## Non-ordinary states of consciousness

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## Acknowledgment

#### Some collaborators

- ▶ Mike Neale
- ► Tim Brick (Penn State Univ)
- ► Steven Boker (Univ of Virginia)
- ► Karen Schmidt (Univ of Virginia)
- ► OpenMx development team















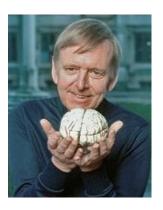


### Historical context

### Large-scale emergence

- ▶ 200k-100k BCE Homo sapiens
- ▶ 3400-3100 BCE Written language
- ▶ 1500-200 BCE Conscious thinking<sup>1</sup>

Supported by latent semantic analysis<sup>2</sup>







<sup>&</sup>lt;sup>1</sup> Jaynes (1976)

<sup>&</sup>lt;sup>2</sup>Diuk, Slezak, Raskovsky, Sigman, and Cecchi (2012)

## Conscious thinking: A modern status quo

Some features of conscious thinking

- spatialization of time
- ightharpoonup concept of me
- ► concept of *I* (i.e. the part of me that is conscious)
- narratization
- concentration (i.e. conscious attention)





Probably a "software" change, not an anatomical change<sup>3</sup>









## Before conscious thinking

#### Bicameral mind<sup>4</sup>

- ▶ no metacognitive awareness
- ▶ no executive monitoring
- no autobiographical memory
- no experience of an introspectable "mind-space"



Internally communicated by hallucination

(Once an evolutionary innovation, schizophrenia is now often considered a psychopathology!)







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## Optimal performance

Conscious thinking has costs<sup>5</sup>

- ► maladaptive rumination
- ▶ jealousy, guilt
- ▶ negligent inattentiveness due to excessive planning



Optimal performance often involves non-ordinary consciousness

- ► running<sup>6</sup>
- ▶ jazz improvisation<sup>7</sup>

→ An emerging mode of consciousness?





<sup>&</sup>lt;sup>5</sup>Leary (2007)

<sup>&</sup>lt;sup>6</sup>Csikszentmihalyi, Latter, and Duranso (2017)

Braun (2008)

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### Non-ordinary means what?

### Which phenomenology is important?











### Non-ordinary means what?

Which phenomenology is important?

Clear neurological correlates. For example:

Transient hypofrontality<sup>8</sup>

Or dynamic connectivity<sup>9</sup>





THE PHENOMENOLOGY OF PERCEPTION: CHOCOLATE

<sup>&</sup>lt;sup>8</sup>Dietrich (2003)

<sup>&</sup>lt;sup>9</sup>Santosa et al. (2017)

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Intro RCPA fNIRS MQ MIDDLE Concl

### Research focus

Non-ordinary states of consciousness that support

- psychological well-being
- ▶ optimal functioning
- ▶ mental and physical health
- ▶ fulfillment



Includes: flow, meditation, mindfulness

Excludes: dreaming, daydreaming, hypnosis





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### Big challenges

Ephemeral, tricky to induce

Difficulty of studying non-ordinary states of consciousness is often underestimated.

Wish to corroborate self-report by objective measures



Intensive data collection and advanced statistical methodology

- ▶ differences within and between people and environments
- deep vs shallow experience
- how do processes unfold over time
- ▶ highly personal data requires greater privacy protection





### Projects, planned and ongoing

#### Overview

- ▶ RCPA: flow-related characteristics of physical activities
- ► fNIRS: objective physiological measures of non-ordinary states
- ▶ MQ: meditation quality self-report measure
- ► MIDDLE

Conclusion





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## Exploratory survey

Are some physical activities more conducive to flow than others?





## Sample item (template)

Participant picks: A, B

How predictable is the action?

- ▶ B is much more predictable than A. (-2)
- ▶ B is somewhat more predictable than A. (-1)
- ▶ Both offer roughly equal predictability. (0)
- ► A is somewhat more predictable than B. (1)
- ► A is much more predictable than B. (2)





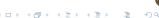
### Sample item

Participant picks: running, golf

How predictable is the action?

