

the most unknown

Axel Cleeremans

Netflix (2018), dir. Ian Cheney

-Welcome to the UK, of course. -Thank you very much, yeah.

The Most Unknown (2018) dir. Ian Cheney



Warrick Roseboom

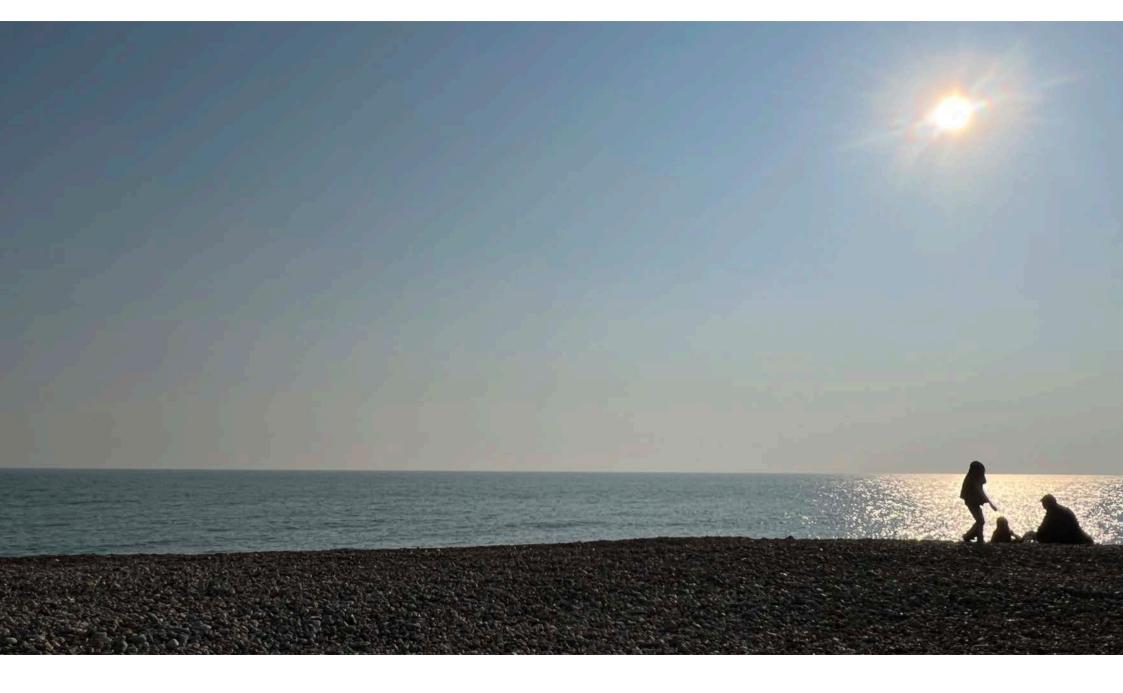


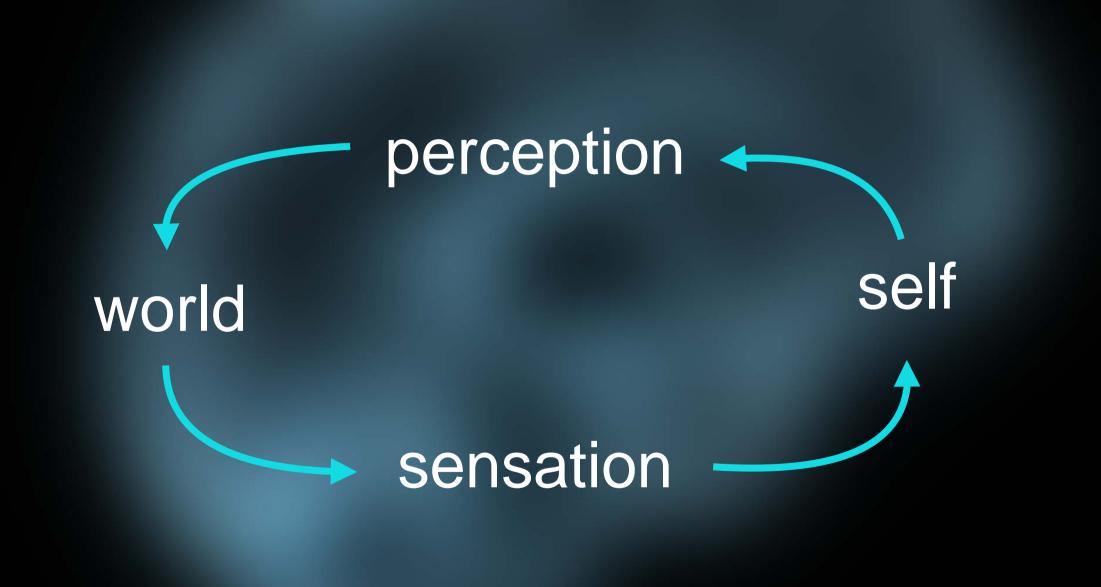
Maxine Sherman

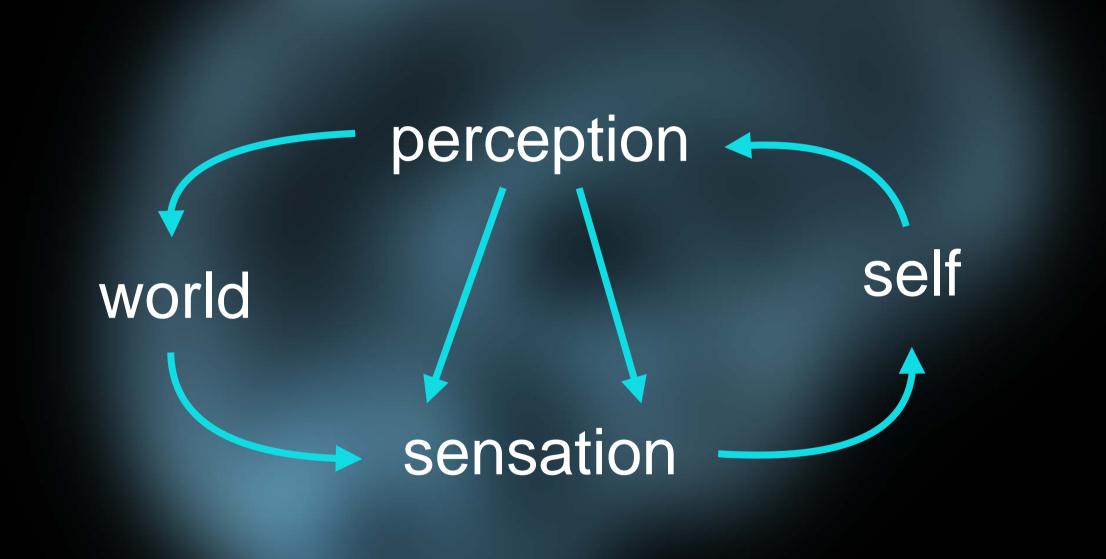


Zafeirios Fountas

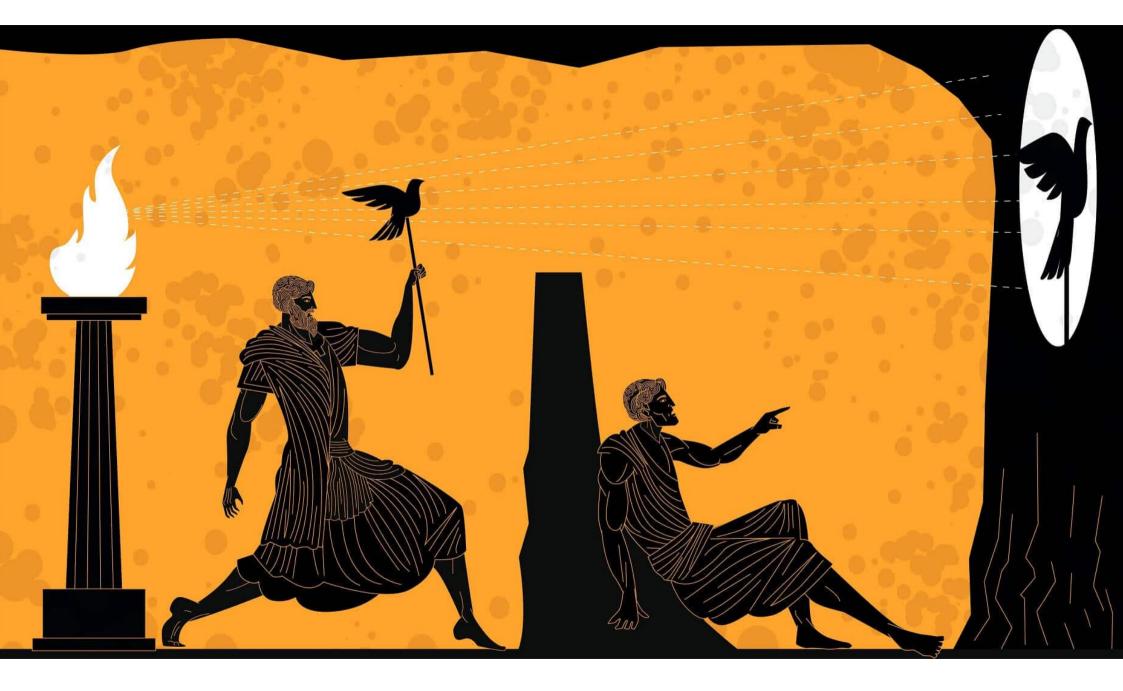
Roseboom et al (2019) *Nature Communications* Sherman et al (2022) *BioRXiv* Fountas et al (in press) *Neural Computation*

