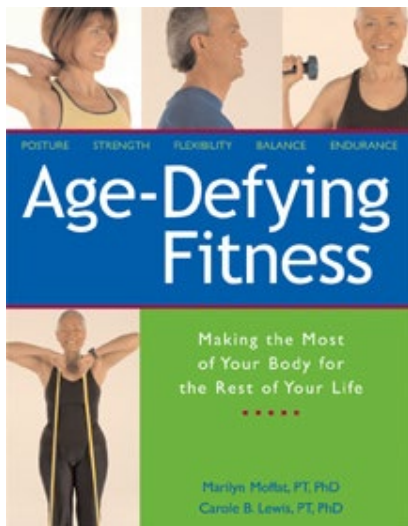
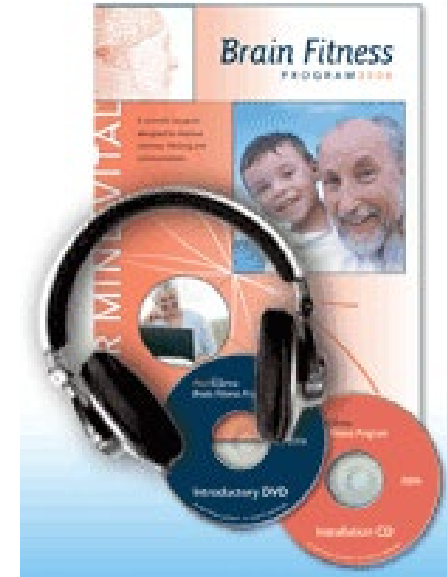


# The Influence of Physical Activity on Cognitive & Brain Health of Older Adults: A summary and future directions – including an increasing role for AI



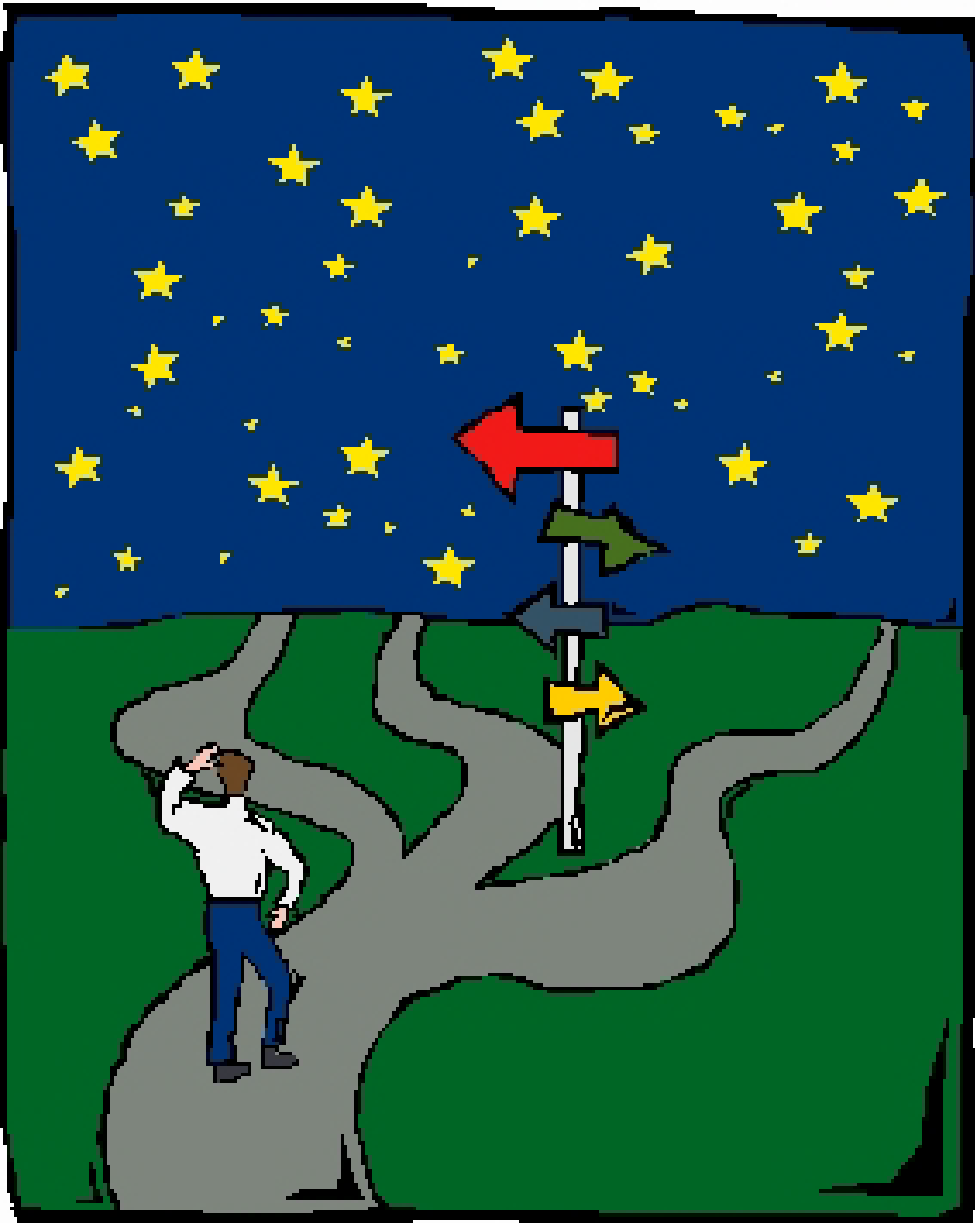
"Try the fish. It's brain food."

Art Kramer & colleagues  
Northeastern University,  
University of Illinois,  
& other collaborators



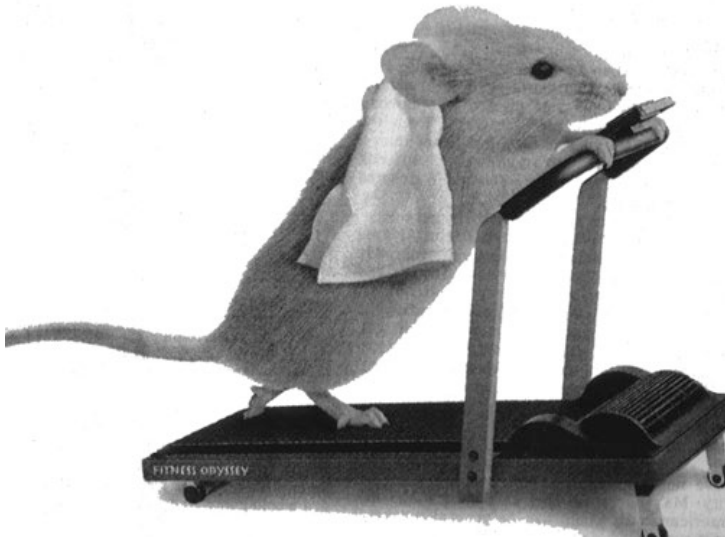
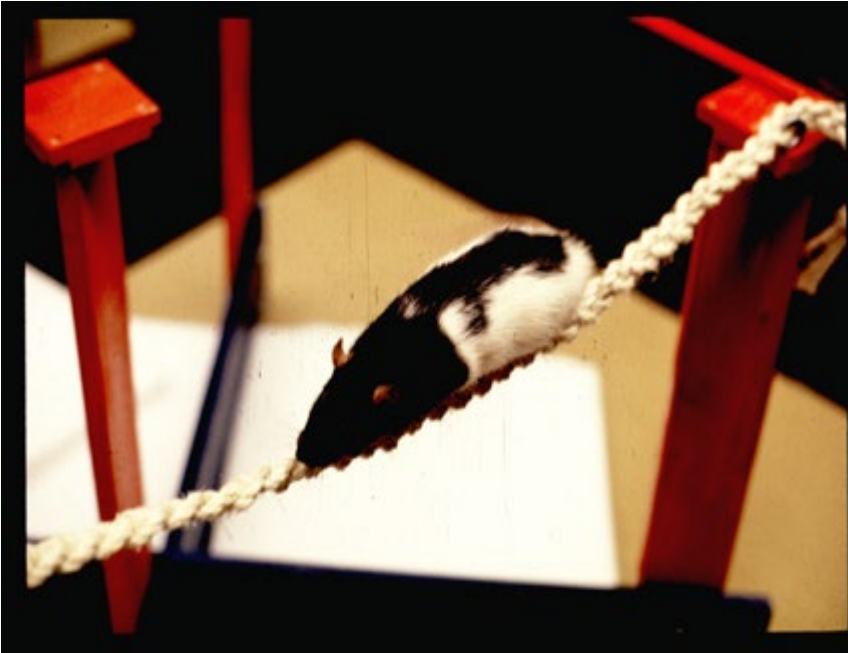
We all live in yellow submarine,  
yellow submarine, yellow submarine.  
And our friends are all aboard,  
Many more of them live next door.

# Roadmap for Today .....

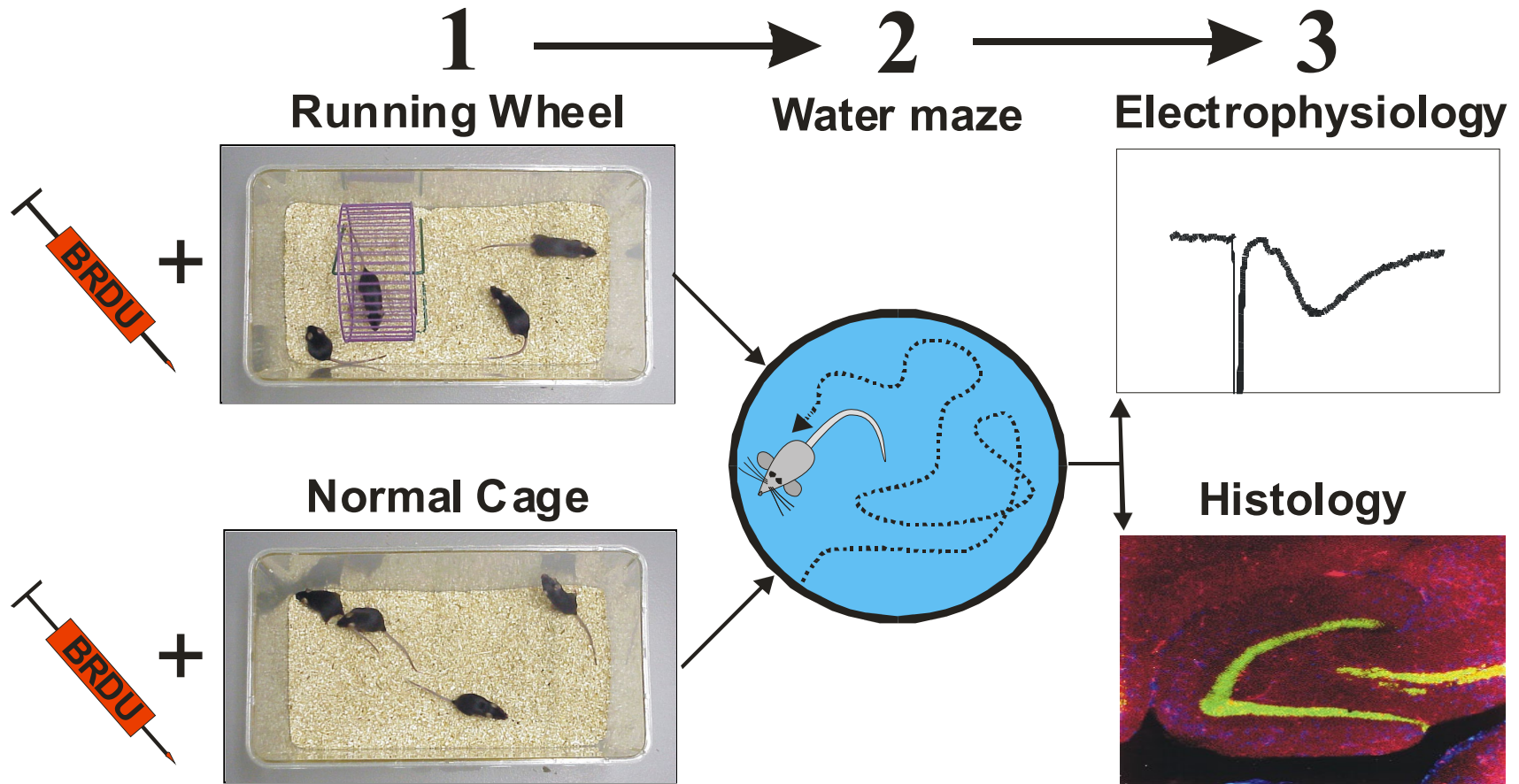


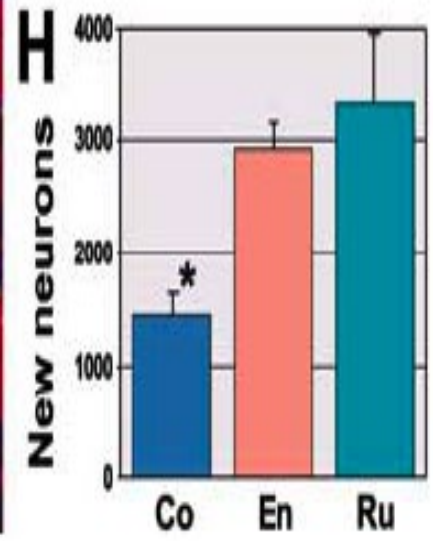
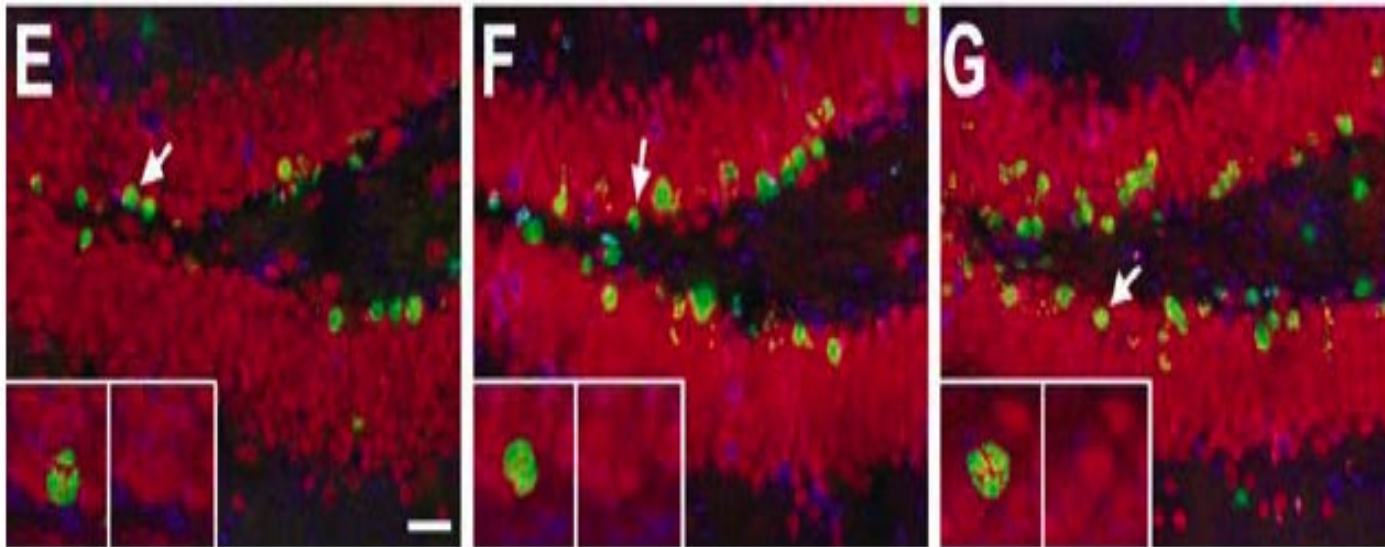
- **What do we currently know about the molecular and cellular brain mechanisms of physical activity – animal models.**
- Meta-analytic studies of physical activity effects on cognition.
- Exercise and physical activity effects on older human minds & brains – structure, function and functional connectivity.
- Is there a point of no-return for exercise effects on brain & cognition?
- Fitness effects across the lifespan.
- What studies need to be done to further advance our understanding of the link between exercise & cognition ?