- ▶ Golf is much more predictable than running. (-2)
- ▶ Golf is somewhat more predictable than running. (-1)
- ▶ Both offer roughly equal predictability. (0)
- ▶ Running is somewhat more predictable than golf. (1)
- ▶ Running is much more predictable than golf. (2)

20 plausible flow preconditions were included<sup>10</sup>







RCPA

category	count	%
Female Male	5 145 72	2 65 32

category	count	%
	10	5
australia	6	3
austria	4	2
canada	4	2
germany	20	9
other	13	6
united kingdom	32	14
usa	133	60





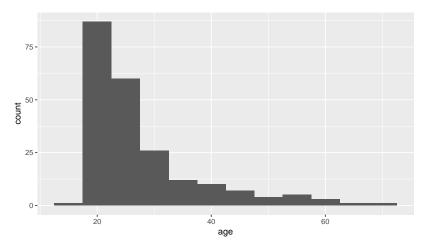
# Demographics, education

category	count	%
Less than high school degree	3	1
High school degree or equivalent (e.g., GED)	22	10
Some college but no degree	63	28
Associate degree	9	4
Bachelor degree	72	32
Graduate degree	48	22





# Demographics, age







### Data and parameters

$$i = 1 \dots I$$
 indexes participants (1)

$$j = 1 \dots J$$
 indexes facets (2)

$$k = 1 \dots K$$
 indexes physical activities (3)

$$y_{ij}|k_a, k_b \in \{-2, -1, 0, 1, 2\}$$
  $k_a \text{ vs } k_b \text{ by person } i \text{ on facet } j$  (4)

$$\theta_{kj}$$
 activity k's score on facet  $j$  (5)

$$\tau_1, \tau_2$$
 category thresholds (6)

$$\alpha_j$$
 slope for facet  $j$  (7)

$$\lambda_i$$
 factor loading for facet  $i$  (8)

$$\pi_k$$
 activity k's latent flow score (9)





### Priors and model

$$\pi_k \sim \mathcal{N}(0,1) \tag{10}$$

$$\lambda_j \sim \mathcal{N}(0,5) \tag{11}$$

$$\theta_k \sim \mathcal{N}(\pi_k \lambda, 1)$$
 (12)

$$\tau_1, \tau_2 \sim \mathcal{N}(0, 5) \tag{13}$$

$$\log \alpha_i \sim \mathcal{N}(0, 1) \tag{14}$$

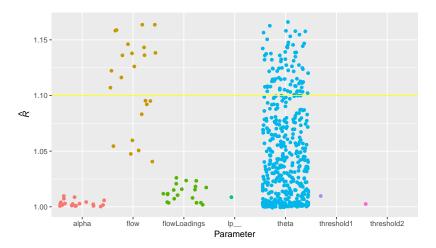
$$logit \left[ \Pr(y_{ij}|k_a, k_b) \right] = \alpha_j \left[ \theta_{k_a} - \theta_{k_b} + f(y_{ij}) \right]$$
 (15)

where 
$$f(r) \equiv \begin{cases} -(\tau_1 + \tau_2) & r = -2\\ -\tau_1 & r = -1\\ 0 & r = 0\\ \tau_1 & r = 1\\ (\tau_1 + \tau_2) & r = 2 \end{cases}$$
 (16)





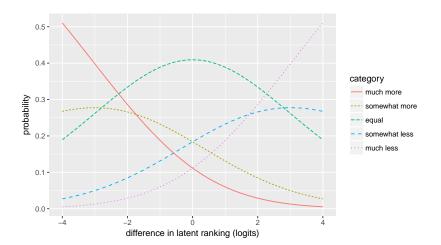
# $\hat{R}$ convergence diagnostic







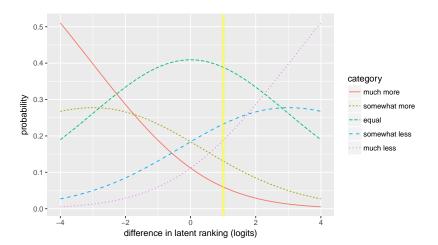
### Response curves







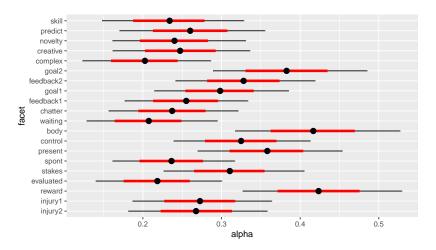
### Response curves at 1.0







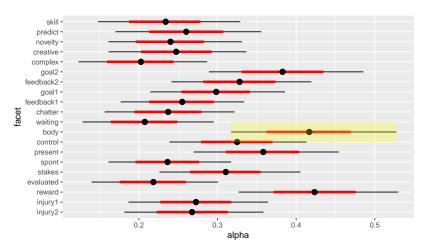
### Discrimination







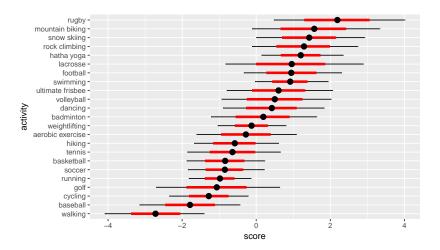
## Discrimination, bodily involvement







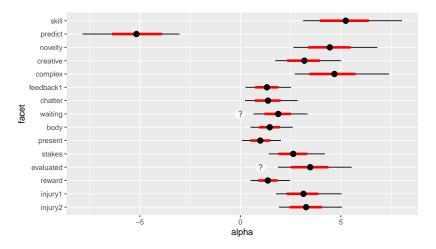
# How much of your body is involved?