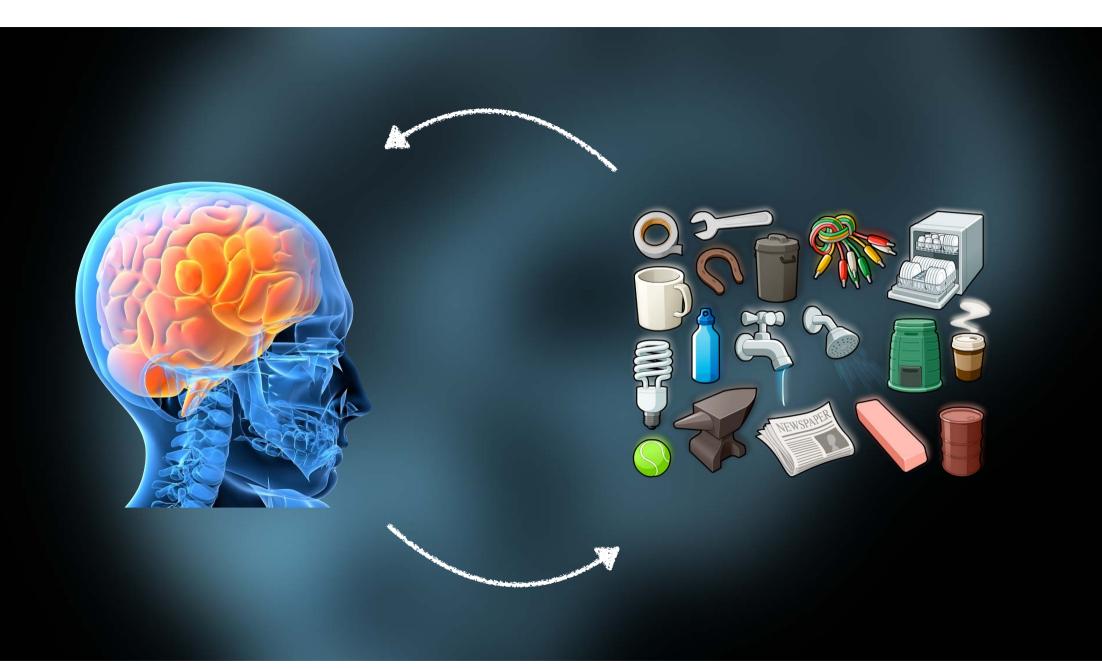






controlled hallucination

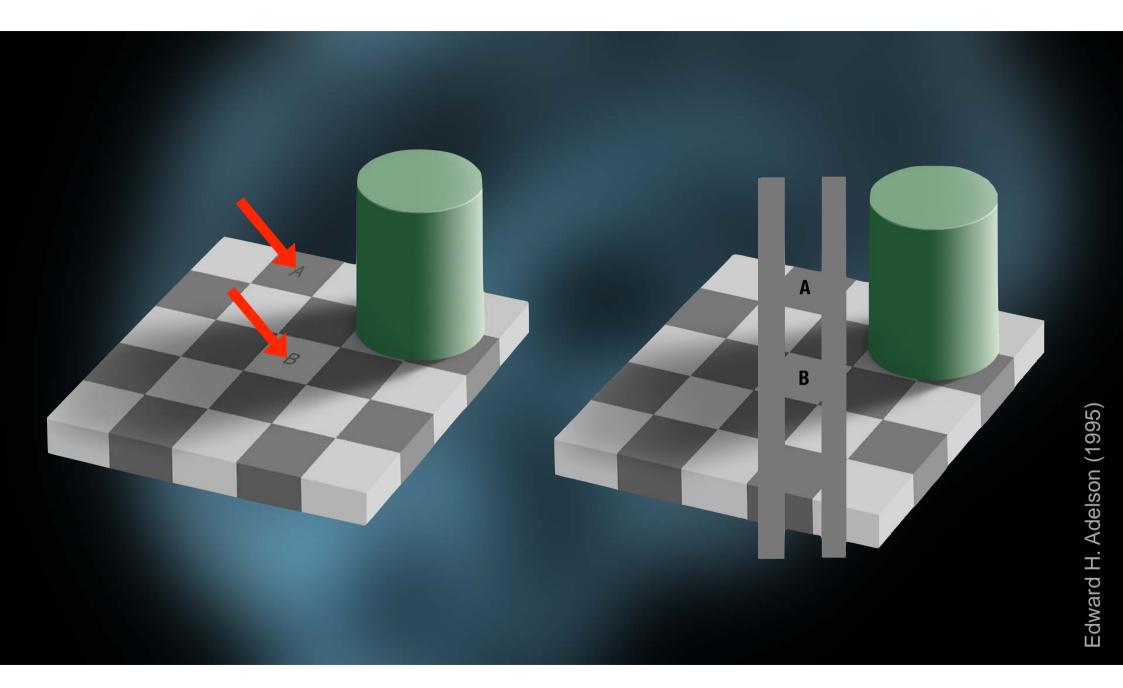




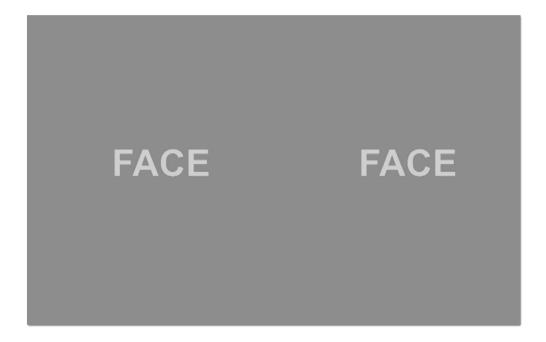
predictive processing

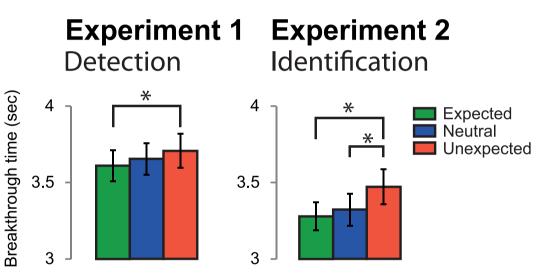
- perceptual content is conveyed by top-down predictions
- bottom-up 'sensory' signals convey prediction errors





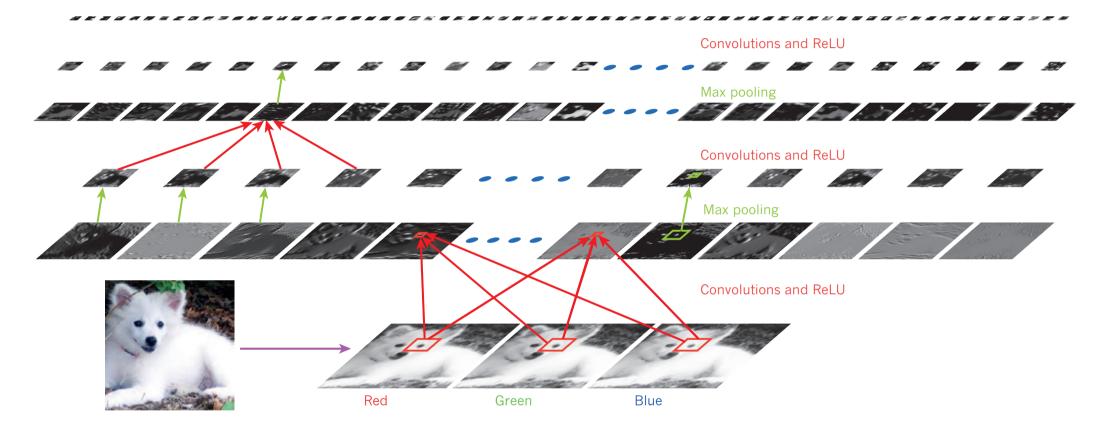
perceiving the expected







Pinto et al (2015) Journal of Vision



Le Cun et al (2015) Nature