**Enriched (complex) environments include:**



# Assessing the effects of exercise



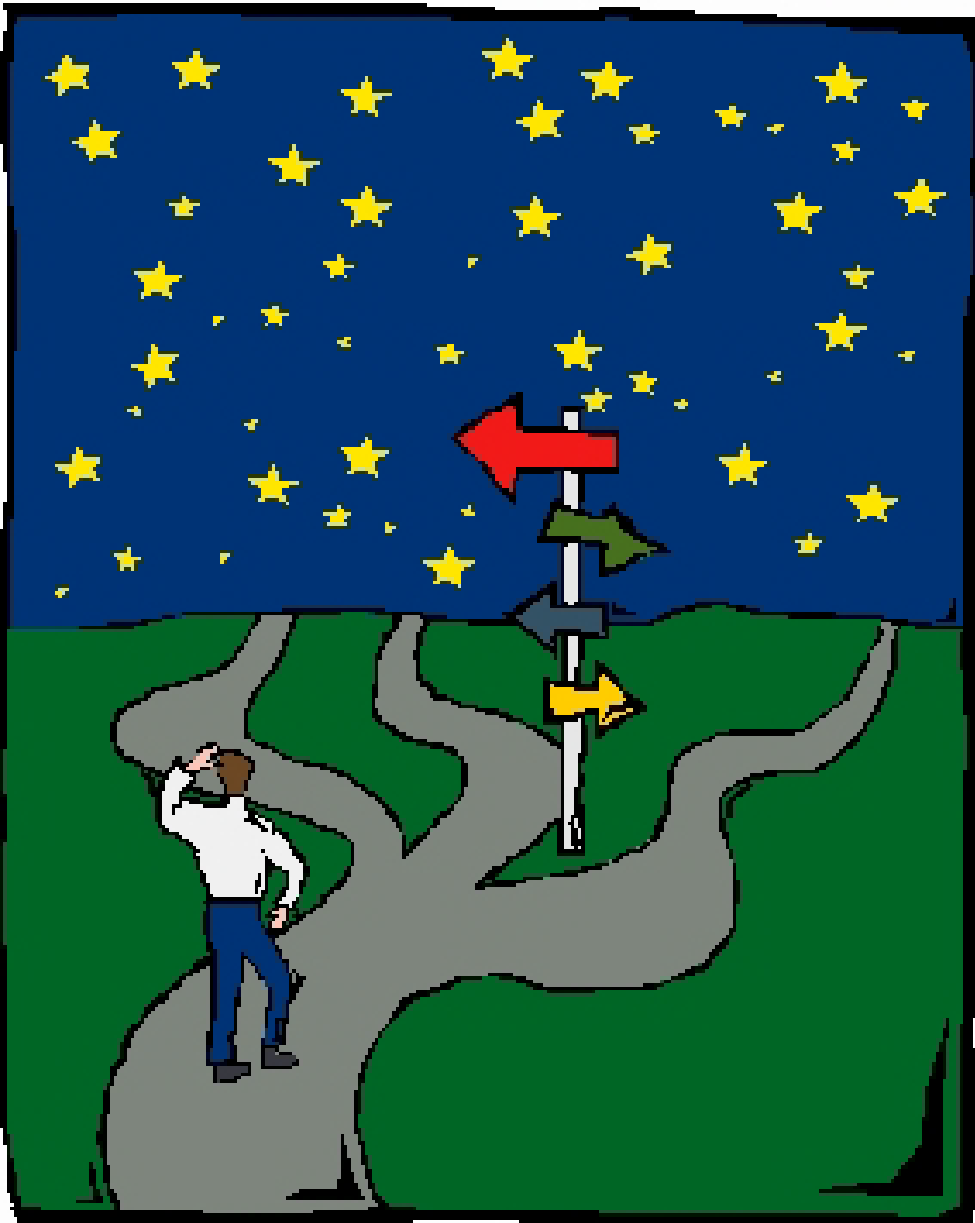


Brown et al, 2003

ALSO .....

- increases in neurotrophins (e.g. BDNF, IGF1, VEGF, etc.)
- enhanced synaptogenesis
- enhanced angiogenesis
- increased production of various neurotransmitters
- reduced beta amyloid protein in transgene mouse models
- increased telomere length
- increased expression of genes associated with plasticity & mitochondria function, downregulates genes associated with oxidative stress
- enhanced learning & memory

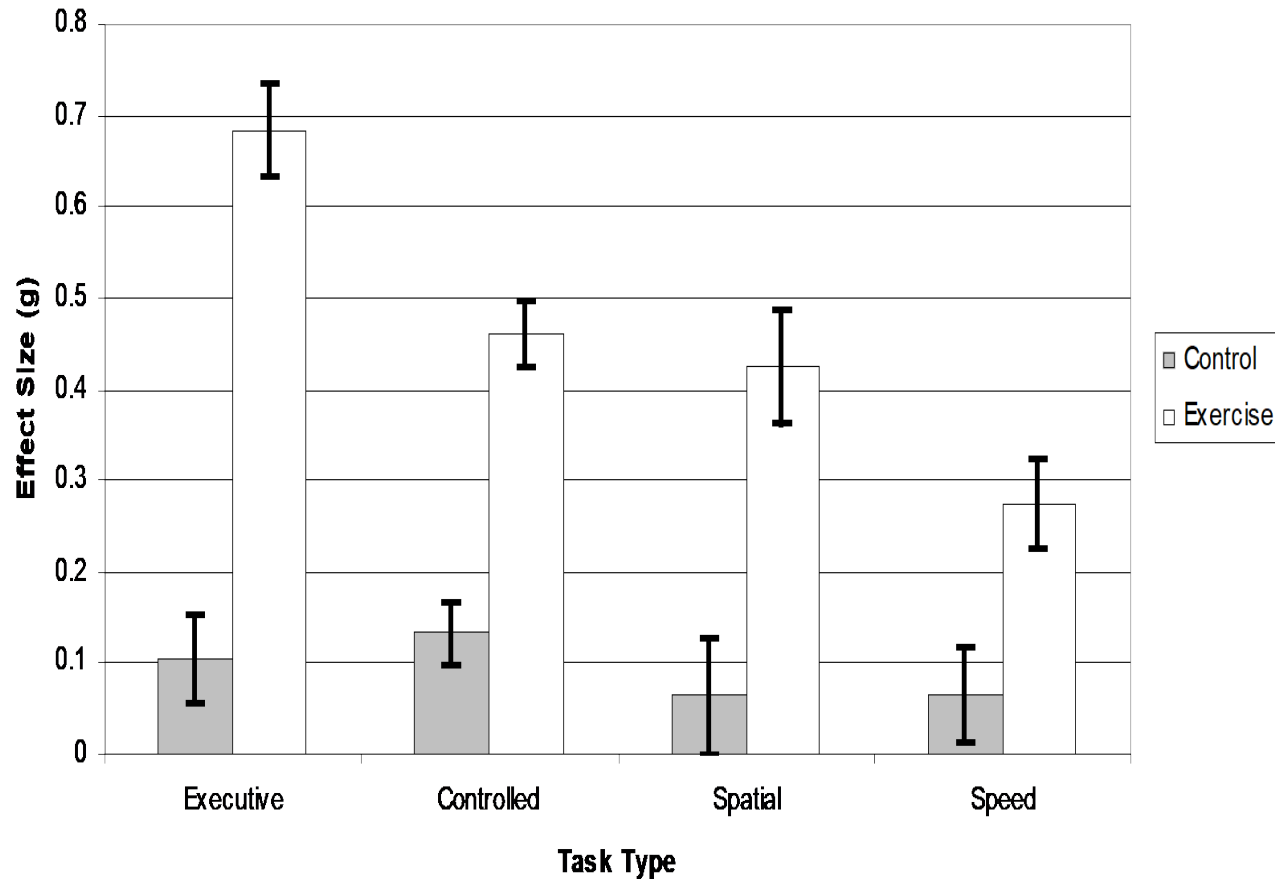
# Roadmap for Today .....



- What do we currently know about the molecular and cellular brain mechanisms of physical activity – animal models.
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- Fitness effects across the lifespan.
- What studies need to be done to further advance our understanding of the link between exercise & cognition ?

- Across intervention studies (with normal elderly) that find positive effects of fitness training on cognition the cognitive benefits are quite broad – with larger benefits for some cognitive processes ...

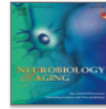
Effect Size Estimates as a Function of Task Type and Group



# There have been lots and lots of additional meta-analyses since 2003 .....



Neurobiology of  
Aging  
Volume 79, July 2019, Pages 119-130



Review

## Impact of exercise training on physical and cognitive function among older adults: a systematic review and meta-analysis

Ryan S. Falck<sup>a, b, c, 1</sup>, Jennifer C. Davis<sup>d, 1</sup>, John R. Best<sup>a, b, c</sup>, Rachel A. Crockett<sup>a, b, c</sup>, Teresa Liu-Ambrose<sup>a, b, c</sup>✉

### Highlights

- Maintaining physical and cognitive function is critical for healthy aging.
- Physical function and cognitive function are linked and share common mechanisms.
- Exercise training improves physical function and cognitive function.
- Exercise-induced improvements in physical and cognitive function are associated.

## Cognitive benefits of exercise interventions: an fMRI activation likelihood estimation meta-analysis

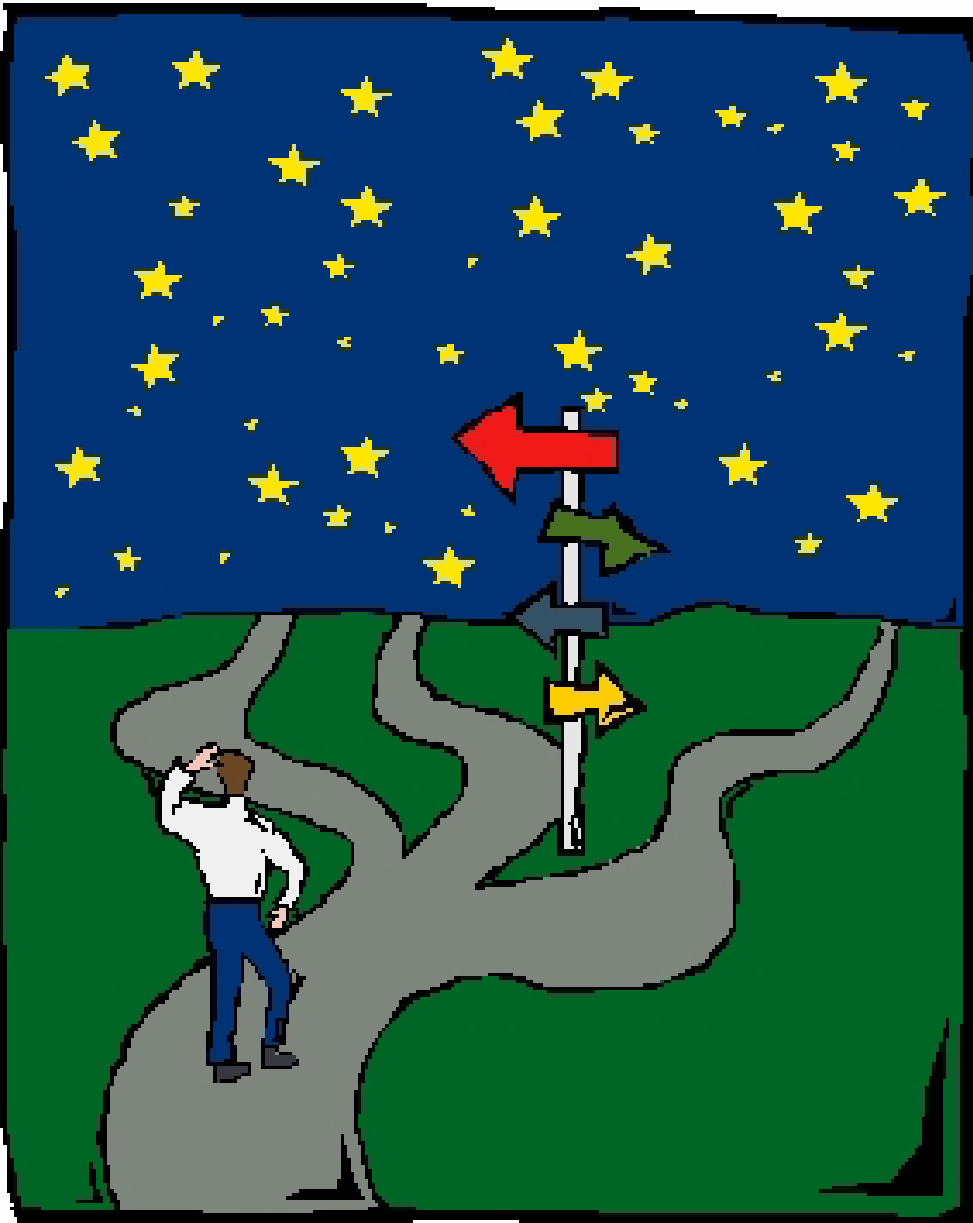
Qian Yu<sup>1</sup> · Fabian Herold<sup>2</sup> · Benjamin Becker<sup>3</sup> · Ben Klugah-Brown<sup>3</sup> · Yanjie Zhang<sup>1</sup> · Stephane Perrey<sup>4</sup> · Nicola Veronese<sup>5</sup> · Notger G. Müller<sup>2</sup> · Arthur F. Kramer<sup>6,7</sup> · Liye Zou<sup>1</sup>

Received: 27 November 2020 / Accepted: 26 February 2021

Shorter exercise intervention durations induced changes with regions connected to frontoparietal and default mode networks while longer duration interventions induced changes with regions connected to frontoparietal and dorsal attention networks



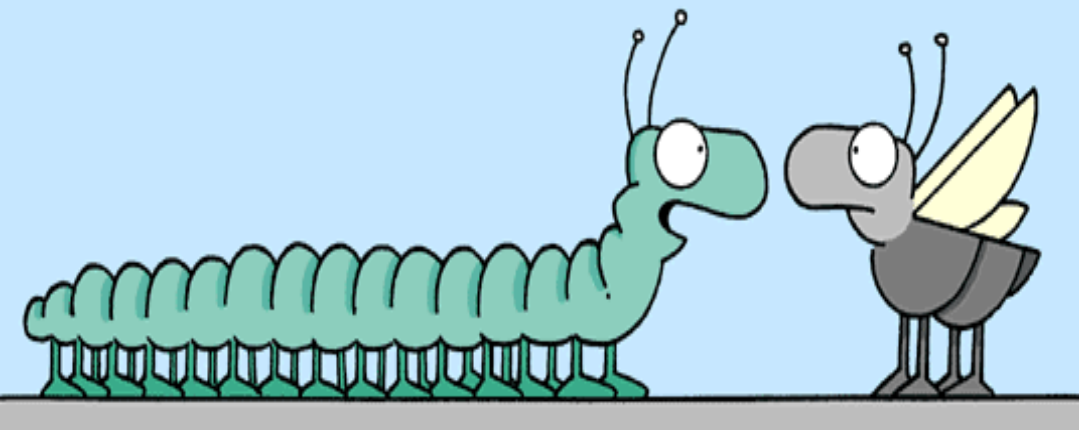
# Roadmap for Today .....