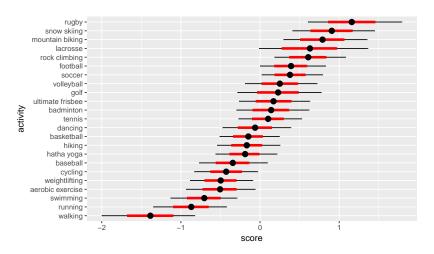
# Latent flow score, loadings







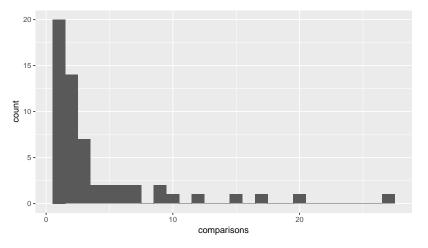
### Preliminary flow score







## Comparisons per physical activity







## Projects, planned and ongoing

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- ▶ RCPA: flow-related characteristics of physical activities
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# $2017~\mathrm{fNIRS}$ Workshop at Kingston, RI



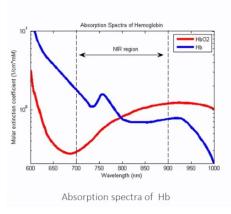


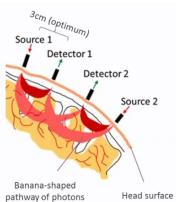




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## Working principles of fNIRS









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# fNIRS compared to fMRI

Both measure the blood oxygen level-dependent (BOLD) response<sup>11</sup>

method	resolution		depth	mobility	cost
	temporal	spatial	pervasion		
fMRI fNIRS	1-2 s 100-400 ms	$64~\mathrm{mm}^3$ $100~\mathrm{mm}^3$	$\begin{array}{c} good \\ 23 \text{ cm} \end{array}$	poor good	$>$ \$1 million $\sim$ \$20-100k

(Table from Min, Marzelli, & Yoo, 2010)









## Simultaneous measurement of multiple subjects







# How to define meditation/mindfulness?

Meditation may involve 1 or more of

- psychophysical relaxation
- self-focus skill or anchor
- ▶ altered state/mode of consciousness
- mystic experience
- ▶ enlightenment
- suspension of logical thought processes
- experience of mental silence

(Bond et al., 2009)





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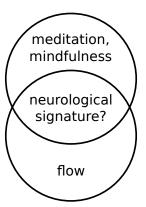
Difficult, 12 but ask a different question...





<sup>&</sup>lt;sup>12</sup>Farias and Wikholm (2016)

## Triangulate







## What neurological signature?

#### Neurology:

Explicit and implicit processing become entangled and, perhaps, integrated<sup>13</sup>

#### Phenomenology:

- ▶ selflessness (i.e., dissolution of the boundary dividing self from non-self)
- timelessness
- effortlessness (i.e., spontaneity)

involve brain regions near the surface of the neocortex<sup>14</sup>

<sup>&</sup>lt;sup>14</sup>Goldberg, Harel, and Malach (2006); Andrews-Hanna, Smallwood, and Spreng (2014); Pagnoni, Cekic, and Guo (2008); Johnstone, Bodling, Cohen, Christ, and Wegrzyn (2012); Rammsayer (1999) 4 D > 4 A > 4 B > 4 B >







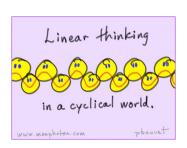
<sup>&</sup>lt;sup>13</sup>Berkovich-Ohana and Glicksohn (2014)

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### Data analysis challenge

fNIRS produces dense, multivariate, multilevel time series data with intricate dynamics that evolve over a range of time scales.

Possible approaches: windowed cross correlation, autoregressive models, state space models, or novel methods.<sup>15</sup>







<sup>&</sup>lt;sup>15</sup>Pritikin, Hunter, von Oertzen, Brick, and Boker (2017); Pritikin (2017)

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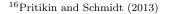
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# A new self-report measure

For studies that aim to examine the effects of meditation, a valid manipulation check would reduce measurement error.