Stud ents: Union Suzuki et al (2017) Scientific Reports

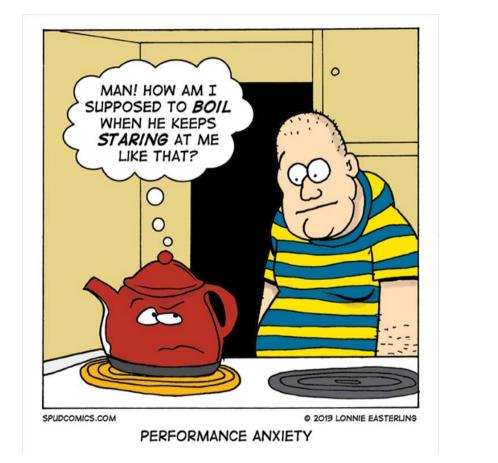
hallucination: uncontrolled perception

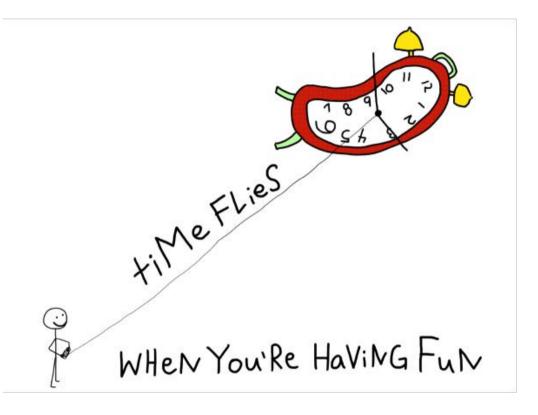
perception: controlled hallucination

taste sense me reality duration colour time sound self objecthood

taste sense me reality duration colour time sound self objecthood

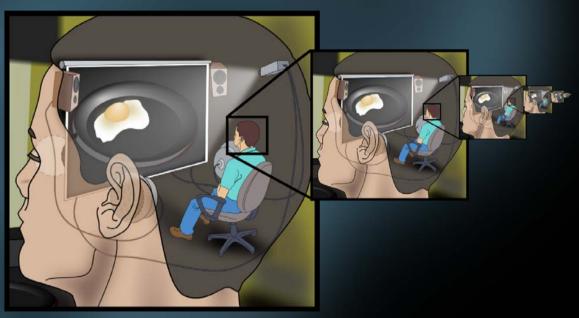
time perception

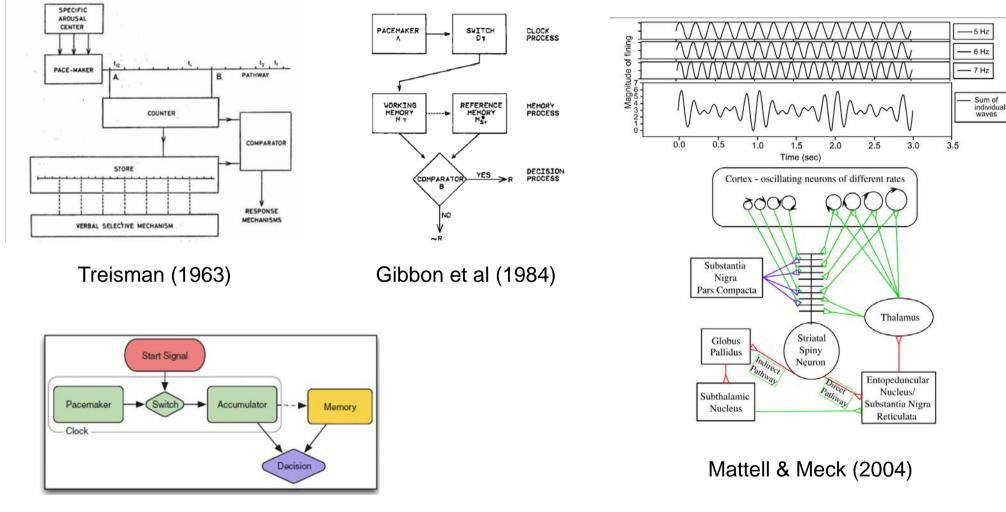




clocks in the head?