- What do we currently know about the molecular and cellular brain mechanisms of physical activity – animal models.
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# TYPICAL FITNESS INTERVENTIONS

Copyright 1998 by Randy Glasbergen.  
www.glasbergen.com



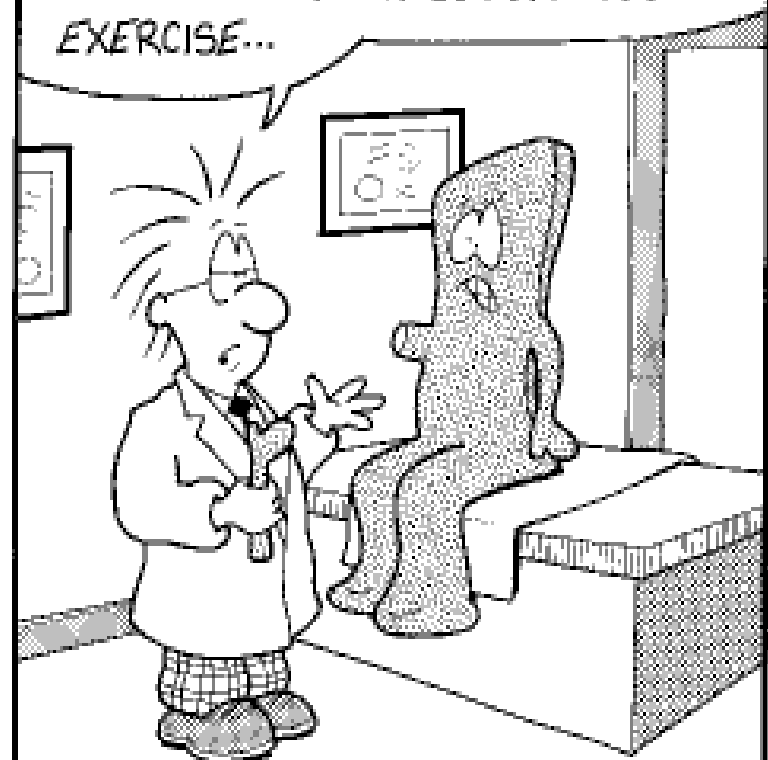
**“I tried all the fitness fads, but my doctor was right all along—walking is still the best exercise.”**

**off the mark**

by Mark Parisi

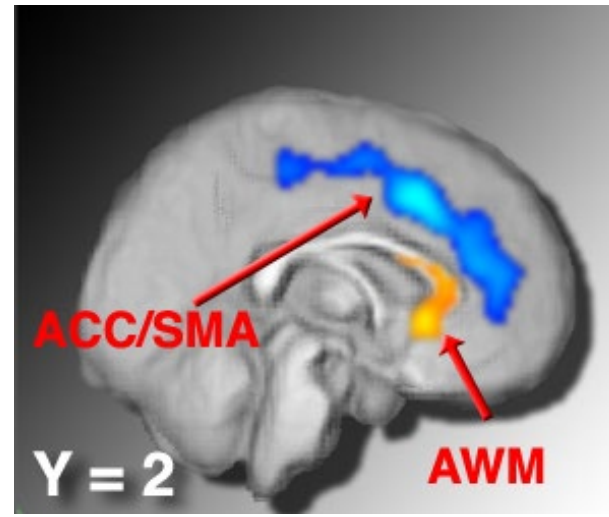
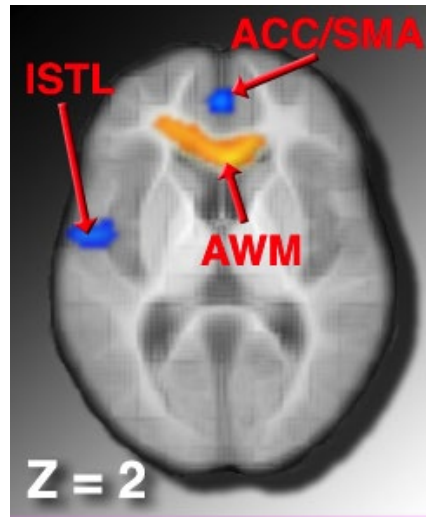
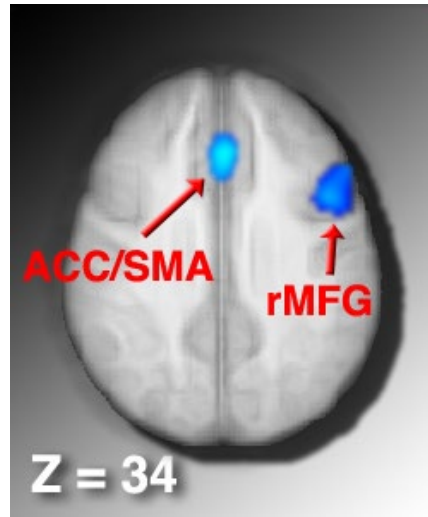
www.offthemark.com

YOU, OF ALL PEOPLE, SHOULD KNOW ENOUGH TO STRETCH BEFORE YOU EXERCISE...



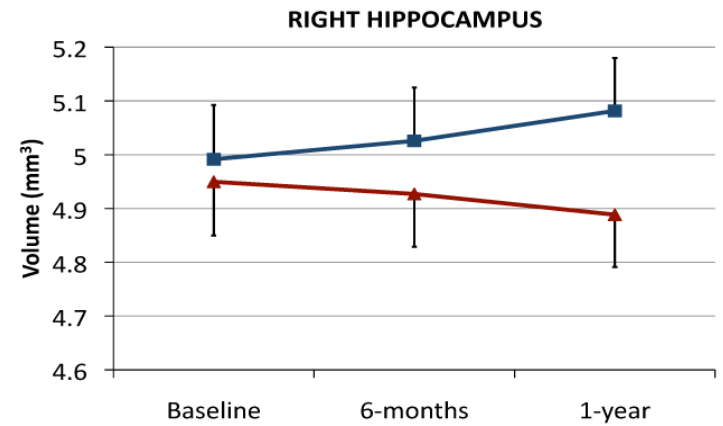
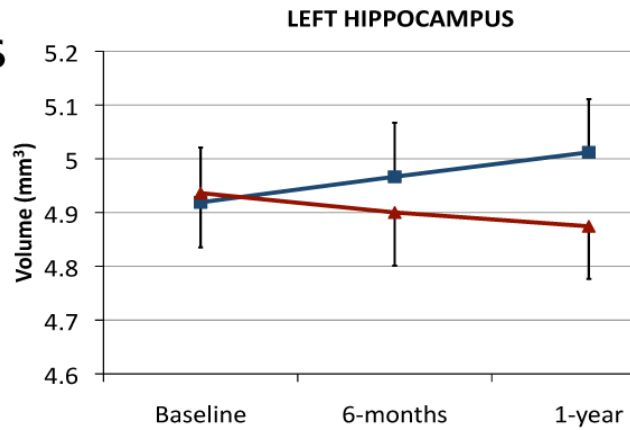
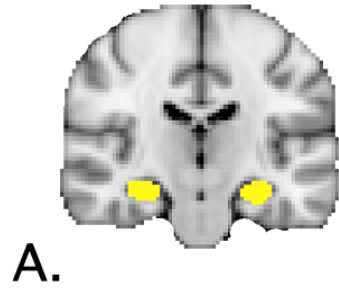
**Exercising your brain  
structure .....**

Although much is known about fitness training effects on brain function with non-human animals there is a dearth of knowledge of fitness training effects with humans .....

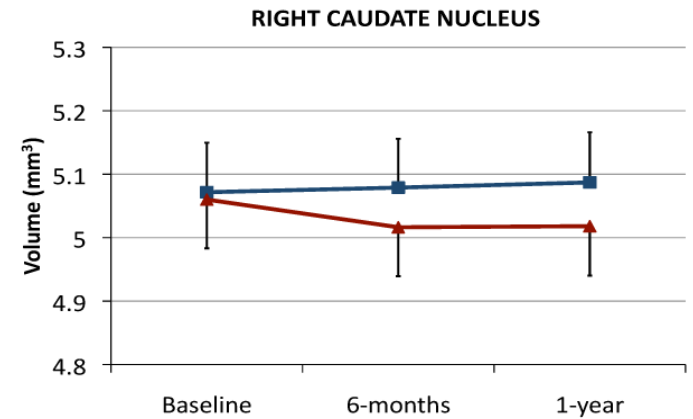
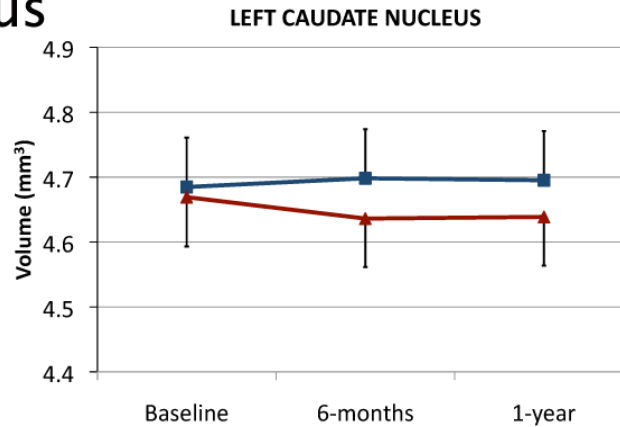
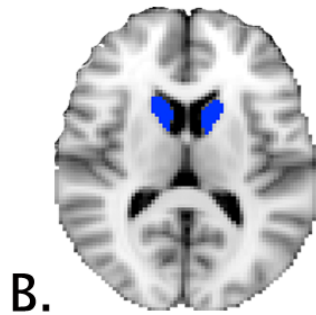


Colcombe et al, 2006

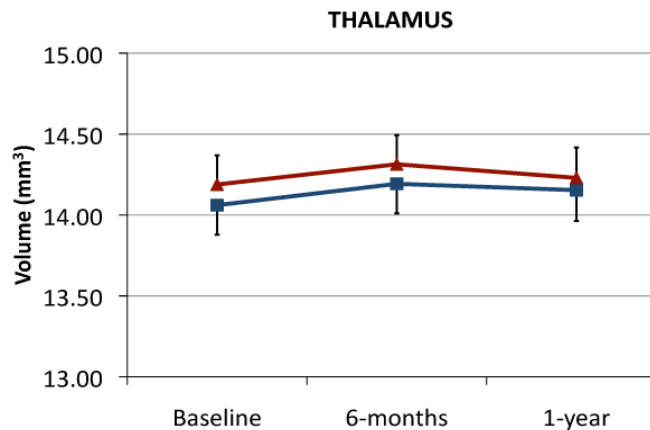
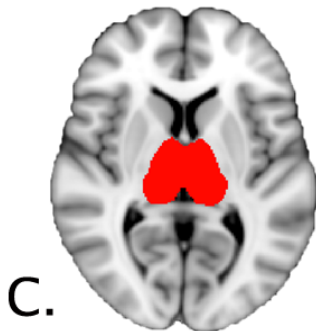
# Hippocampus



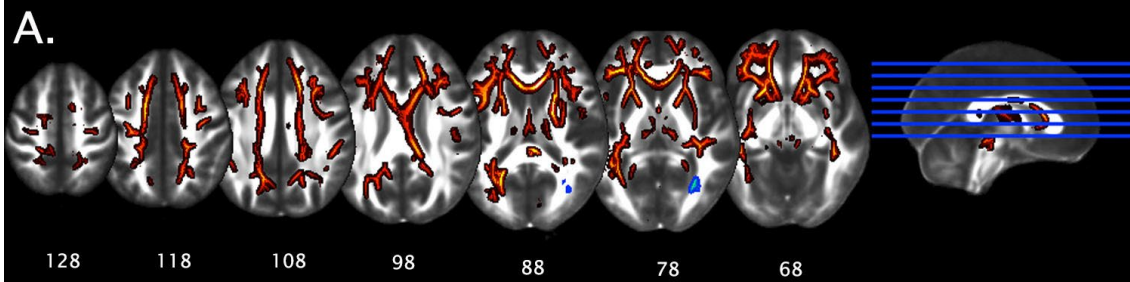
# Caudate Nucleus



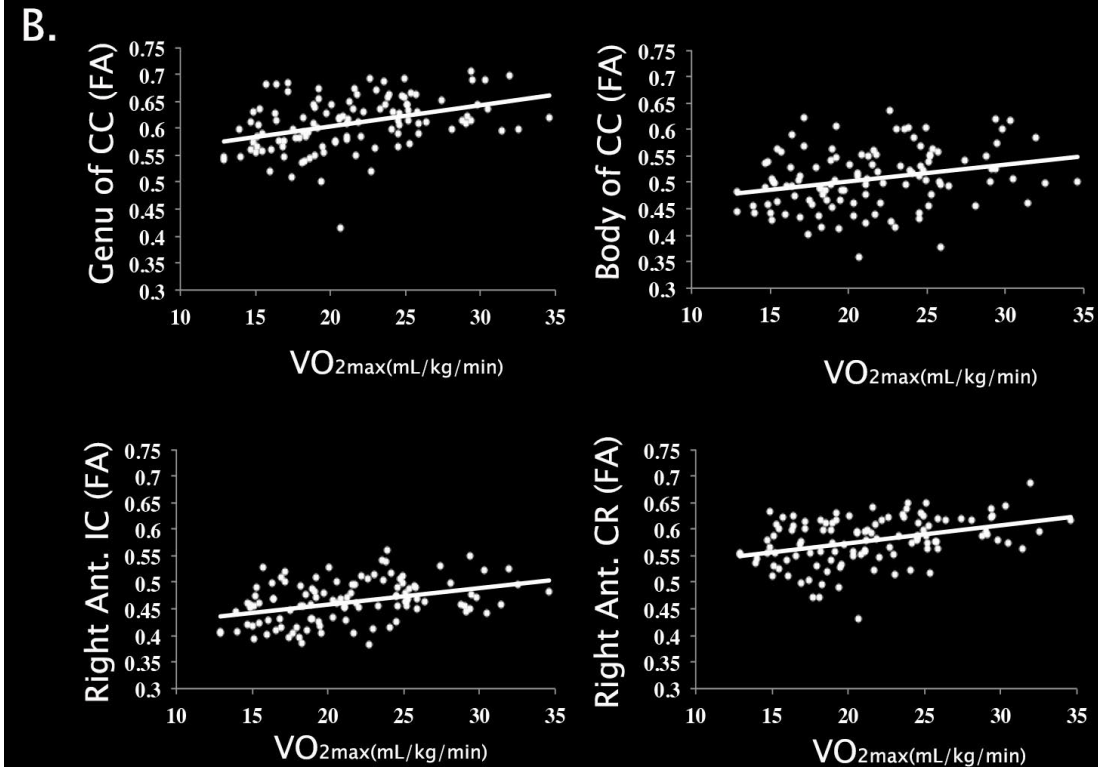
# Thalamus



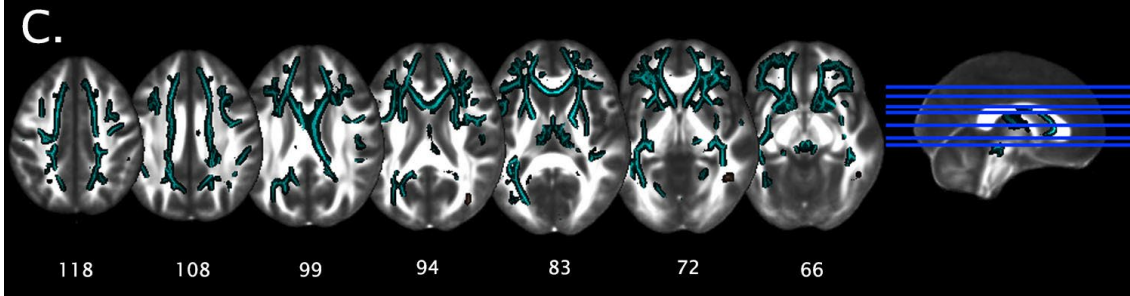
■ Exercise  
▲ Stretching



Clusters of voxels where fitness was significantly associated with FA in multiple samples of 100+ older participants.

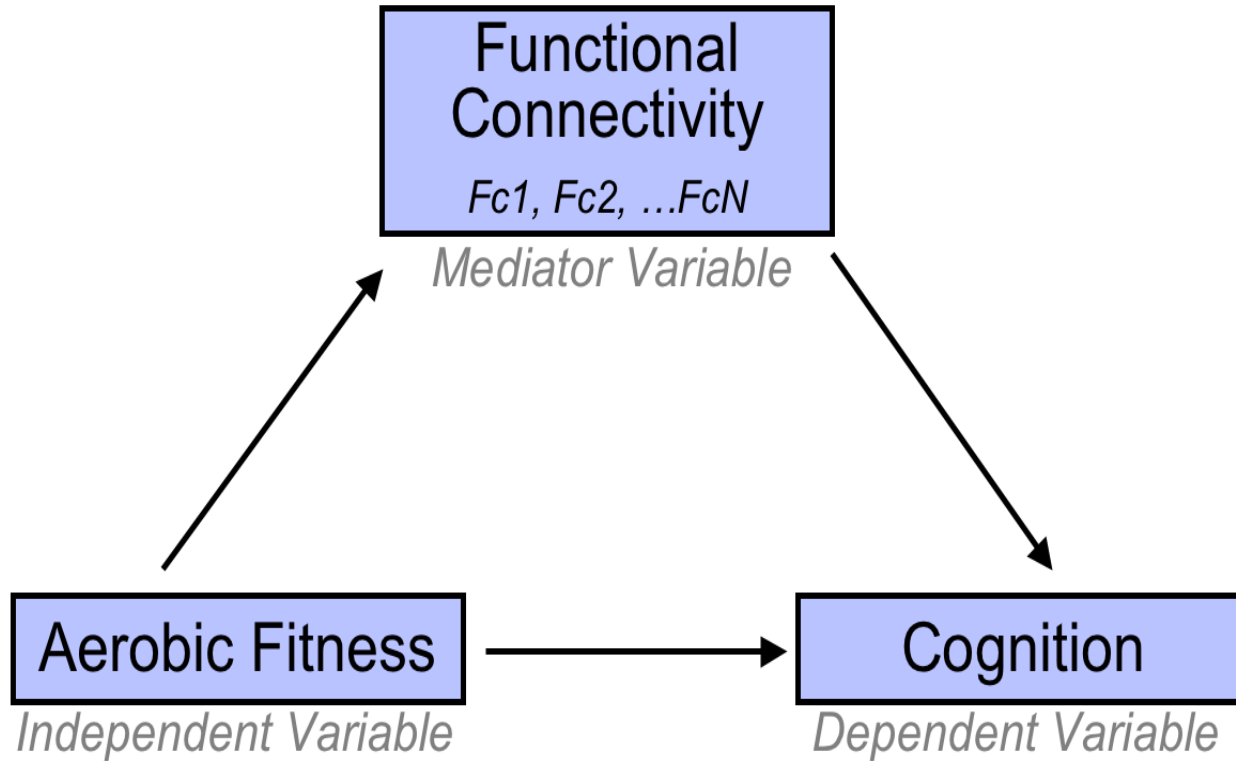


**Mediation analysis** showed *significant indirect associations between CRF and spatial working memory performance through distributed white matter regions, highlighted in cyan in Figure 1C.*



