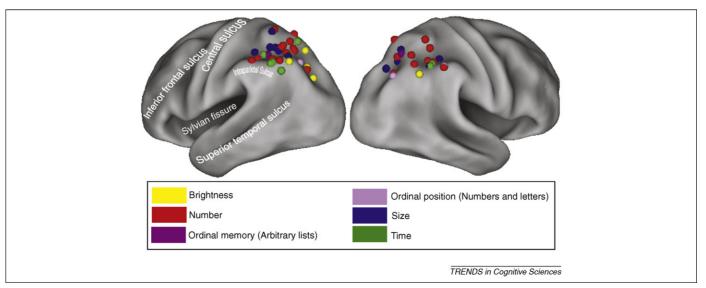


Figure 4. Activation of parietal cortex by magnitude processing. Neuroimaging studies have reported activity in parietal cortex, including regions along the IPS, in response to stimuli from a variety of magnitudes including number, size, time, brightness and ordinal position judgments. Each point on the inflated human cortical template represents peak parietal coordinates from studies of: number [26–28,73–78,80,82,97,98], time [85,87,88,90], brightness [77,78,90], size [75,78,80,81], ordinal memory [83] and ordinal position [82]. Maps generated using Caret software (http://brainmap.wustl.edu/caret; Ref. [99]).

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One implication of these results is that different quantitative dimensions can be represented by generic magnitude-coding neurons. A second implication is that, at a more global level, the IPS is recruited during judgments of quantitative dimensions beyond number alone. Finally, continuity across species in the overlapping neural representation of different quantities in parietal cortex indicates that primitive magnitude processing algorithms originate from an evolutionarily primitive neural source that is common to humans and other primates.

Conclusions

A wealth of empirical data demonstrates that numerical cognition is a primitive system that is shared with other animal species and emerges early in development. These data support the hypothesis that 'number' is a fundamental and universal cognitive capacity. Yet, several other cognitive functions for discriminating magnitudes also seem to be widely shared with other species and develop early in ontogeny. These capacities include judgments of size, time, brightness and other continuous quantities.

Our review highlights the commonalities in the cognitive and neural signatures of number and continuous magnitudes. However, one point of hesitation in ruling out the cognitive specialization of numerical processes is that the computational problem an organism faces in representing number intuitively differs from the problem of representing brightness or total surface area, for example, at least in terms of the input variables that are drawn upon. The problem of representing number requires individuating objects or events and normalizing over their non-numerical features. It, thus, seems likely that a unique set of neural processes provides the basis for the 'formation' of numerical representations even if the hardware underlying the remainder of the quantitative judgment process is generalized.

A second issue in characterizing the specificity of numerical cognition is that no region of the IPS has been consistently identified as exclusively involved in numerical processing. Nevertheless, although our review indicates little evidence for neural processes specific to numerical representation or comparison, there are at least four possibilities that would not preclude such neural specificity. Namely, the lack of evidence for distinct numerical processes could result from; (i) complete intermingling of neural populations that discretely encode numerosity and other magnitudes [77]; (ii) inter-individual variability in the regions used to represent different magnitudes that hinders identification of number-specific processes at the group level; (iii) a lack of spatial resolution necessary to identify small but spatially dissociable patches of cortex used for processing different magnitudes and, (iv) convergence of neural mechanisms of quantitative processes at a late stage in the processing stream, such as response selection. This lattermost possibility has received some support in recent fMRI and computational modeling studies [15,79,93].

Finally, much of the literature on the neural basis of numerical cognition has focused on parietal cortex [9,17]. The functional roles of other brain regions engaged by numerical tasks, such as frontal cortex, remain to be

determined [14,16,26]. A closer investigation of activity in regions outside parietal cortex could reveal different processes for different quantities. Additionally, differences among quantitative processes might also be evident in the lateralization of activity across brain regions [17]. However, across studies, a clearly defined pattern of lateralization remains elusive in quantity-related brain activity, particularly in 'number' studies.

Why might time, number, space and other continuous quantities be linked in cortex? Walsh [17] has raised the possibility that time, space and number might share resources because these dimensions each contain information that can be used to direct action. Our review, however, illustrates that continua beyond number, space and time share the same psychophysical signatures, comparison processes and neural substrate. It is unclear how the computational demands of the action system unify all of these ordinal continua.

Rather than reflecting the computational demands of the action control system, the common algorithms and neural processes underlying magnitude judgments could instead derive from a shared evolutionary heritage. For example, the processes underlying different quantitative judgments might have evolved from a single magnitude system. Under this scenario, a system that once computed one magnitude (e.g. size) could have been hi-jacked to perform judgments along a new dimension (e.g. number) [94]. Alternatively, different magnitude judgments could have evolved simultaneously and independently, but obey common principles because they are simply the most efficient [95] or the most probable [96] under the pre-existing constraints of the nervous system. Computational modeling studies can have a useful role in defining the potentially adaptive features of a common magnitude code and comparison algorithm for number and other quantities. Additionally, studies of the structure and function of quantitative abilities in developing humans and non-human animals will further illuminate convergence and divergence in the origins of different quantitative abilities in addition to the contribution of experience towards relating or delineating quantities in the mind.

In conclusion, the ANS might be best characterized as part of a broad, evolutionarily primitive domain in which all quantitative dimensions share computational mechan-

Box 3. Questions for future research

- What cognitive and neural processes distinguish numerical processing from processing related to size, brightness and other quantities at the level of the initial encoding of the representation?
- Can the magnitude representation process be psychologically and neurally distinguished from the magnitude comparison process?
- Can analyses of individual subject data in fMRI studies reveal individual differences in associations or dissociations among quantitative processes?
- What is the contribution of brain regions other than parietal cortex to approximate numerical processing?
- Do neuropsychological impairments in a variety of ordinal quantitative judgments co-occur?
- What clues can the origins of numerical processing, as revealed by human infant and non-human animal studies, provide about the cognitive and neural relationships among quantities?

isms, despite likely differences in their initial encoding processes. In this view, the characterization of the nature of numerical cognition might be best approached independently of issues of domain-specificity. New cognitive and neurobiological data are needed to better characterize the sources of the common signatures observed among distinct magnitudes such as numerosity, brightness, size and time (Box 3). Currently, the data implicate convergence of magnitude processing in parietal cortex. The challenge, then, is to discover the cognitive and neural processes underlying quantitative judgments that lead to the indisputable experience of different quantities as distinct properties.

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