van Rijn et al (2014)

time perception

- proposal: subjective duration is based on accumulated salient perceptual change across multiple levels of processing
- not merely changes in low-level stimulus properties

Roseboom et al (2019) *Nature Communications* Sherman et al (2022) *BioRXiv* Fountas et al (in press) *Neural Computation*

study one



ARTICLE

https://doi.org/10.1038/s41467-018-08194-7 OPEN

Activity in perceptual classification networks as a basis for human subjective time perception

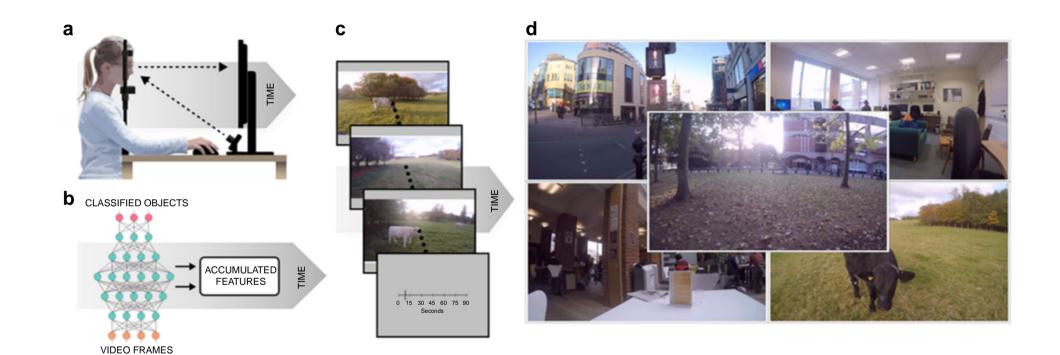
Warrick Roseboom o ^{1,2}, Zafeirios Fountas ³, Kyriacos Nikiforou ³, David Bhowmik³, Murray Shanahan^{3,4} & Anil K. Seth ^{1,2,5}

Despite being a fundamental dimension of experience, how the human brain generates the perception of time remains unknown. Here, we provide a novel explanation for how human time perception might be accomplished, based on non-temporal perceptual classification processes. To demonstrate this proposal, we build an artificial neural system centred on a feed-forward image classification network, functionally similar to human visual processing. In this system, input videos of natural scenes drive changes in network activation, and accumulation of salient changes in activation are used to estimate duration. Estimates produced by this system match human reports made about the same videos, replicating key qualitative biases, including differentiating between scenes of walking around a busy city or sitting in a cafe or office. Our approach provides a working model of duration perception from stimulus to estimation and presents a new direction for examining the foundations of this central aspect of human experience.



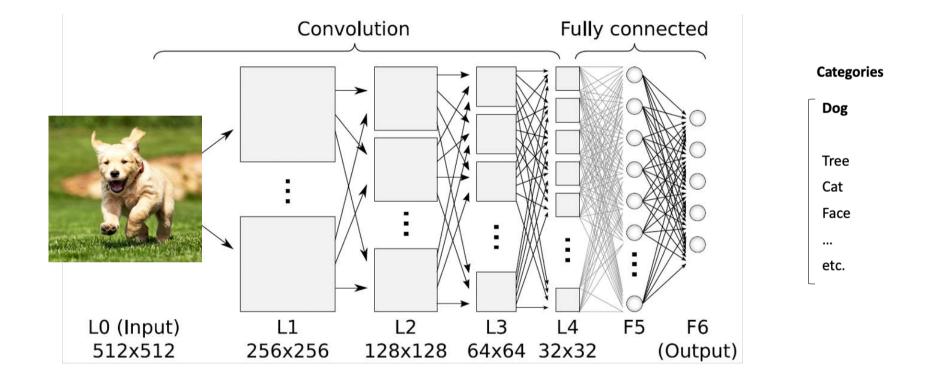
Roseboom W., Fountas, Z., Nikiforou, K., Bhowmilk, D., Shanahan, M., & Seth, A.K. (2019) Nature Communications

paradigm



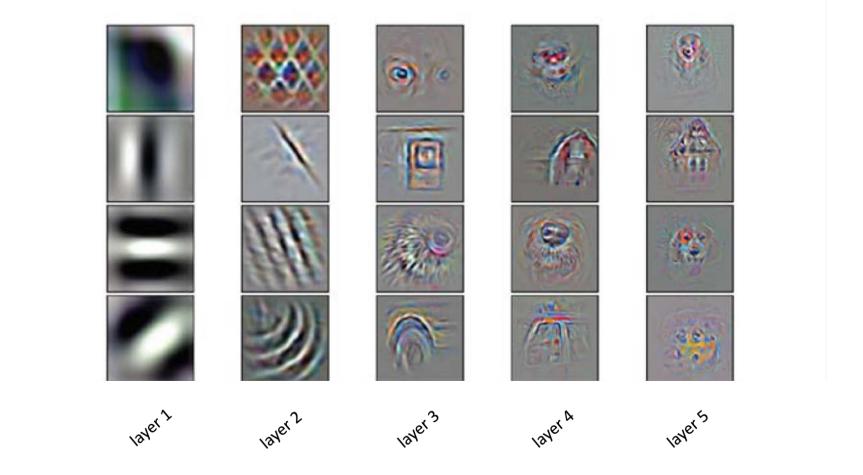
Roseboom et al (2019) Nat Comms

image classification



Le Cun et al (2015) Nature

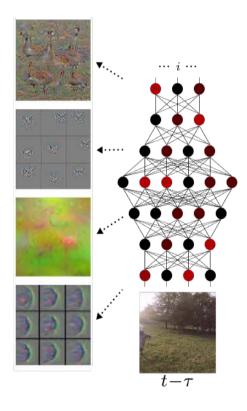
DCNN 'receptive fields'



Kriegeskorte (2015)

Guclu & van Green (2015)

computational model



Roseboom et al (2019) Nat Comms

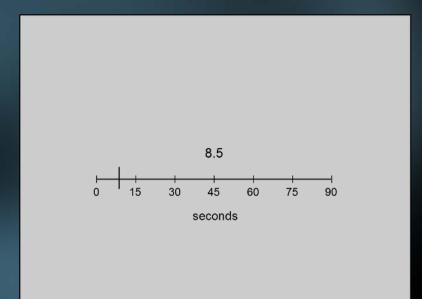
Sel 1 ð, Roseboom et al (2019) Nat Comms



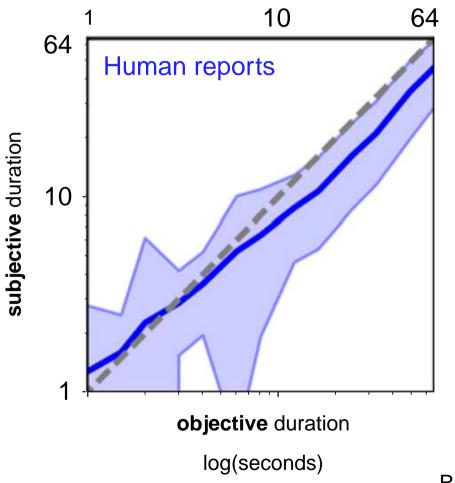


human experiment

- videos of (objective duration) 1-64 sec
- 4290 trials ~= 55 hours of data
- each participant completed up to 1 hour of trials
- eye tracking also measured