**Exercising your brain  
function .....**

# Is aerobic fitness associated with better Functional connectivity?



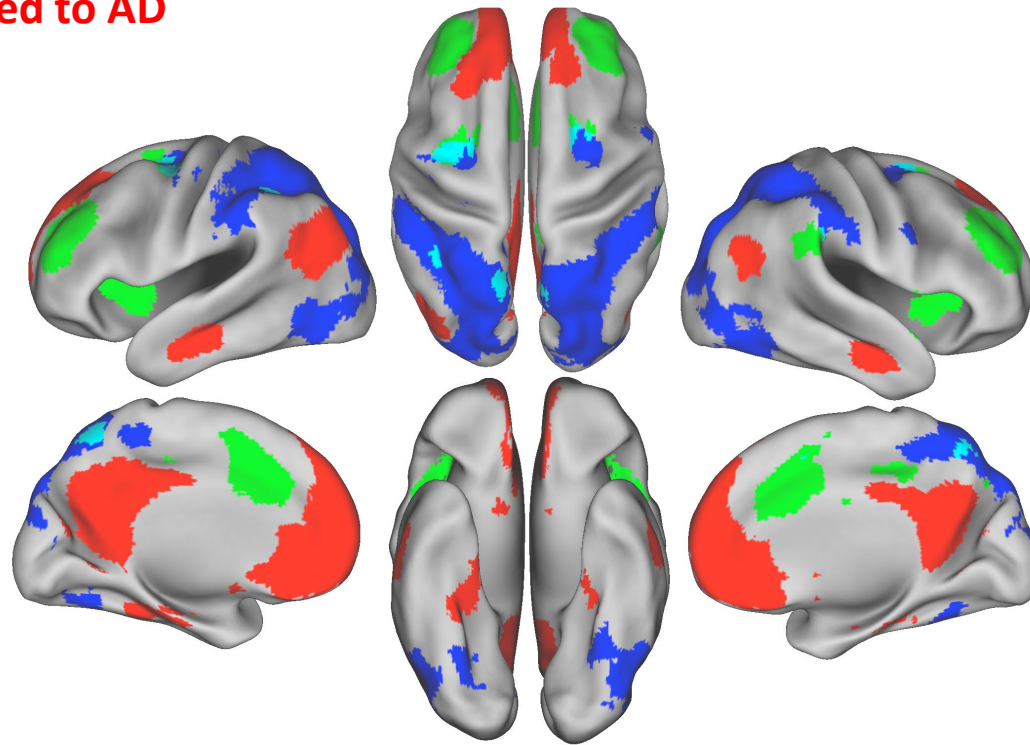


# Cognitively relevant brain networks

- deactivated during goal-directed attention
- active at rest, inward thought
- ↑ executive functions, speed, memory processes
- dysfunction linked to AD

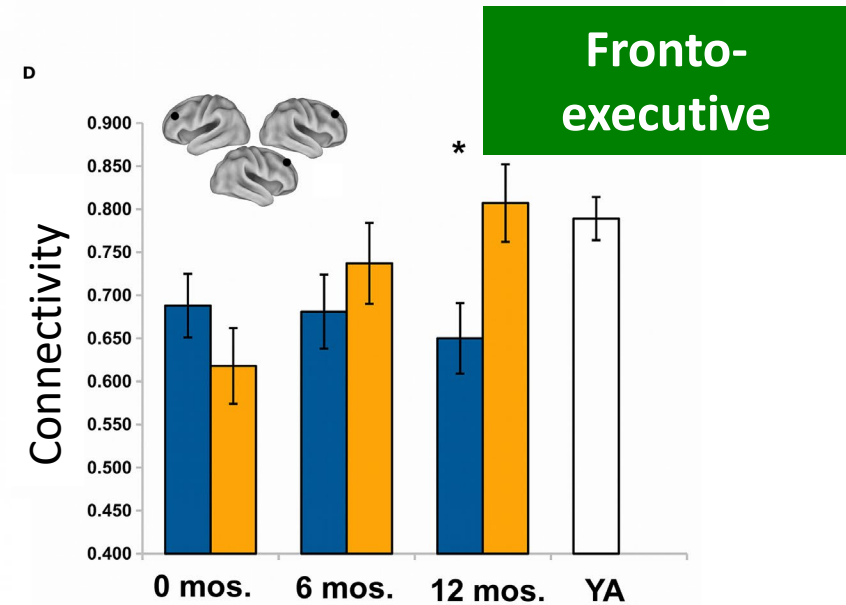
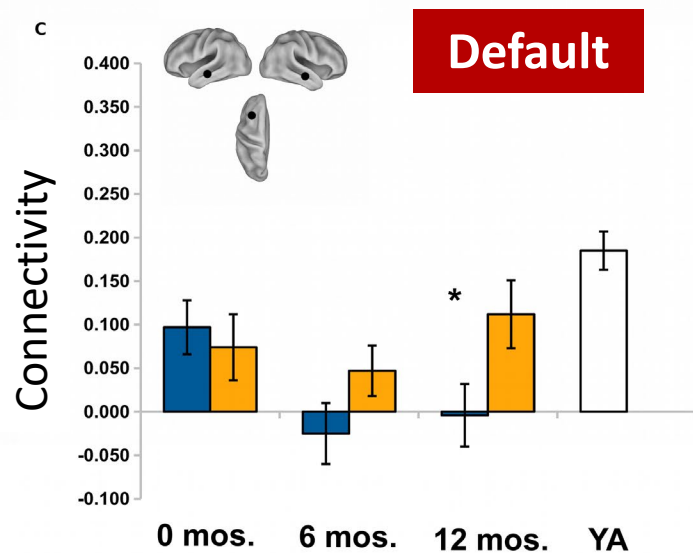
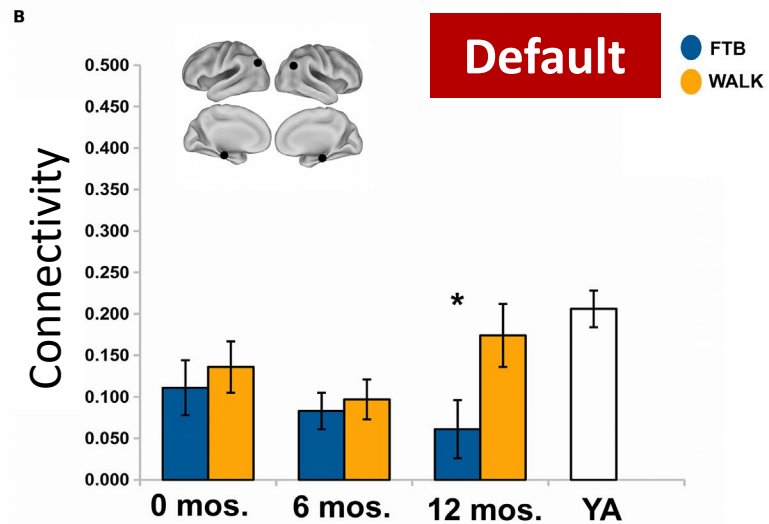
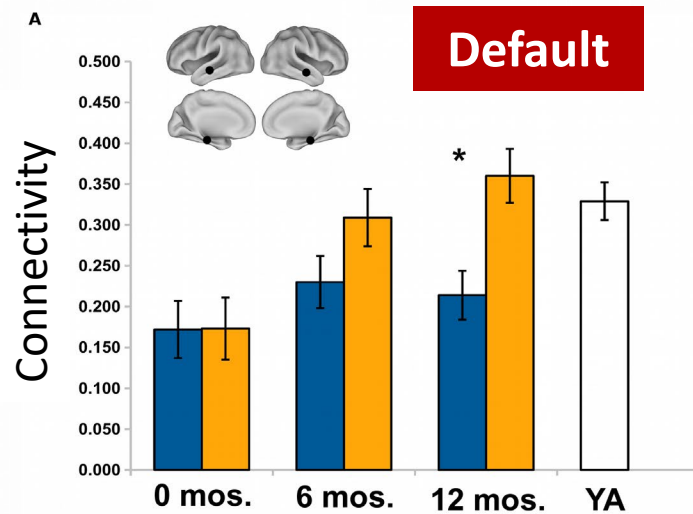
- stable, sustained maintenance of task set
- monitor for errors
- maintain associations between action-outcome