Meditation quality (MQ) instrument in development since 2012, <sup>16</sup> based on experience of non-ordinary states.



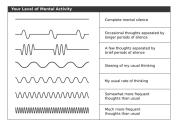




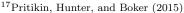


ntro RCPA fNIRS  $oldsymbol{ ext{MQ}}$  MIDDLE Conclusion References

### Mostly single-occasion measurements



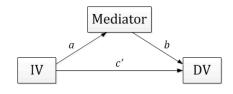
- $ightharpoonup N \approx 3500$
- ▶ 7 items on preparation/training
- ▶ 18 items on non-ordinary consciousness
- ▶ Data analyzed with modular, open-source tool for Item Response Theory¹7





#### A mediation model

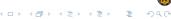
From experience of non-ordinary consciousness



#### Expect enhanced

- ► self-concept clarity<sup>18</sup>
- ▶ self-control
- $\blacktriangleright$  alignment between implicit and explicit goals

Leading to psychological well-being, fulfillment



<sup>&</sup>lt;sup>18</sup>Campbell et al. (1996)



#### Incarcerated inmates

#### Compared to students,

- ▶ lower baselines for self-concept clarity, self-control, and alignment between implicit and explicit goals
- more time and motivation to practice<sup>19</sup>



#### Goal:

▶ Reduction in recidivism and drug (ab)use







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## Detailed research plan

Mindfulness RCT conducted in a prison,<sup>20</sup> replicate and extend

- ▶ intensive longitudinal measurement
  - helps minimize noise
  - ► can reveal time-varying, dynamic behavior.
- ► continuous time structural equation modeling<sup>21</sup>
  - can estimate autoregressive and cross-lag effects in time-independent units
  - permits investigation of the direction of causality

Gather evidence of longitudinal predictive validity for MQ as a  $rac{1}{2}$ 







<sup>&</sup>lt;sup>20</sup>Malouf, Youman, Stuewig, Witt, and Tangney (2017)

<sup>·//</sup> · ロト (周) (3) (3)

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<sup>&</sup>lt;sup>21</sup>Driver et al. (2017)

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Gather evidence of longitudinal predictive validity for MQ as a mediator





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ntro RCPA fNIRS **MQ** MIDDLE Conclusion Reference

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#### MIDDLE

What if we could keep participant data private,

never revealed to researchers,

and still fit statistical models to data and test hypotheses?





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#### Statistical models

Given

$$x_i$$
 row  $x$  of data from person  $i$  (17)

$$\theta$$
 parameter vector (18)

Full-information maximum likelihood often has the form

$$\sum_{i=1}^{I} L(x_i|\theta) = \dots$$
 (19)

and rows are assumed independent and identically distributed.





$$\sum_{i=1}^{I} L(x_i|\theta) = L(x_1|\theta)$$

$$L(x_2|\theta) +$$

$$L(x_3|\theta) +$$

$$L(x_4|\theta) +$$

$$\cdots +$$

$$L(x_I|\theta)$$
(20)





### Maintained individual data (MID)



#### Your personal $L(x_i|\theta)$ runs on your smartphone

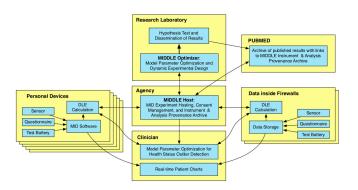
- ▶ Data remain private
- ► Can be encrypted and backed up
- ▶ Automatic data sharing across experiments
- ▶ Larger participant pool with more generalizable estimates





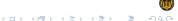
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#### Status



Proof-of-concept stage<sup>22</sup>

Will apply to federal health agencies for funding.





<sup>&</sup>lt;sup>22</sup>Boker et al. (2015)

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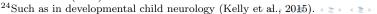
### Advanced statistical methodology is key

The topic of non-ordinary states of consciousness spans at least

- neuroscience
- positive, clinical, cognitive, and sports psychology
- contemplative studies

To span so much ground, my strengths include

- expertise in applied statistics<sup>23</sup>
- ▶ an affinity for interdisciplinary collaboration<sup>24</sup>







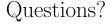
<sup>&</sup>lt;sup>23</sup>Neale et al. (2016)

o RCPA fNIRS MQ MIDDLE **Conclusion** References

### An emerging mode of consciousness?

#### Large-scale emergence

- ▶ 200k-100k BCE Homo sapiens
- ▶ 3400-3100 BCE Written language
- ► 1500-200 BCE Conscious thinking
- ▶ 1970-2050 CE Hypofrontality (flow, meditation, etc.



Thank you
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