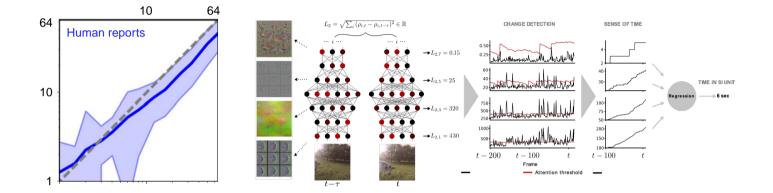


human experiment



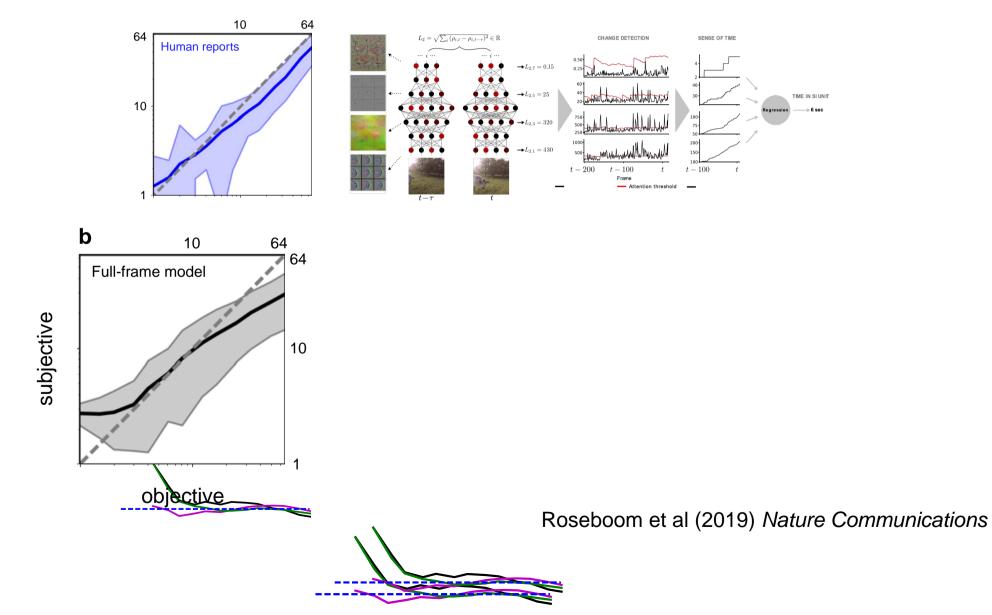
Roseboom et al (2019) Nature Communications

computational model

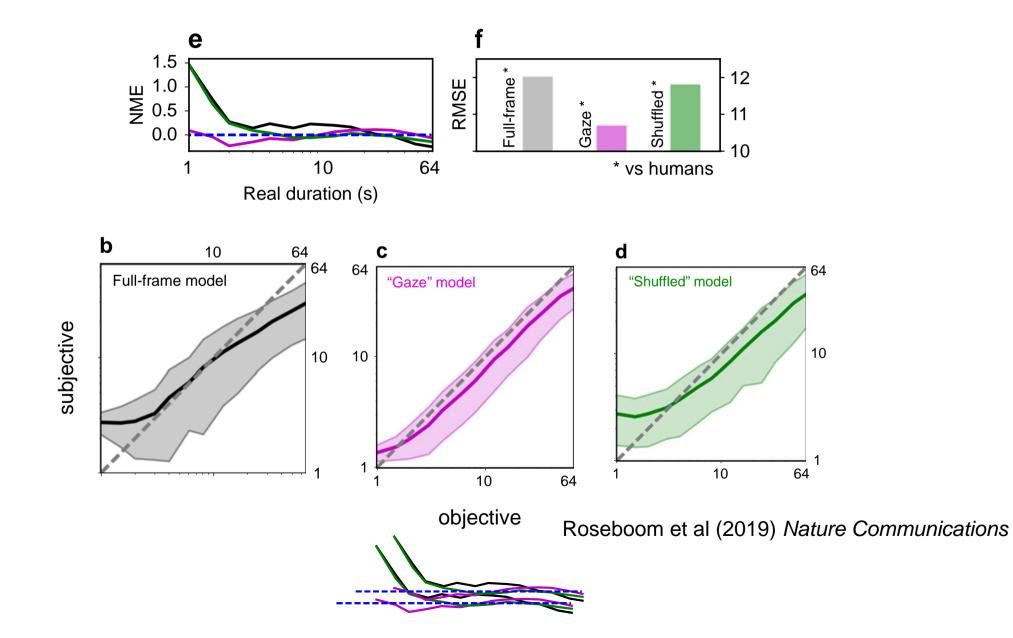


Roseboom et al (2019) Nature Communications

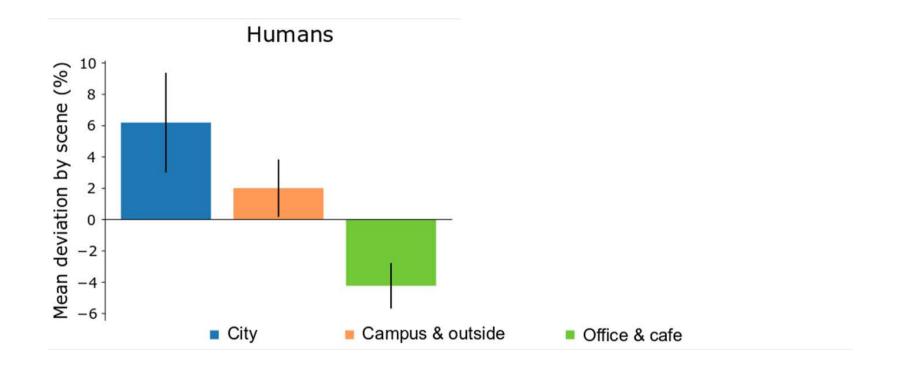
computational model



computational model



effect of context



Roseboom et al (2019) Nature Communications

study two

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bioRxiv is receiving many new papers on coronavirus SARS-CoV-2. A reminder: these a practice/health-related behavior, or be reported in news media as established informatic		en peer-reviewed. They should not be	regarded as conclusive, guide clinical	
New Results	Comment on this paper	O Previous	Next	
Accumulation of Salient Perceptual Events Predicts Subjective Time		Posted March 19, 2020.		
Maxine T. Sherman, ⁽¹⁾ Zafeirios Fountas, ⁽¹⁾ Anil K. Seth, ⁽²⁾ Warrick Rosebo doi: https://doi.org/10.1101/2020.01.09.900423 This article is a preprint and has not been certified by peer review [what does this mean of the set in the set of the		 Download PDF Data/Code Revision Summary 	 Email Share Citation Tools 	
Abstract Full Text Info/History Metrics	Preview PDF			
Abstract Human experience of time exhibits systematic, context-dependent deviations from objective clock time. For example, time is experienced differently at work than on holiday. The cognitive and neural bases of how time perception interacts with the content of experience remain unclear, and leading explanations of human time perception are not equipped to explain this interaction. We propose an alternative		Tweet If Like 0 COVID-19 SARS-CoV-2 preprints from medRxiv and bioRxiv Subject Area Neuroscience		
account of human time perception, based on the dynamics of sensory processing. Our approach naturally links content of experience with time perception through a		Subject Areas		
common foundation in basic sensory processing. We provide evidence for this		All Articles		
proposal in model-based analyses of the dynamics of perceptual processing in an		Animal Behavior and Cognition		