- Rapid, online filtering of attention
- top-down control
- working memory

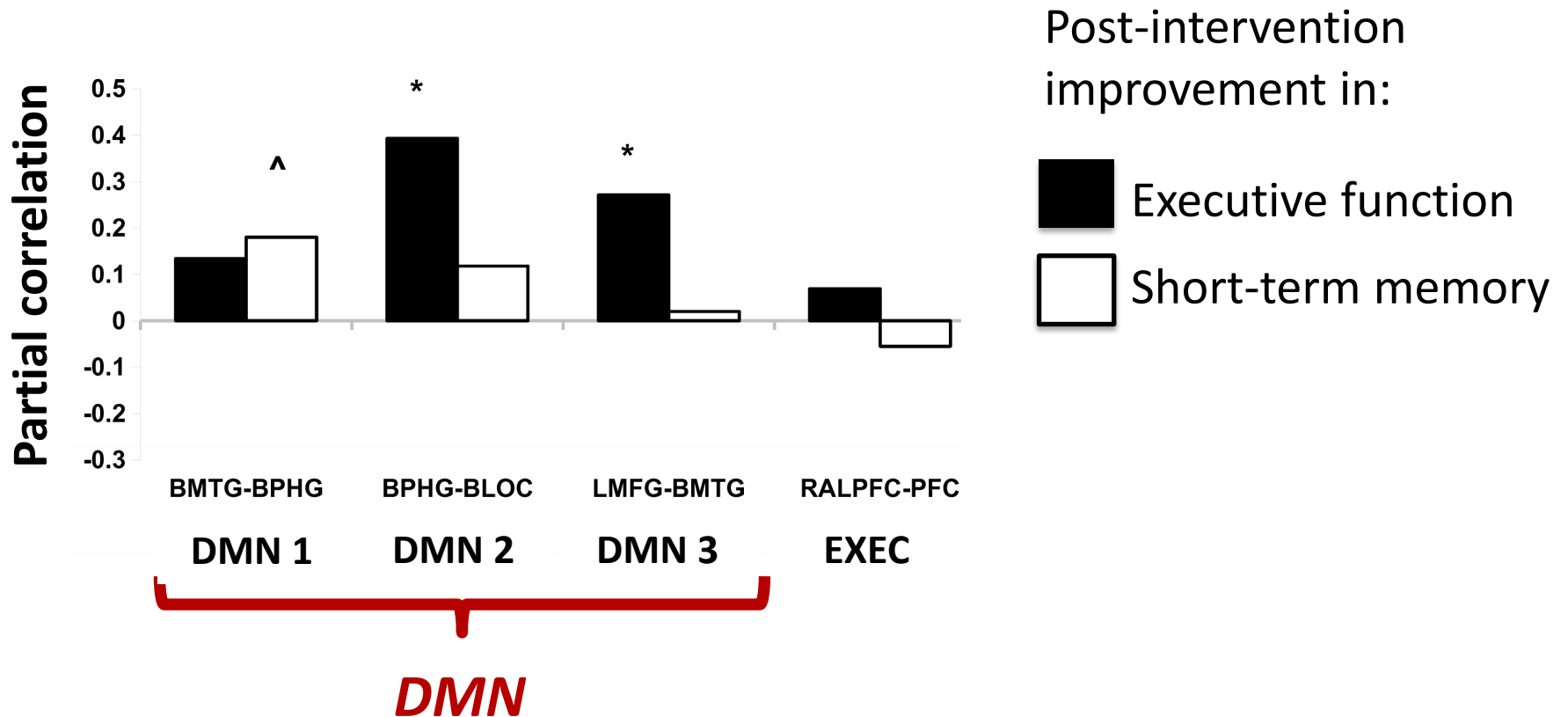


# Improvements in networks post-exercise?

Functional connectivity changes in favor of walking group

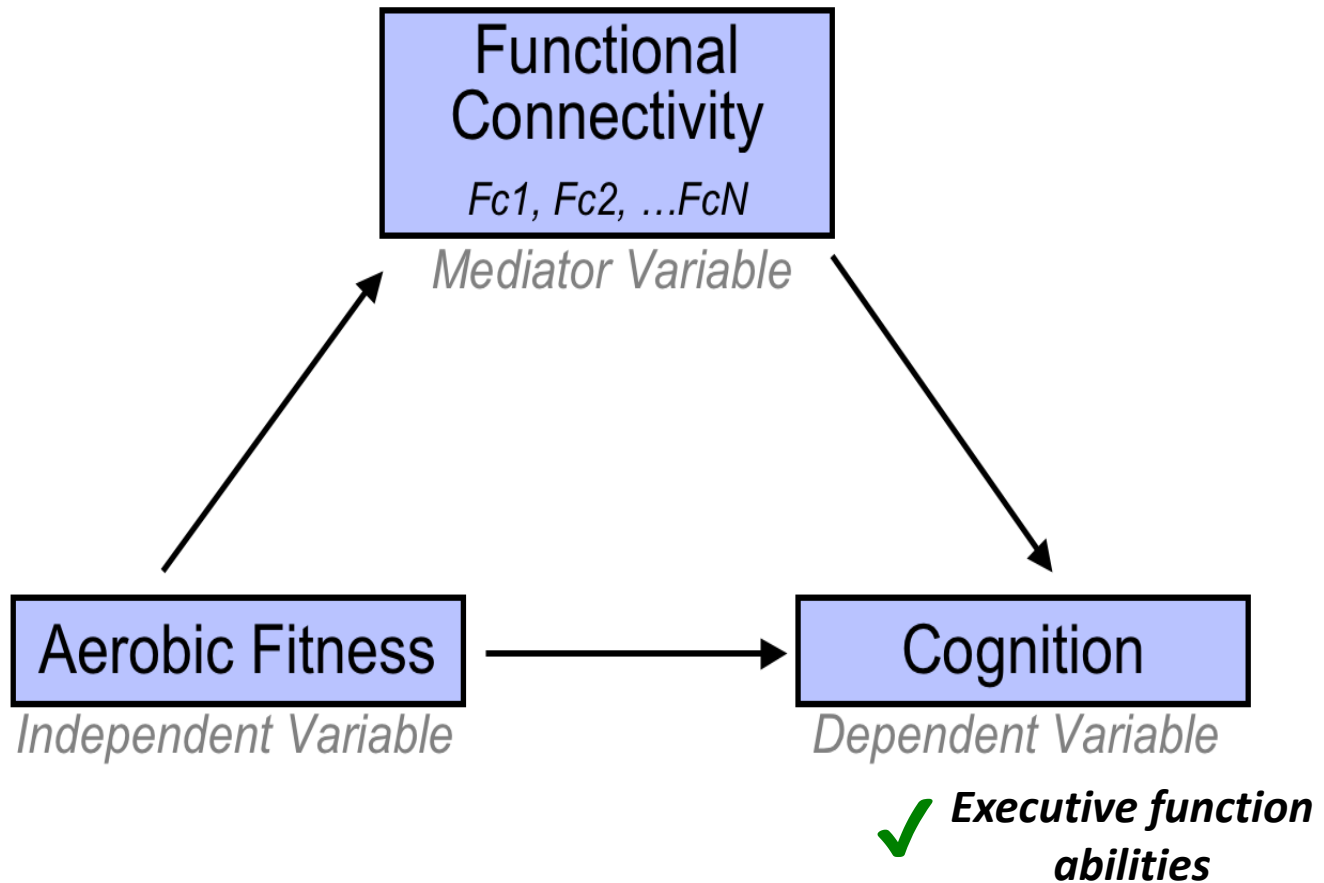


# Brain-Behavior associations



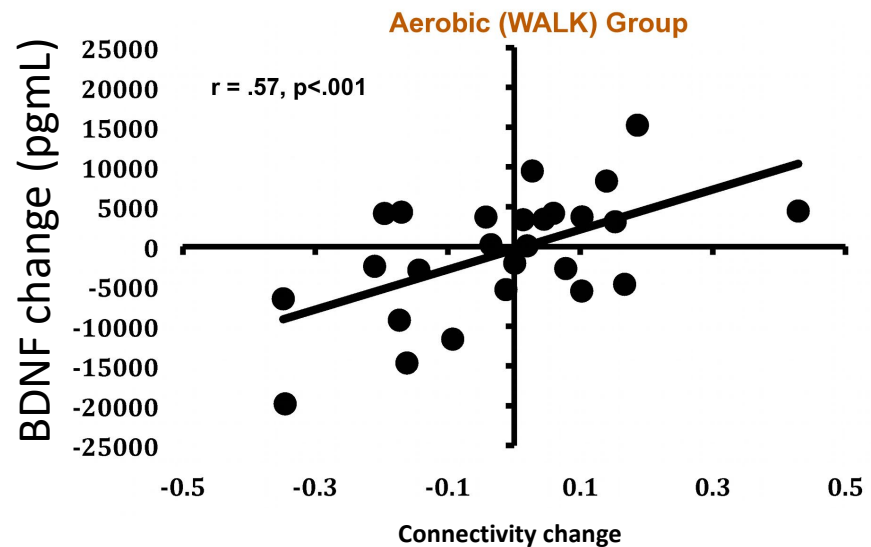
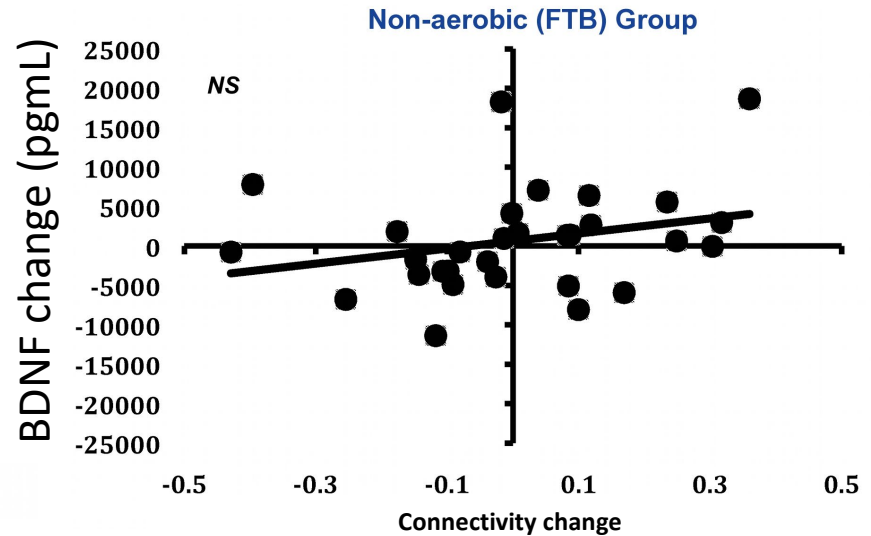
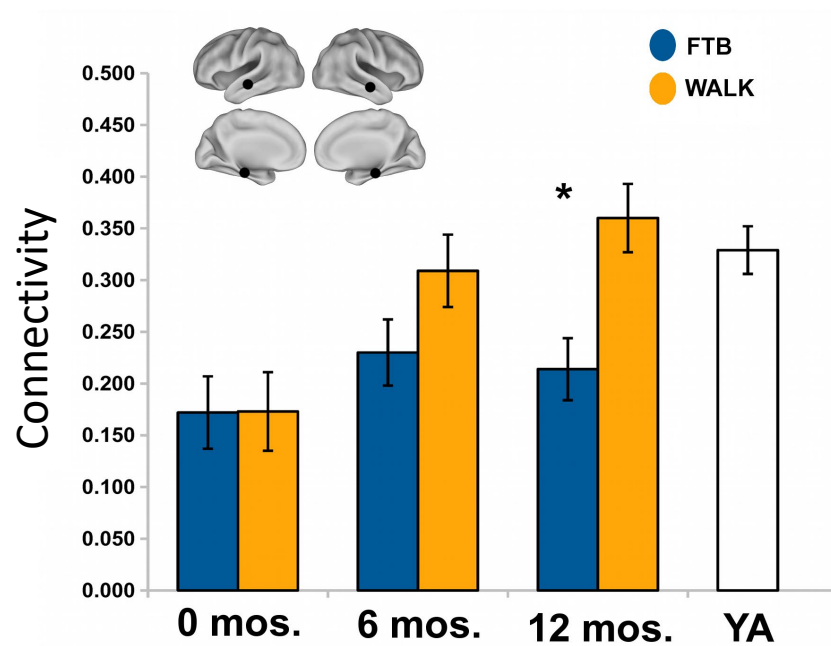
Post-intervention change in connectivity

# Is aerobic fitness associated with better Functional connectivity?



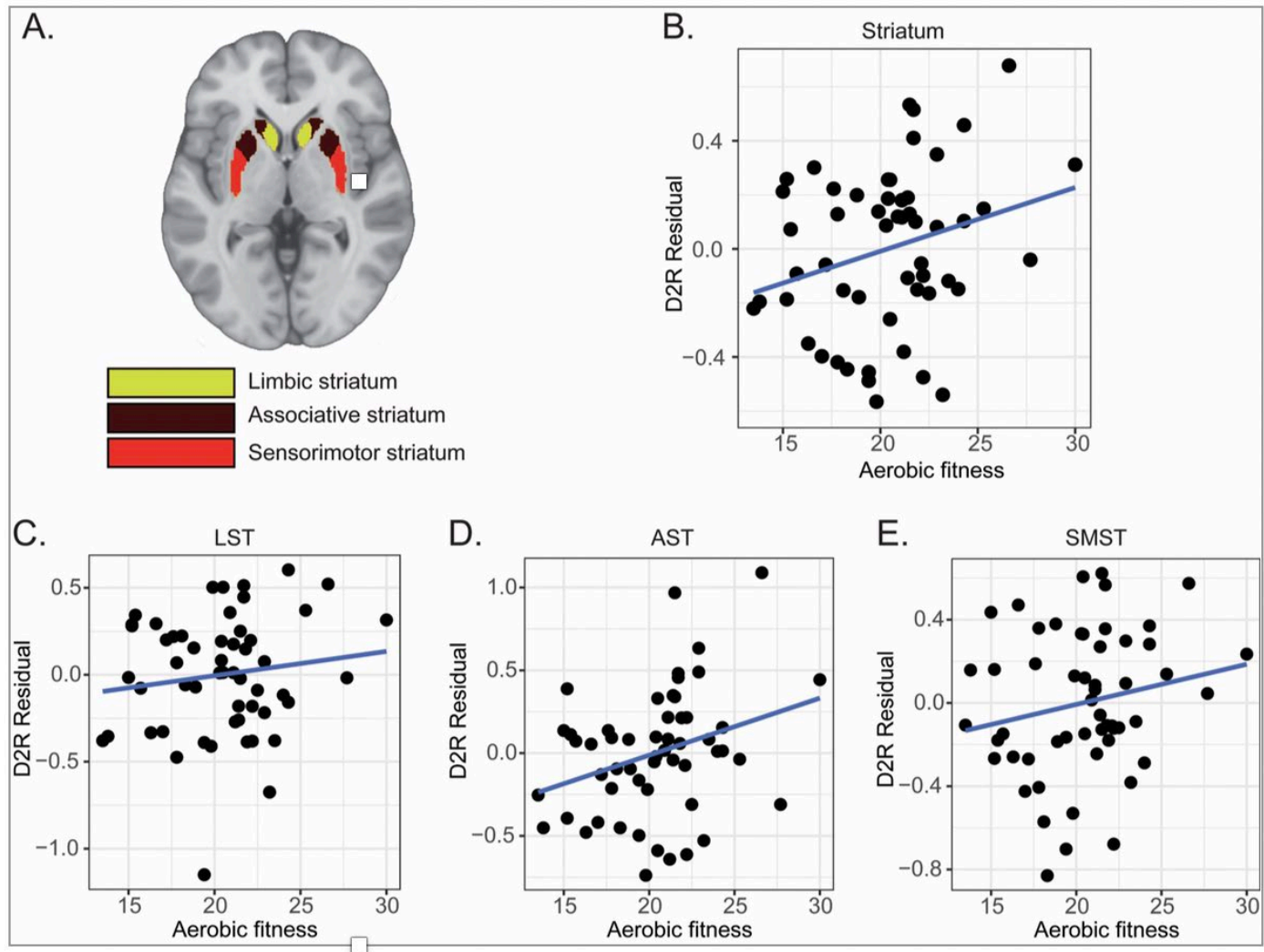
# What are the neurobiological mechanisms for exercise-induced brain plasticity?

## Brain-Derived Neurotrophic Factor (BDNF)

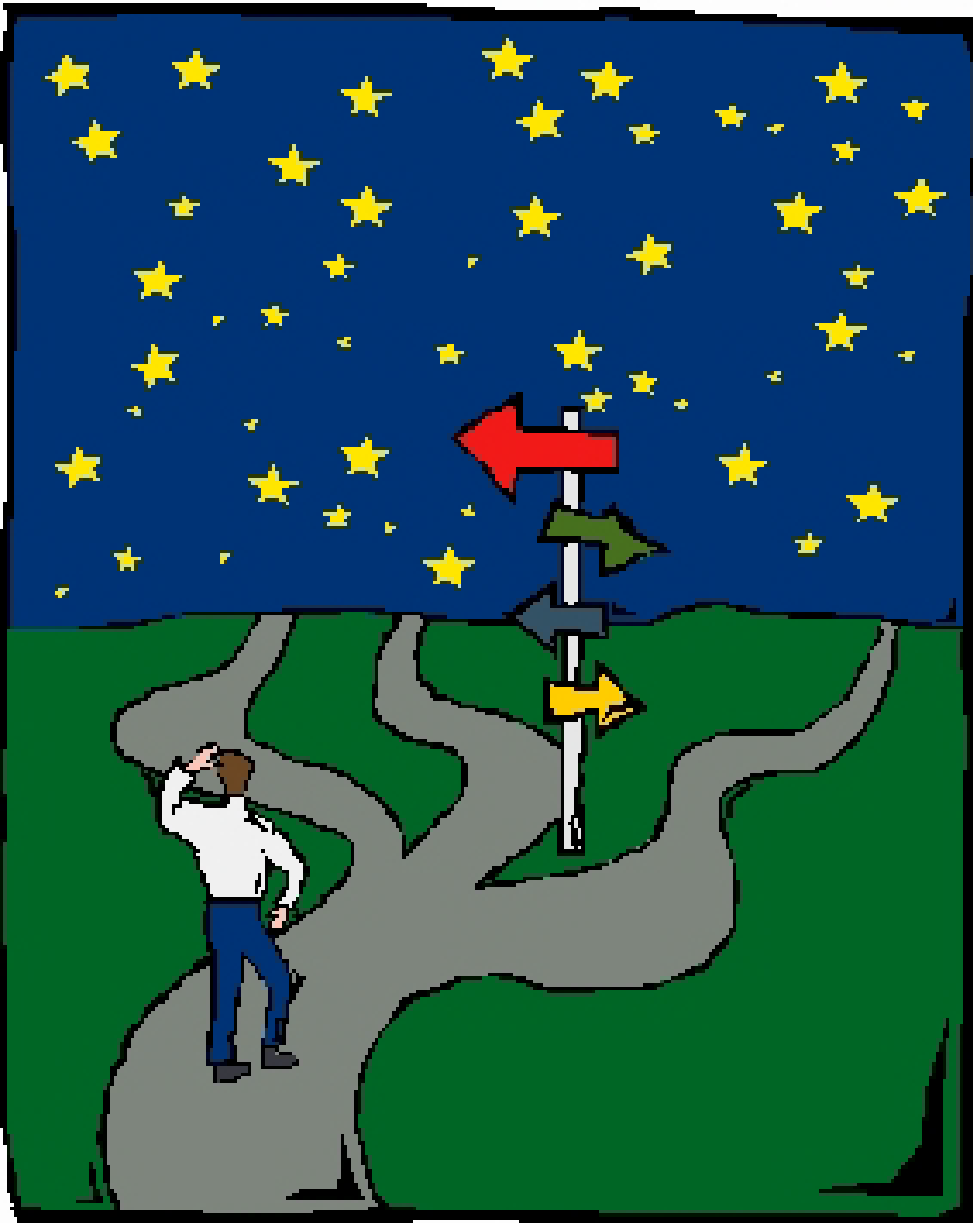


# Higher striatal D2-receptor availability in aerobically fit older adults

Lars S Jonasson<sup>1234\*</sup>, Lars Nyberg<sup>124</sup>, Arthur F Kramer<sup>56</sup>, Jan Axelsson<sup>27</sup>, Katrine Riklund<sup>12</sup>, CJ Boraxbekk<sup>238</sup> (2019)



# Roadmap for Today .....

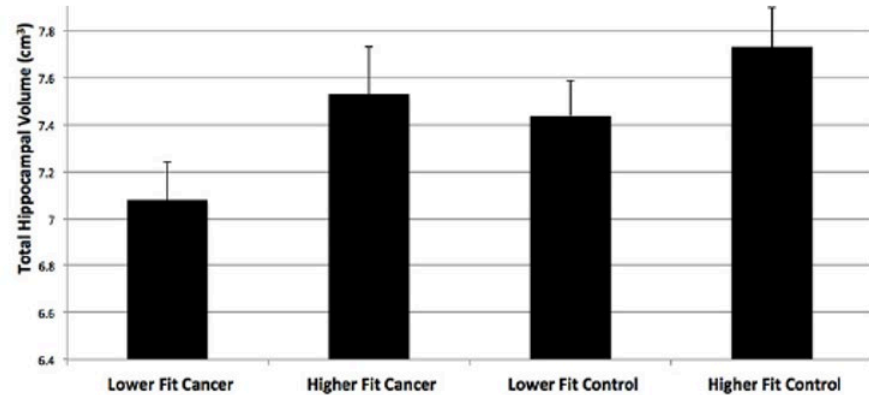


- What do we currently know about the molecular and cellular brain mechanisms of physical activity – animal models.
- Exercise versus cognitive training – and human performance and cognition.
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- **Is there a point of no-return for exercise effects on brain & cognition?**
- Fitness effects across the lifespan.
- What studies need to be done to further advance our understanding of the link between exercise & cognition ?

# Is there a point of no-return with regard to exercise benefits on cognition and brain?

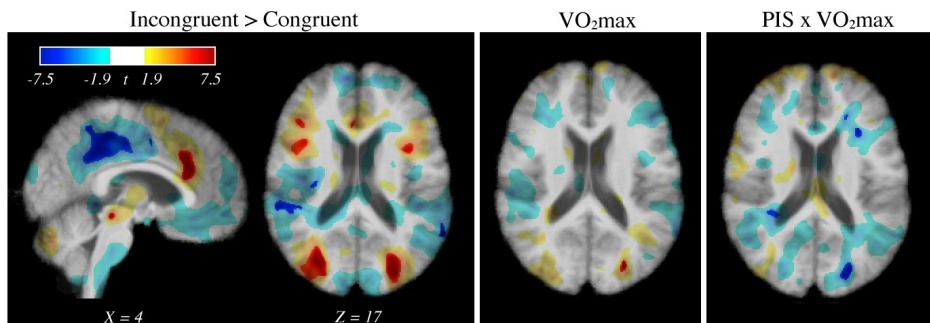
## Cancer Patients

Chaddock-Heyman et al, 2015



## Parkinson's Patients

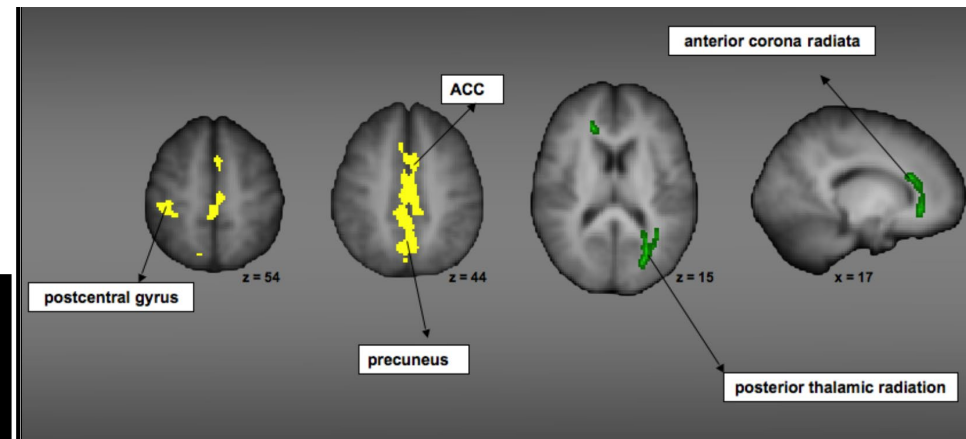
Uc et al, (2008)



- Fitness related differences in fMRI activation pattern are correlated with measures of attentional control and inhibition

Prakash et al (2009)

## Multiple Sclerosis Patients



- Differences in gray matter volume & white matter integrity (via DTI) as a function of fitness are correlated with processing speed

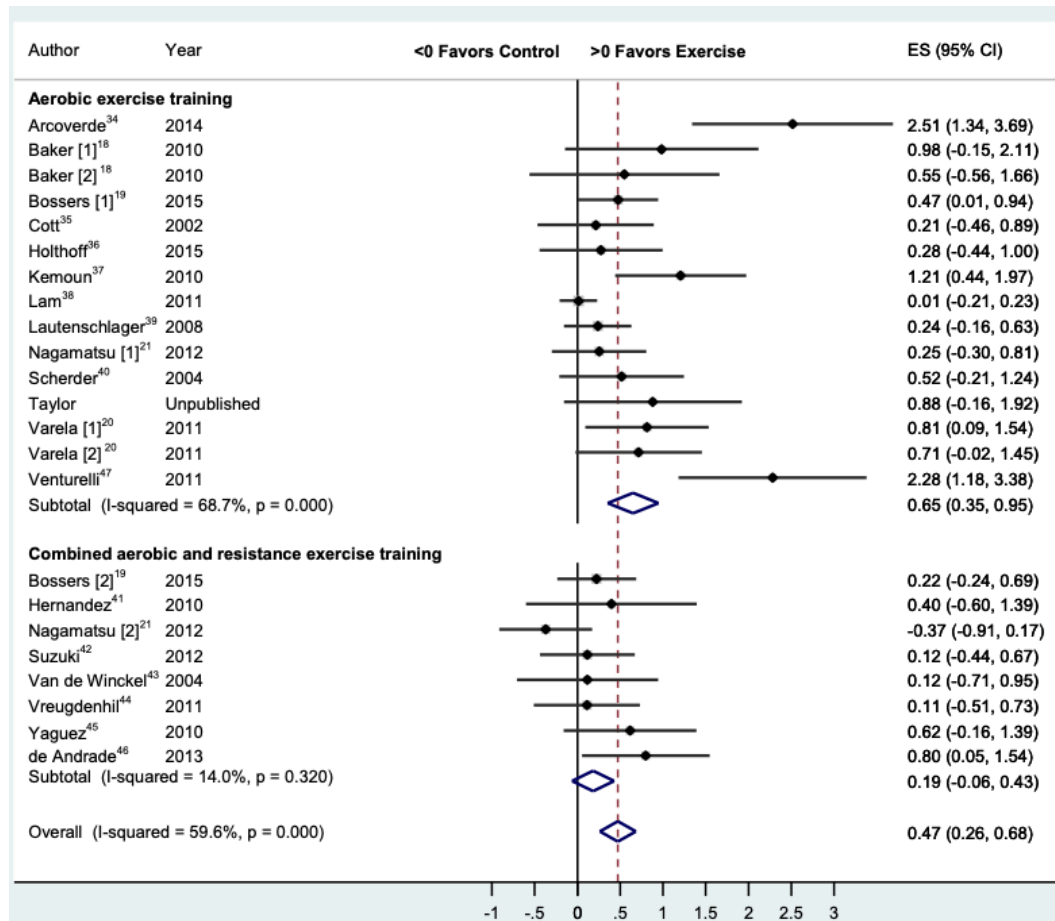


What about those at risk for dementia and those with forms of dementia?

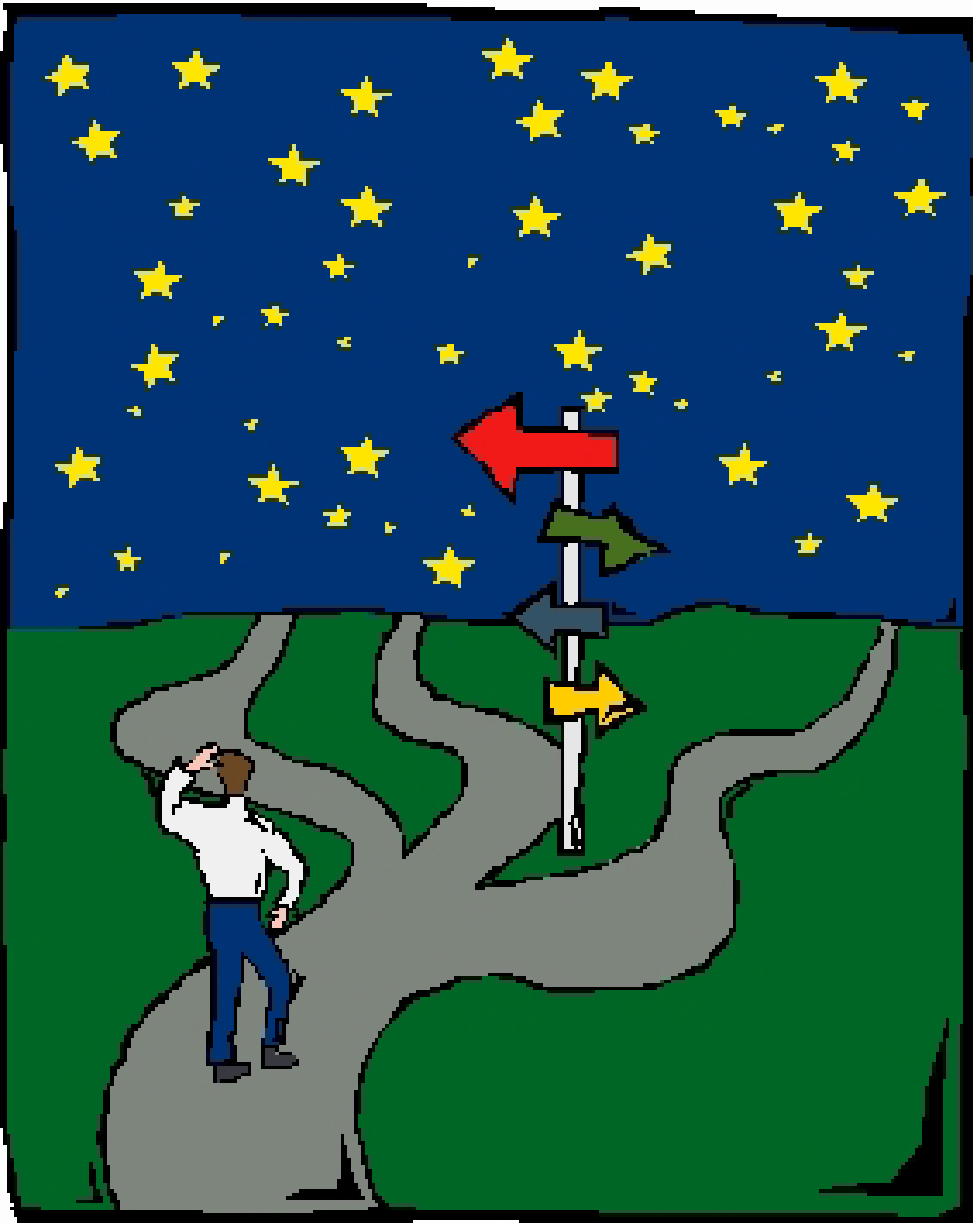
# What about those at risk for dementia and those with forms of dementia?

## Can Exercise Improve Cognitive Symptoms of Alzheimer's Disease?

Gregory A. Panza, MS,<sup>\*†</sup> Beth A. Taylor, PhD,<sup>\*†</sup> Hayley V. MacDonald, PhD,<sup>‡</sup> Blair T. Johnson, PhD,<sup>§</sup> Amanda L. Zaleski, MS,<sup>\*†</sup> Jill Livingston, MS,<sup>¶</sup> Paul D. Thompson, MD,<sup>†</sup> and Linda S. Pescatello, PhD\* 2018

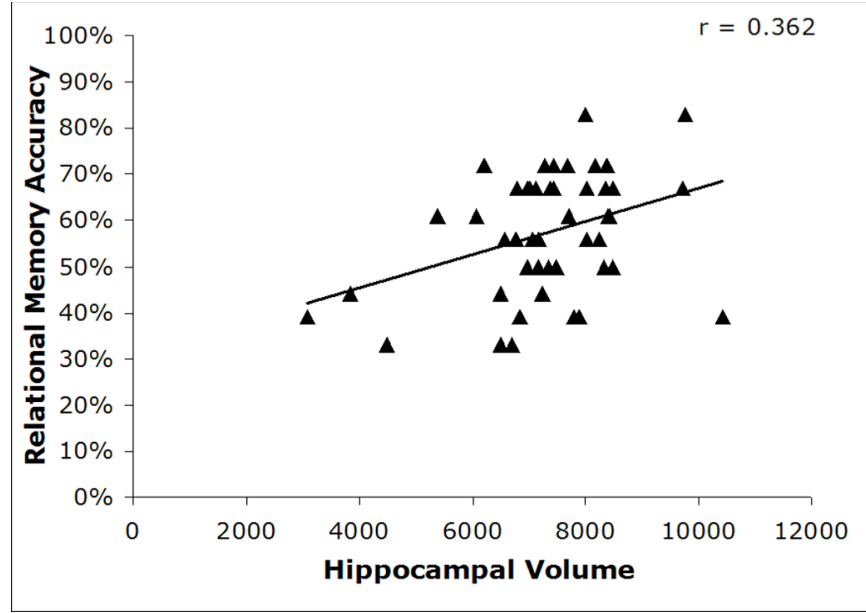
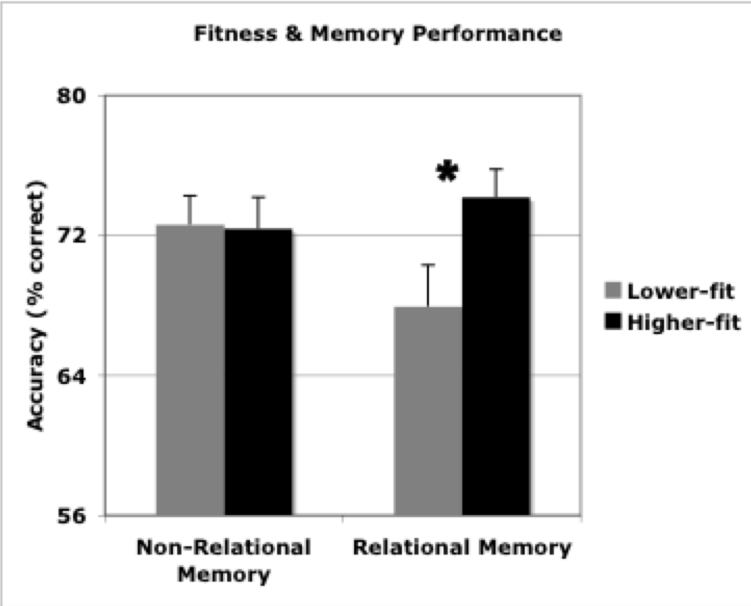
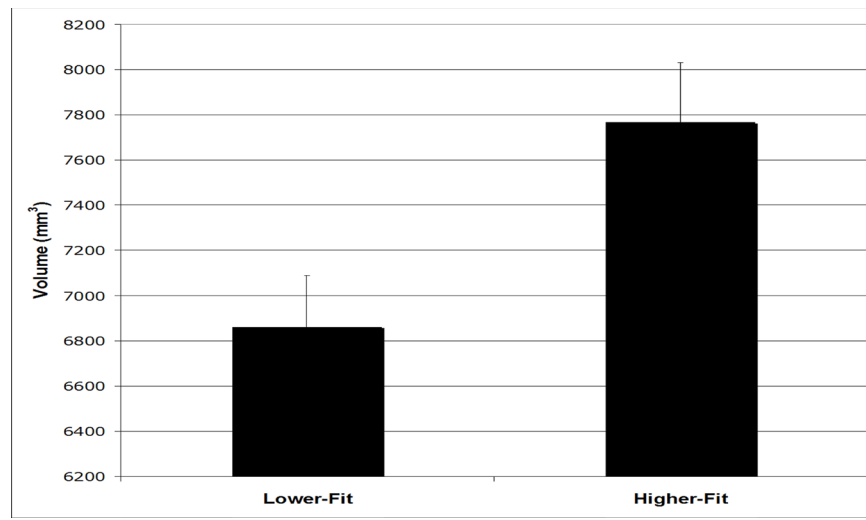
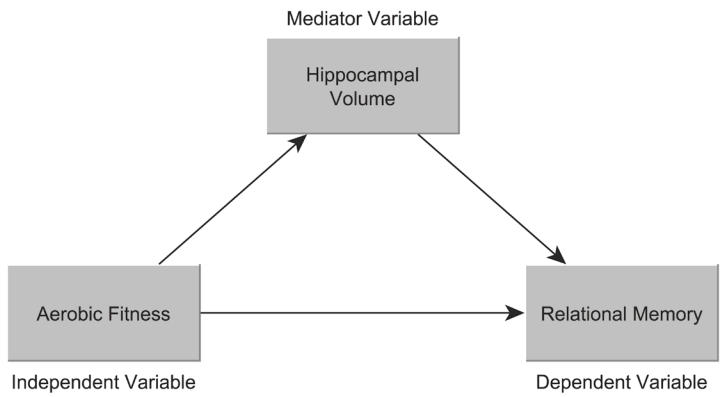


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# What about exercise effects on brain & cognitive function of children?

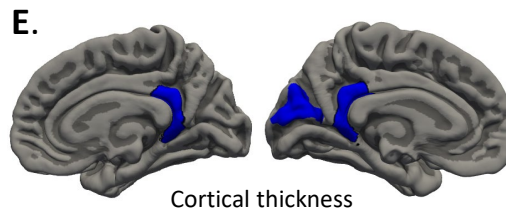
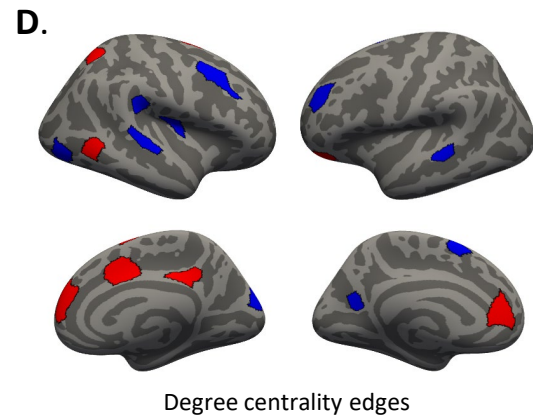
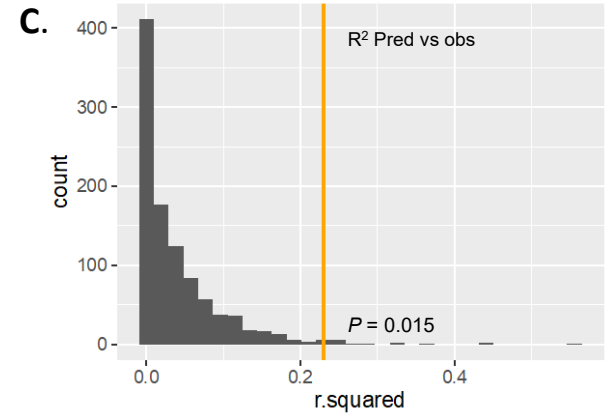
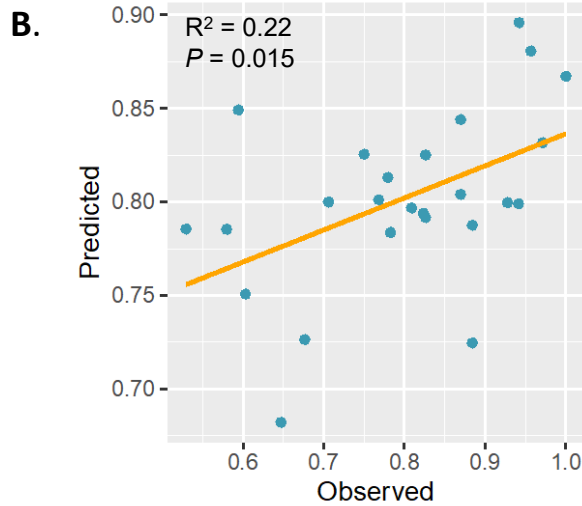
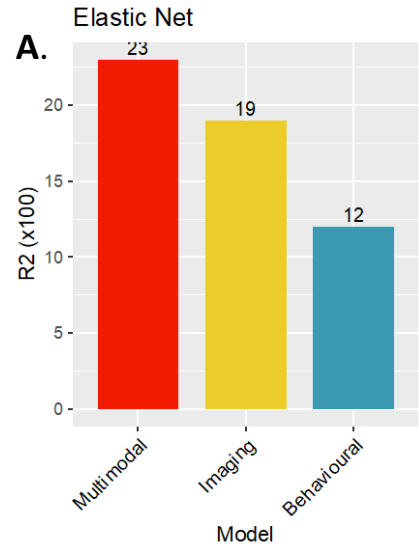


Some examples of how we might  
enhance our study of lifestyle benefits on  
healthy brains and minds --

With machine learning and other  
varieties of Artificial Intelligence

# PREDICTING ADHERENCE TO EXERCISE PROGRAMS

## Elastic Net models aid prediction



Add networks to these edges

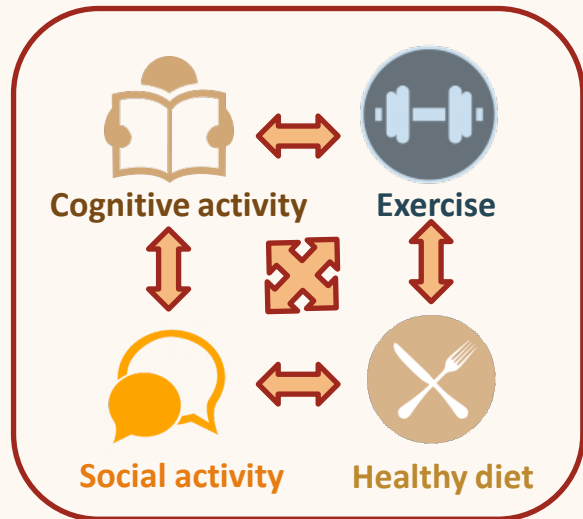
**F.**

Non-imaging predictors	Direction
Gait-self efficacy	Positive
Big 5 extroversion	Negative
Perceived sleep quality index	Negative
Sex	Negative (female)
Employment	Positive (retired)
Pattern comparison score	Negative

**B** through **C** illustrates results from the Multimodal model

$R^2$  represents the squared correlation between the observed (train data) and predicted (test data) values

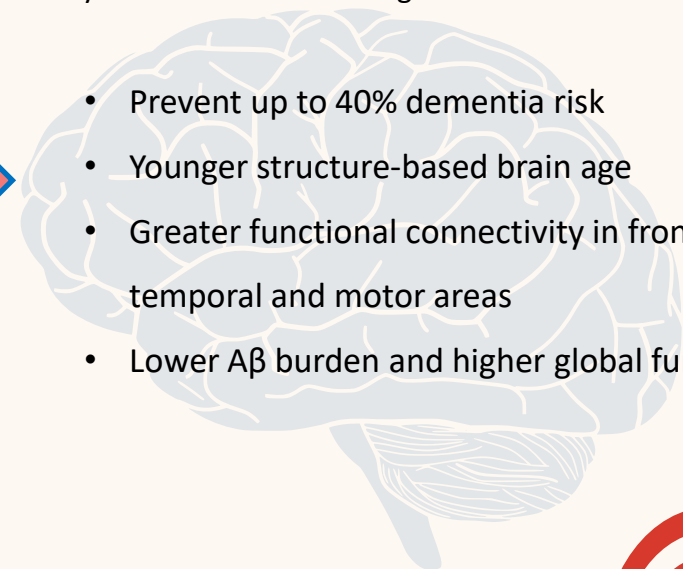
# To what extent does adherence to good *lifestyle practices* (for high risk older adults) relate to brain and mental health?