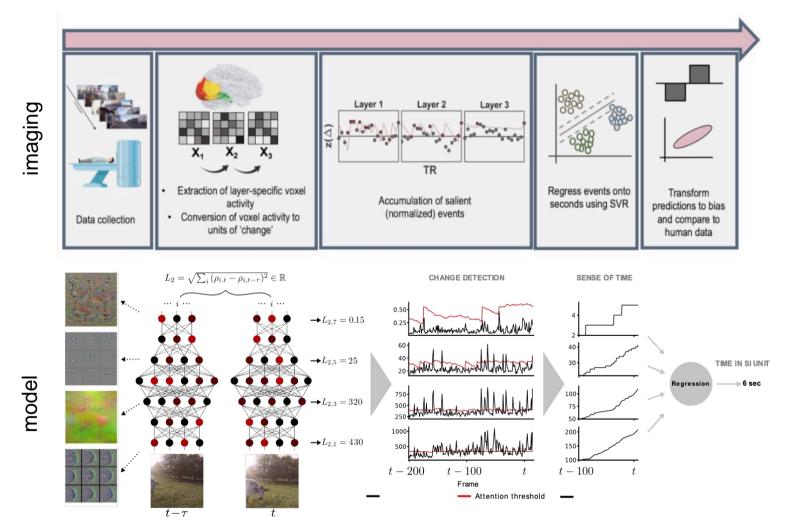
Maxine Sherman

Sherman, M., Fountas, Z., Seth, A.K., & Roseboom, W. (submitted)

imaging experiment

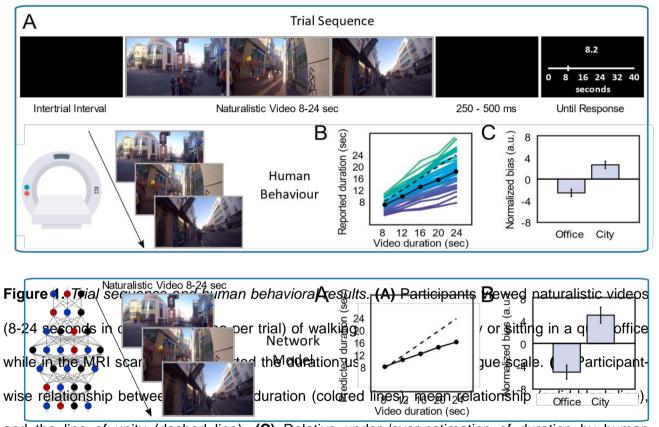
- videos of (objective duration) 8-24 sec
- city scenes and office scenes
- 40 participants
- record estimated duration and calculate scene-wise bias

neuroimaging study



Sherman et al (submitted)

behavioural results



and the line of unity (dashed line). **(C)** Relative under-/over-estimation of duration by human participants for office/city videos. Error bars represent +/- within-subject SEM.

A. Naturalistic videos and ratings scale, presented while subjects were scanned using fMRI.

B. Participant-wise relationship
between real and estimated duration,
w/ mean and (dashed) line-of-unity.
C. Relative over/under-estimation for
office vs city scenes (+/- SEM)

A. Relationship between real and model-estimate duration (with line-of-unity).

C. Relative over/under-estimation for office vs city scenes, for model

Sherman et al (submitted)

model-based fMRI

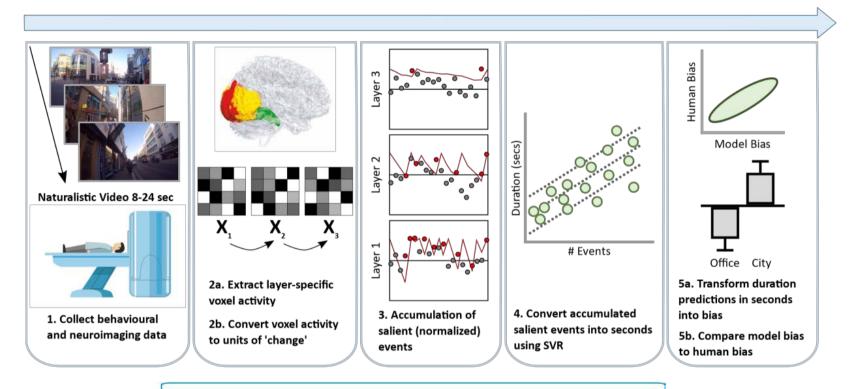
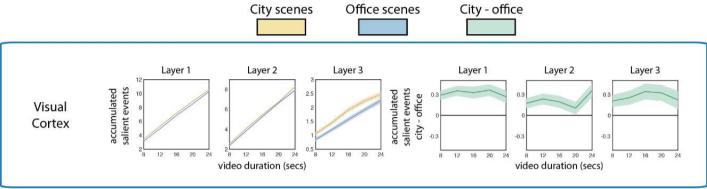


Figure 4. Schematicvæfuatædælling analysiæudiædimeo(12) Following data ægellection, (2a) voxel-wise BOLD amplitude was extracted and (2b) TR-by-TR (i.e. time point-by-time point, TR = repetition time) changes (Euclidean distance or signed difference) computed. The example given here is for the visual hierarchy, where each shaded matrix & illustratively represents voxel-wise BOb Perman et al (submitted) amplitudes (shaded squares) at each slice. The same process was conducted for the auditory and somatosensory hierarchies (see Fig. 3 and Table S1 for different hierarchies). (3) Total change in





Sherman et al (submitted)

Figure 5. Accumulated salient events over video types, perceptual hierarchies (rows) and layers

(columns). The three leftmost columns plot the mean (+/-SEM) number of accumulated salient

overts in each layer of each percentual hierarchy as a function of city (blue lines) or office (vellow

model-based fMRI

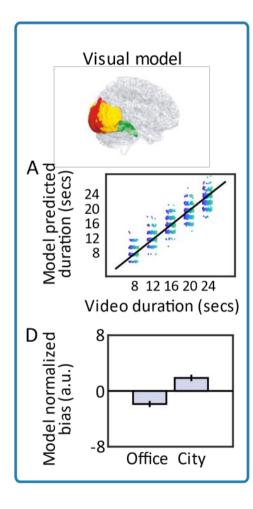


Figure 6. *Computational neuroimaging analysis.* **(A-C)** Trial-by-trial association between p**Shentad** n et al (submitted) video duration and model-predicted duration reports obtained from the visual, auditory and somatosensory models. Different dot colors represent different participants, and each dot is data

study three

A predictive processing model of episodic memory and

time perception

Zafeirios Fountas^{1,2}, Anastasia Sylaidi³, Kyriacos Nikiforou⁴, Anil K. Seth^{5,6}, Murray Shanahan⁴, and Warrick Roseboom⁵