Healthy older adults



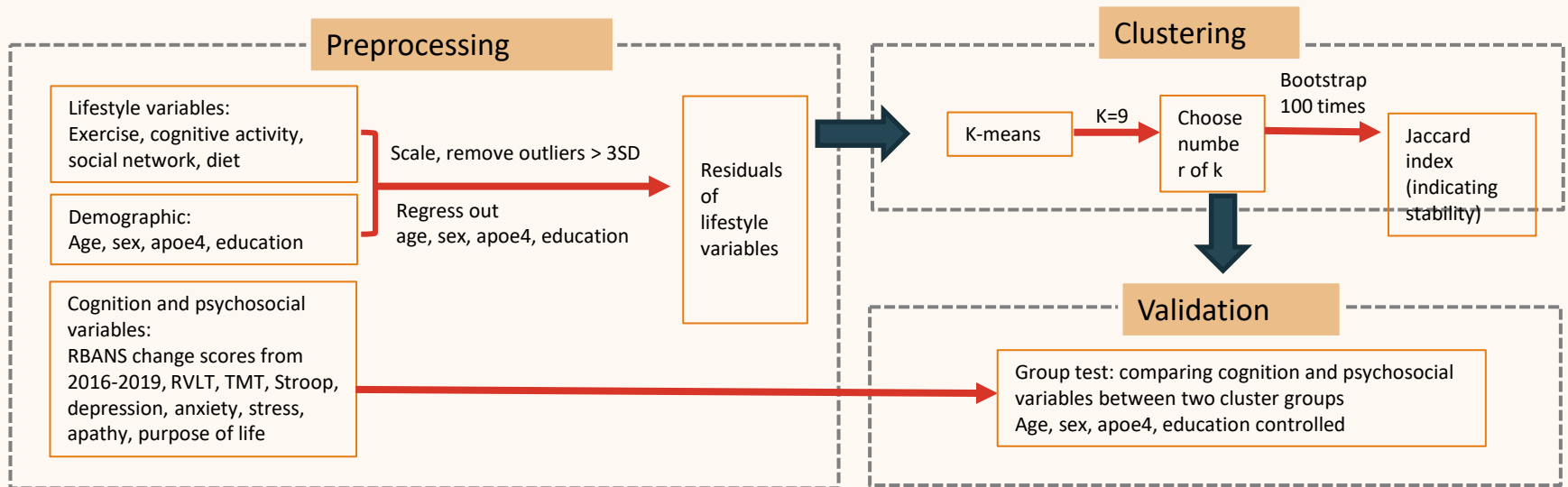
High-risk older adults ?



- Prevent up to 40% dementia risk
- Younger structure-based brain age
- Greater functional connectivity in frontal, temporal and motor areas
- Lower A $\beta$  burden and higher global functions

# Do individuals have different profiles of multidomain lifestyle adherence?

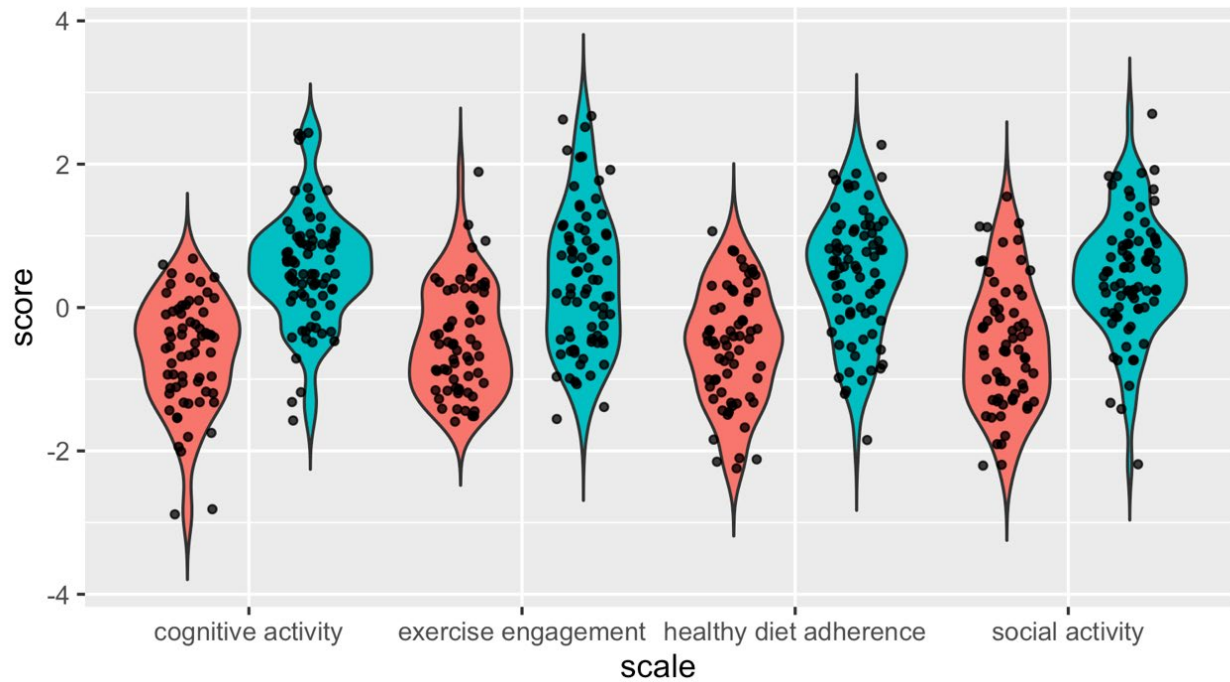
## K-means clustering process





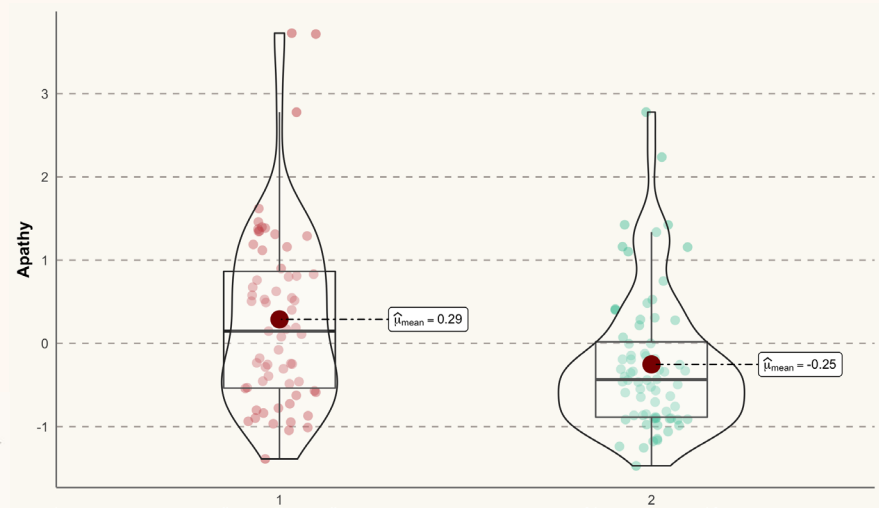
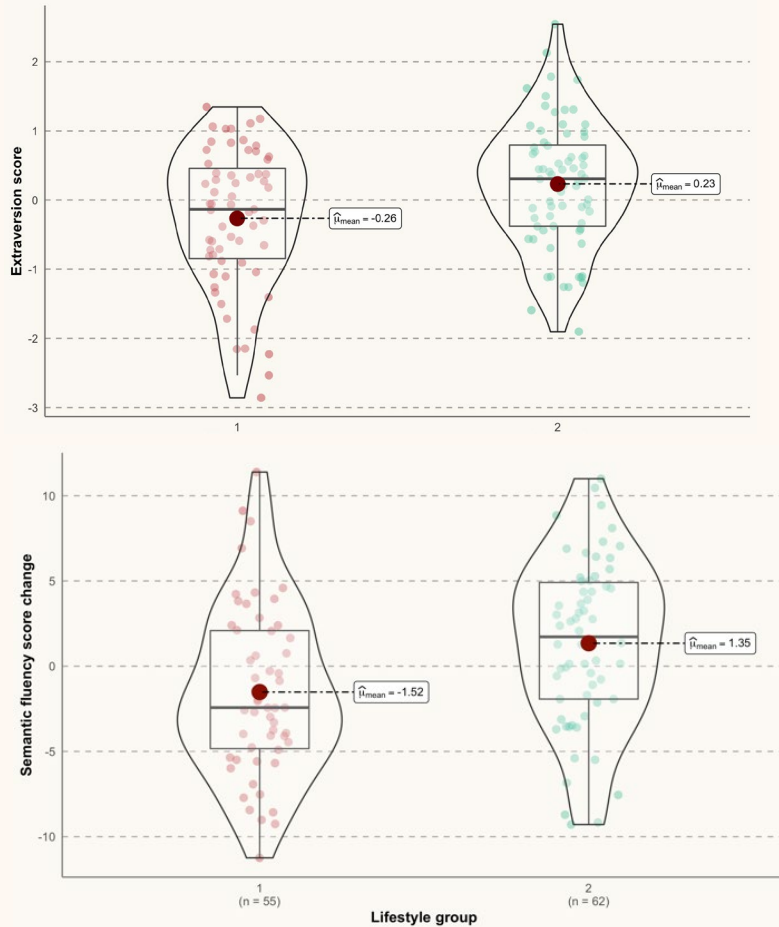
# Individuals have different profiles of multidomain lifestyle adherence

K-means results



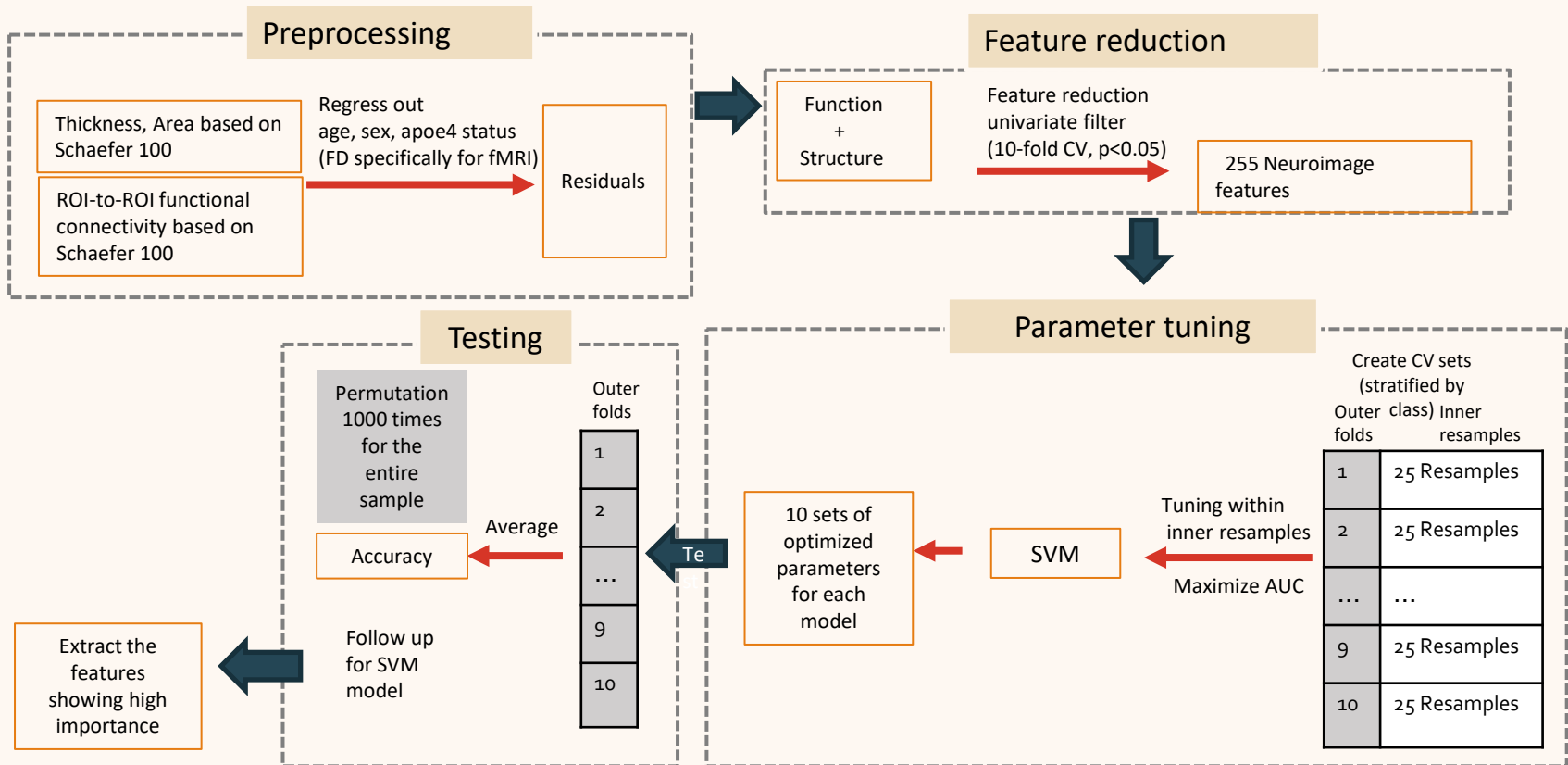
- Adherence group
- Non-adherence group

# Different profiles of multidomain lifestyle adherence are associated with different features of mental health and cognition



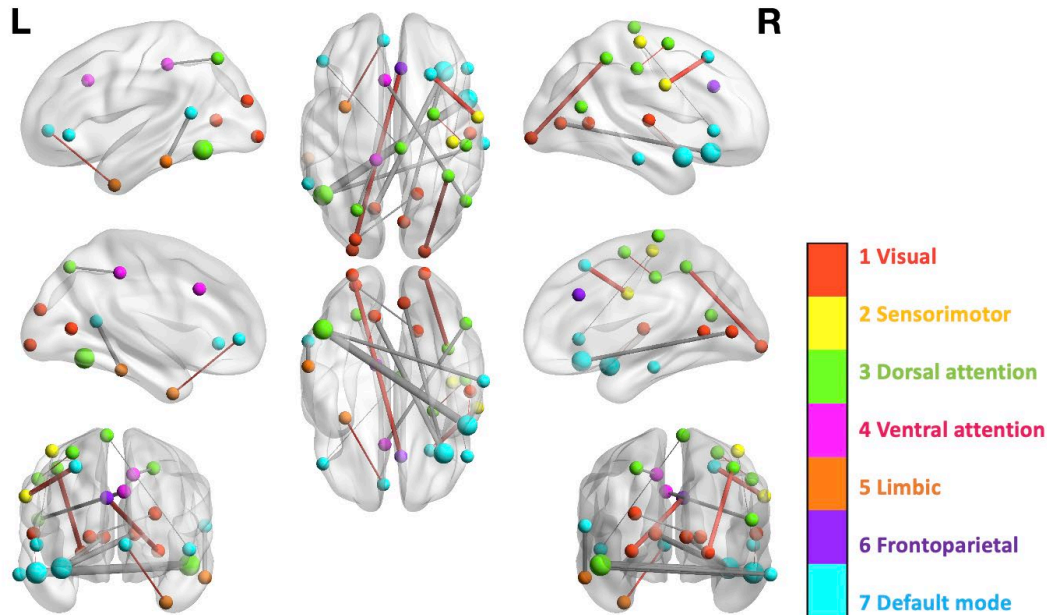
- Non-adherence group
- Adherence group

# Do distinct lifestyle profiles show neurobiological differences ?



## Do lifestyle profiles have neurobiological distinctions?

### Study One

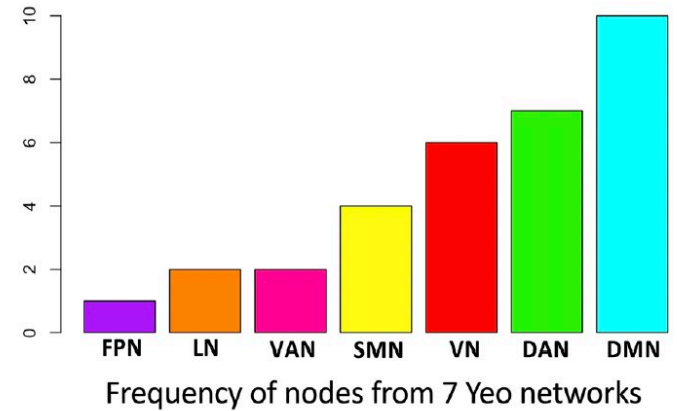


#### Red edges:

Adherence group had greater functional connectivity values than Non-adherence group