¹Emotech Labs, London, UK ²Wellcome Centre for Human Neuroimaging, Institute of Neurology, University College London, London, UK ³Spike AI Research Labs, London, UK ⁴Department of Computing, Imperial College London, London, UK ⁵Department of Informatics and Sackler Centre for Consciousness Science, University of Sussex, Sussex, UK ⁶Canadian Institute for Advanced Research (CIFAR) Program on Brain, Mind, and Consciousness, Toronto, Ontario, Canada

March 28, 2022

Abstract

Human perception and experience of time is strongly influenced by ongoing stimulation, memory of past experiences, and required task context. When paying attention to time, time experience seems to expand; when distracted, it seems to contract. When considering time based on memory, the experience may be different than in the moment, exemplified by sayings like "time flies when you're having fun". Experience of time also depends on the content of perceptual experience – rapidly changing or complex perceptual scenes seem longer in duration than less dynamic ones. The complexity of interactions between

1



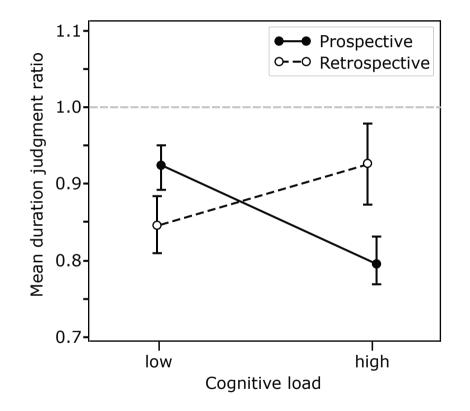
Zafeirios Fountas

Fountas, Z., Sylaidi, A., Nikforou, K., Seth, A.K., Shanahan, M., & Roseboom, W. (in press) Neural Computation

time and memory

- computational model integrating hierarchical predictive coding, short-term plasticity, spatio-temporal attention, and episodic memory formation and recall
- behavioural (online) experiment with ~13,000 participants
- test whether model can replicate influences of (i) cognitive load (ii) scene type (iii) prospective vs retrospective judgement

prospective vs retrospective time



High cognitive load *decreases* apparent duration for *prospective* estimates ...

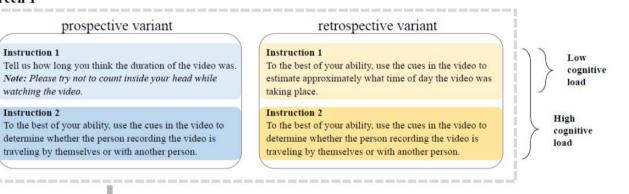
.... but *increases* apparent duration for *retrospective* estimates

Block et al (2010) Acta Psychologica

behavioural study

- ~13,000 participants, each performing one trial
- prospective vs retrospective
- high vs low cognitive load
- quiet vs busy scenes
- estimate duration

Screen 1

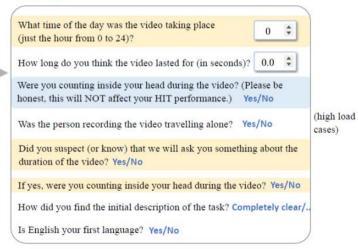


Screen 2

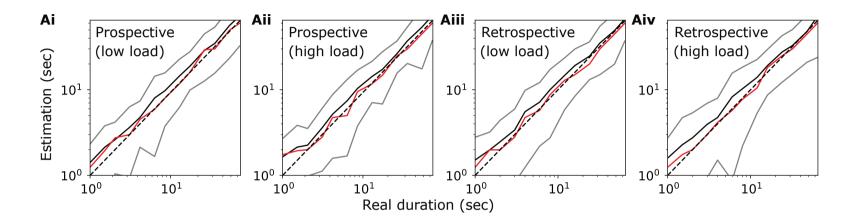


1-64 seconds

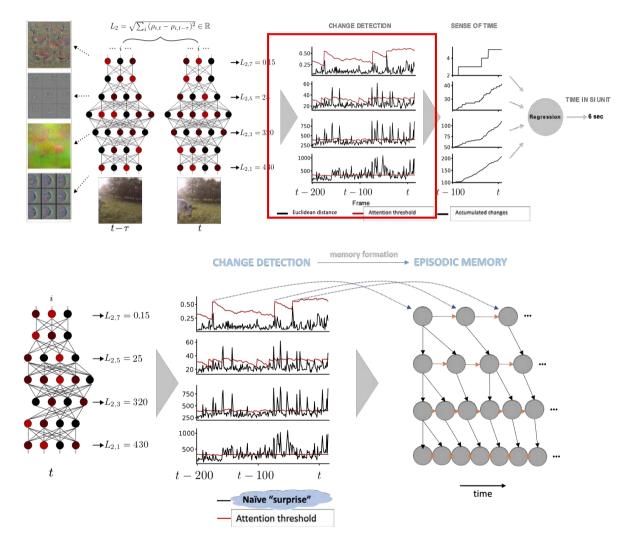
Screen 3



behavioural study

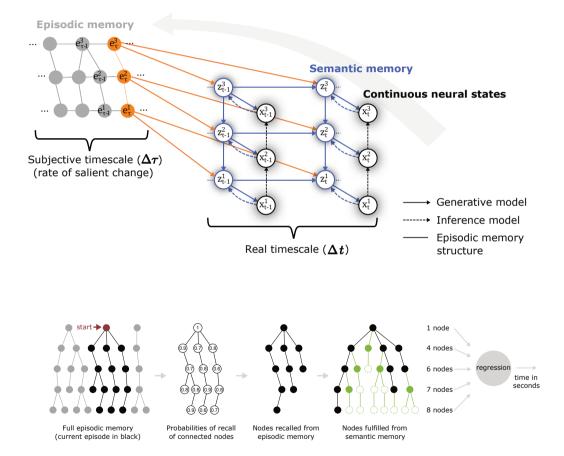


computational model: memory formation



- use salient changes to trigger (hierarchical) episodic memory formation
- replace Euclidean distance with Bayesian prediction error

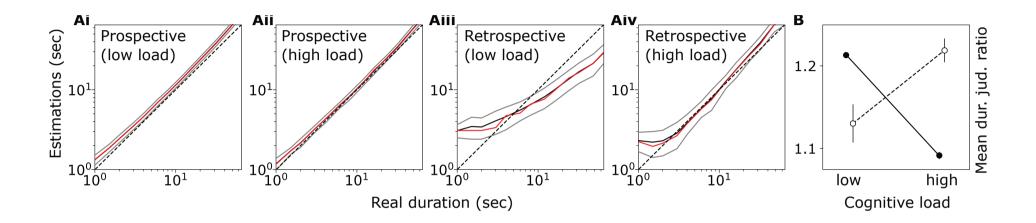
computational model: recall



computational model: demo



computational model: results



summary

- study 1: accumulated salient perceptual change provides a sufficient basis for human duration estimation
- study 2: this applies to the brain too, in a modality specific way
- study 3: extension of model to include episodic memory formation, to account for prospective vs retrospective judgements

Roseboom et al (2019) *Nature Communications* Sherman et al (2022) *BioRXiv* Fountas et al (in press) *Neural Computation* dreamachine & perception census



dreamachine Presented by COLLECTIVE ACT



Brion Gysin

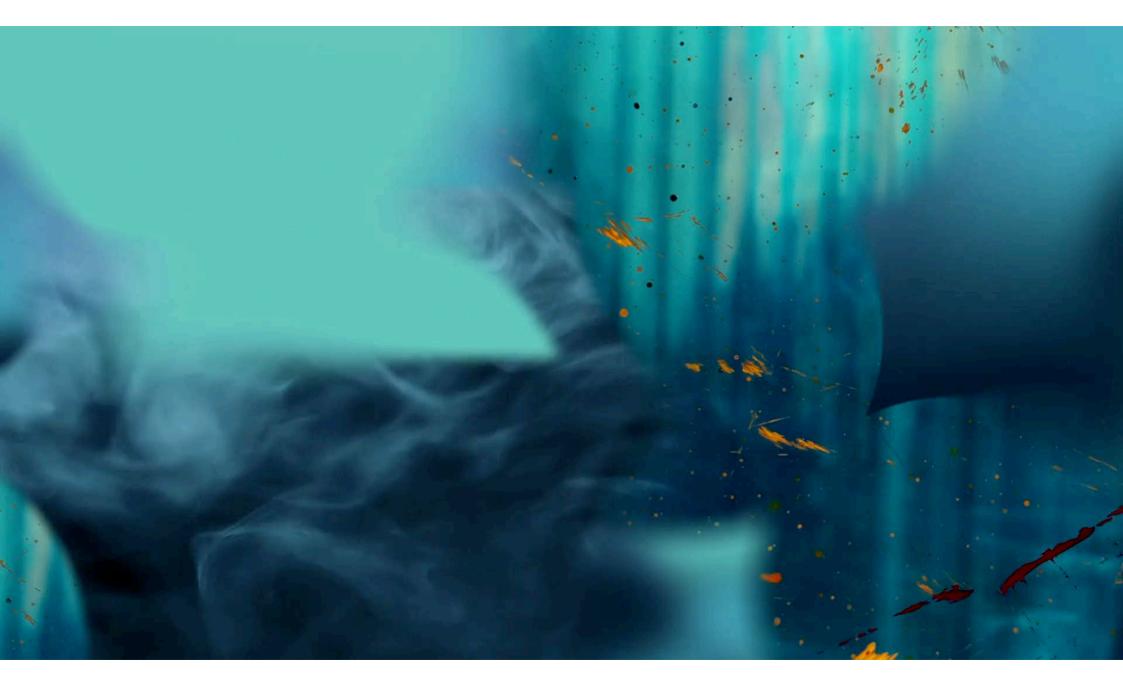
"You are the artist ... what the Dreamachine incites you to see is yours."

From Flicker (1997), dir. Nic Sheehan

stroboscopically-induced hallucinations

- Lucia No.3 strobe light
- see most effects between 8-20 Hz 4
- EEG data shows substantial entrainment
- EEG data shows potential increases in complexity/entropy

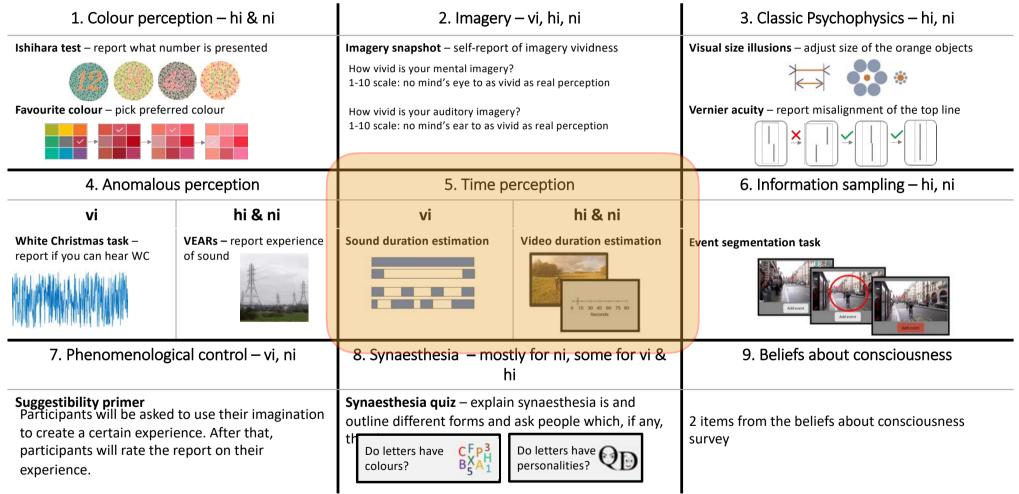
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perception census

vi = visual impairments
hi = hearing impairments
ni = no impairments



Baykova et al (in progress)

summary

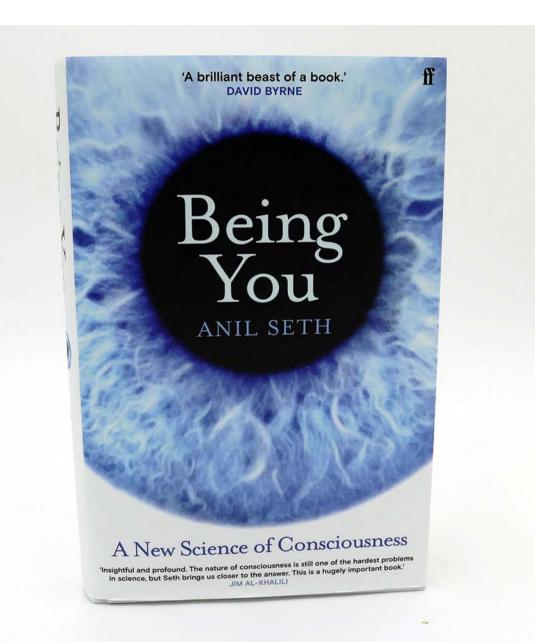
- study 1: accumulated salient perceptual change provides a sufficient basis for human duration estimation
- study 2: this applies to the brain too, in a modality specific way
- study 3: extension of model to include episodic memory formation, to account for prospective vs retrospective judgements
- dreamachine: a large-scale art-science project, and survey of perceptual diversity

Roseboom et al (2019) Nature Communications

Sherman et al (2022) BioRXiv

Fountas et al (in press) Neural Computation

Baykova et al (in progress)



The Sunday Times Top 10 Bestseller A Financial Times Book of the Year A Guardian Science Book of the Year An Economist Book of the Year A New Statesman Book of the Year A Bloomberg Book of the Year

"An exhilarating book: A vastranging phenomenal achievement that will undoubtedly become a seminal text"

Gaia Vince, Guardian (Book of the Week)

"A brilliant beast of a book"

David Byrne

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Keisuke Suzuki

Dr. Mortimer and Theresa Sackler Foundation ERC Project TIMESTORM Canadian Institute for Advanced Research (CIFAR)