#### Grey edges:

Non-adherence group had greater functional connectivity values than adherence group



# Multidimensional Digital Biomarker of Cognitive Health:

Unobtrusive and Continuous Monitoring of Cognitive Changes Using Smartphones

# Maciej Kos

F99/K00 NIH Fellow

Why is cognitive health important? Trajectories of cognitive impairments

Subjective  
cognitive  
impairment

Mild  
cognitive  
impairment

Alzheimer's  
disease

## Problem:

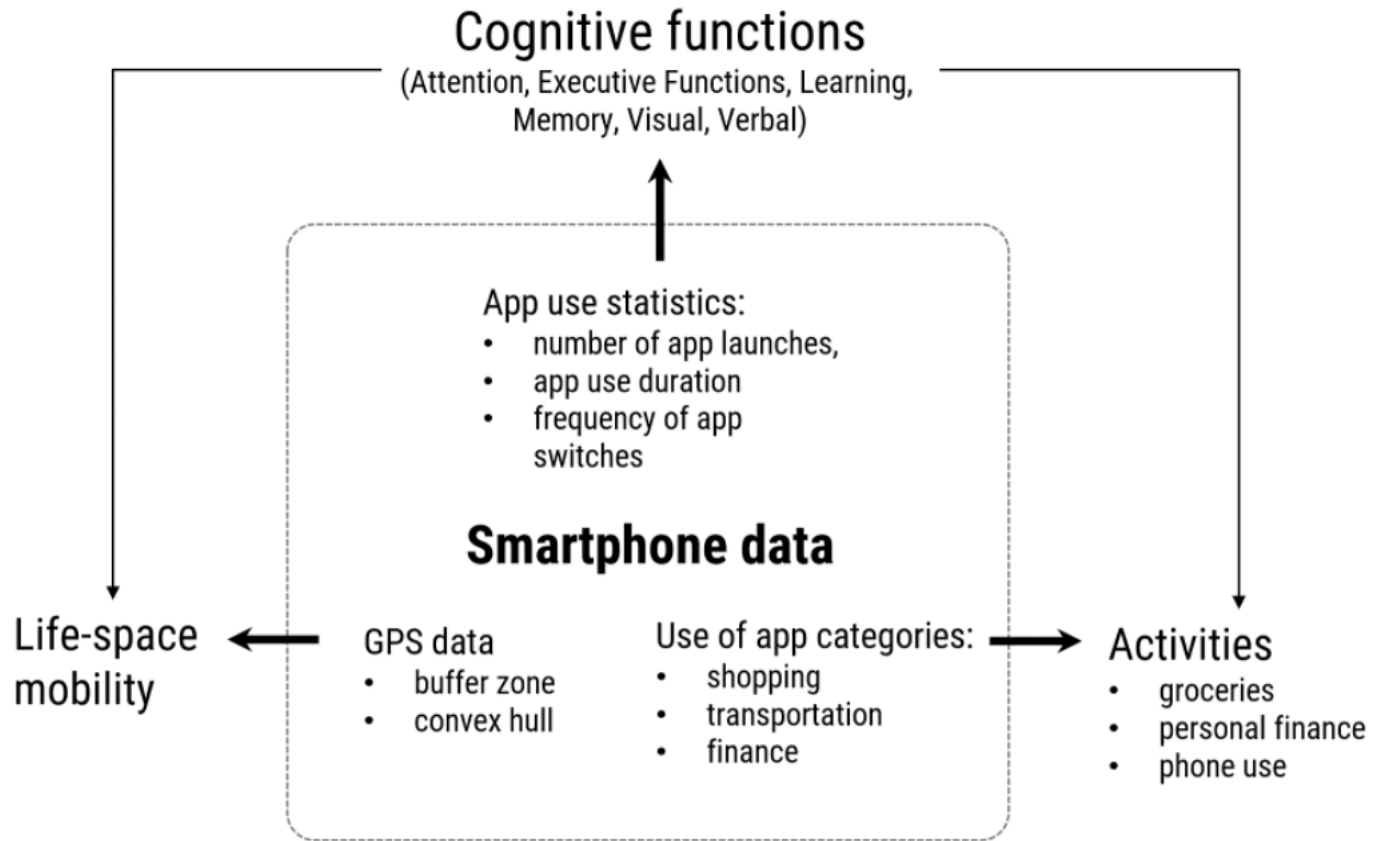
No robust and affordable way to monitoring subtle changes in cognitive functions over time to:

- develop efficacious therapeutics
- personalize treatments

## Proposed solution (long term):

Multidimensional digital biomarker of cognitive changes to augment existing methods:

- combines AI/ML methods with mechanistic modeling
- based on smartphone data collected continuously and unobtrusively

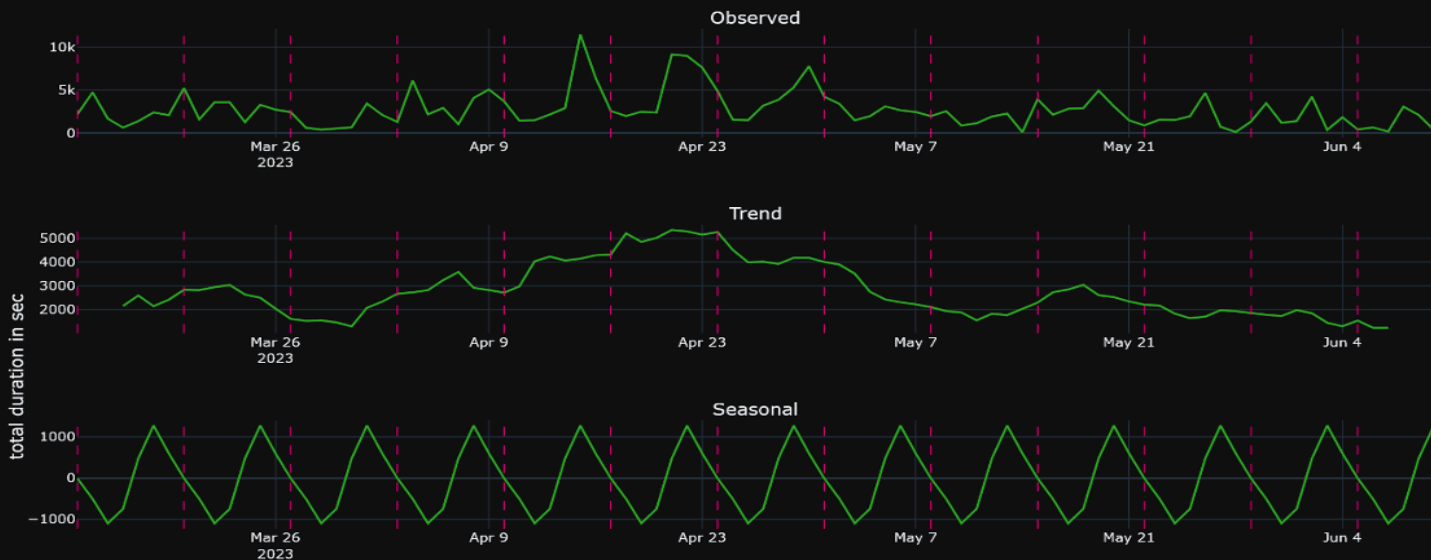


## Seasonal decomposition of app use

**Participant: 13** | App category: **social** | Measure: **total duration** in sec (daily)

Seasonal additive decomposition with a period of 7 days; observed = trend + seasonal + residual

Seasonal peaks correspond to Saturdays. Pink vertical dashed lines represent Mondays.



Smartphone based estimates of IADLs significantly correlate with self-reports of IADLs.

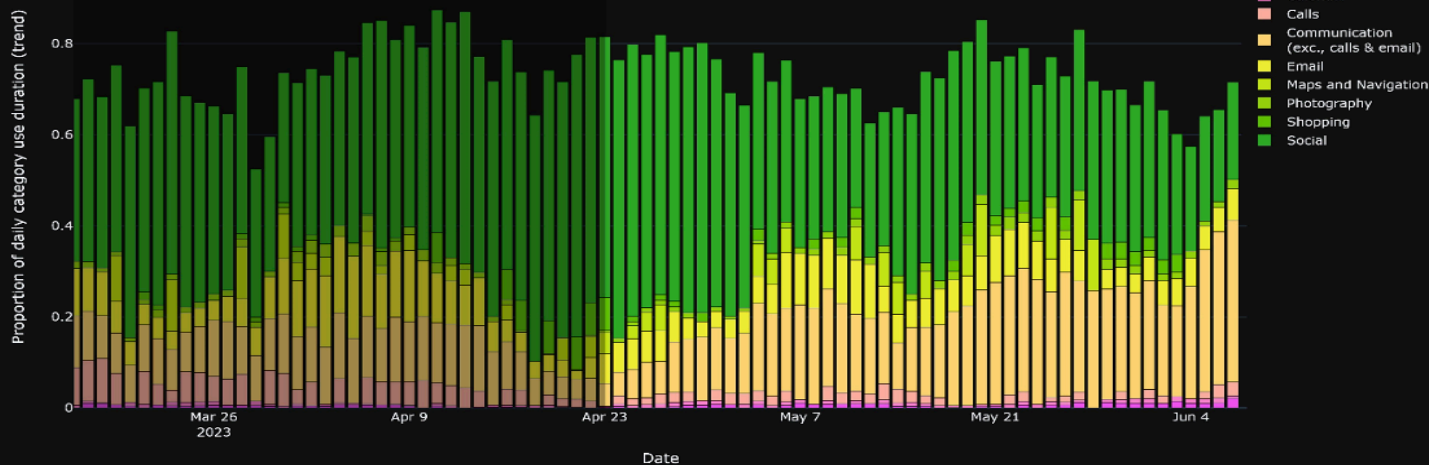
## Replacement Effect

**Participant: 13** | **Proportion of daily category use duration (trend)** [Only select categories shown]

'Proportion of daily category use duration' is a daily total duration of using apps in category as a proportion of daily total durations in all categories.

Shown is a trend obtained from a seasonal additive decomposition with a period of 7 days.

Decrease in the proportion of time spent on using **social** apps.  
Corresponding increase in the use of **communication** apps.



# To summarize:

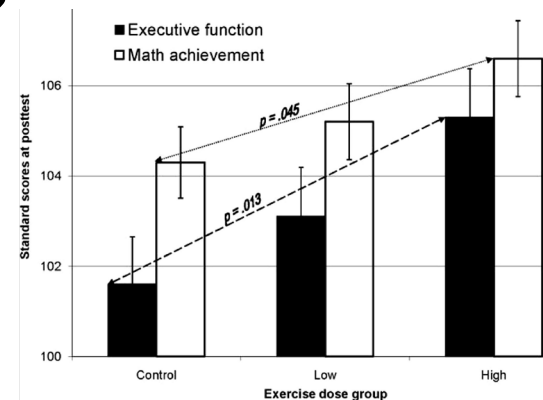
## **Relatively brief fitness interventions (with older couch potatoes – and hi & low fit kid's ....):**

- Improve a variety of perceptual & cognitive abilities
- Increase brain volume in regions which normally show age-related decline - including the hippocampus (and increases are often correlated with performance improvements)
- Change functional brain networks, often in the direction of younger adults, associated with improvements in cognition & performance.
- Promising fitness cognitive & brain effects with children.
- Not covered today but .... exercise decreases anxiety and depression and increase self esteem & self efficacy



# Where to go from here?

- Understanding boundary conditions on exercise effects (e.g. Sink et al., 2015 – 24 month RCT)
- More study combining different interventions
  - Social, physical activity, cognitive activity, diet ....
  - When, how much, sequence .....
  - Common or separate mechanisms/pathways?
- Genetic moderators of the relationship between interventions and cognition & brain
- What factors predict adherence to exercise?
- Beyond the laboratory door .....

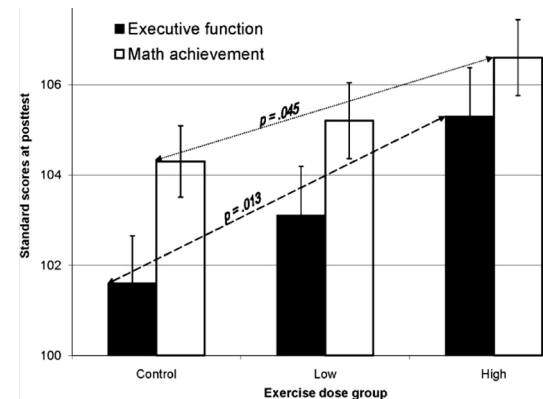


Davis et al, 2011

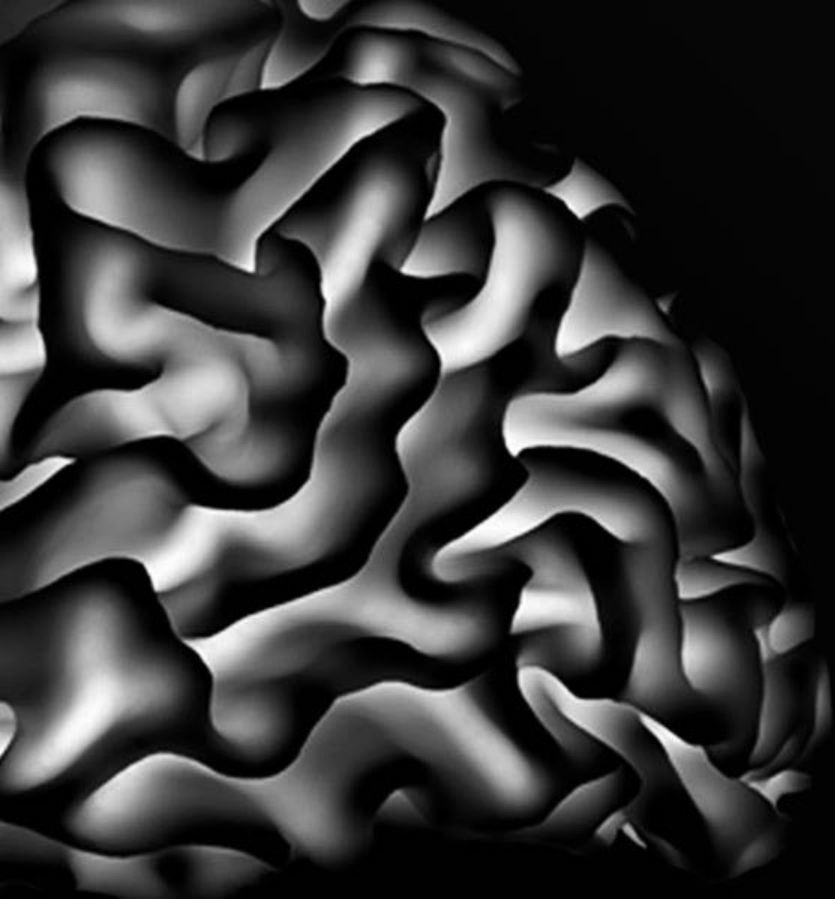
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Davis et al, 2011



# INSIGHT

A Comprehensive, Multidisciplinary  
Brain Training System



**BECKMAN INSTITUTE**  
FOR ADVANCED SCIENCE AND TECHNOLOGY  
UNIVERSITY OF ILLINOIS AT URBANA-CHAMPAIGN



A Promise for Life



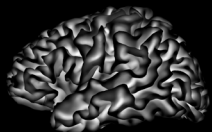
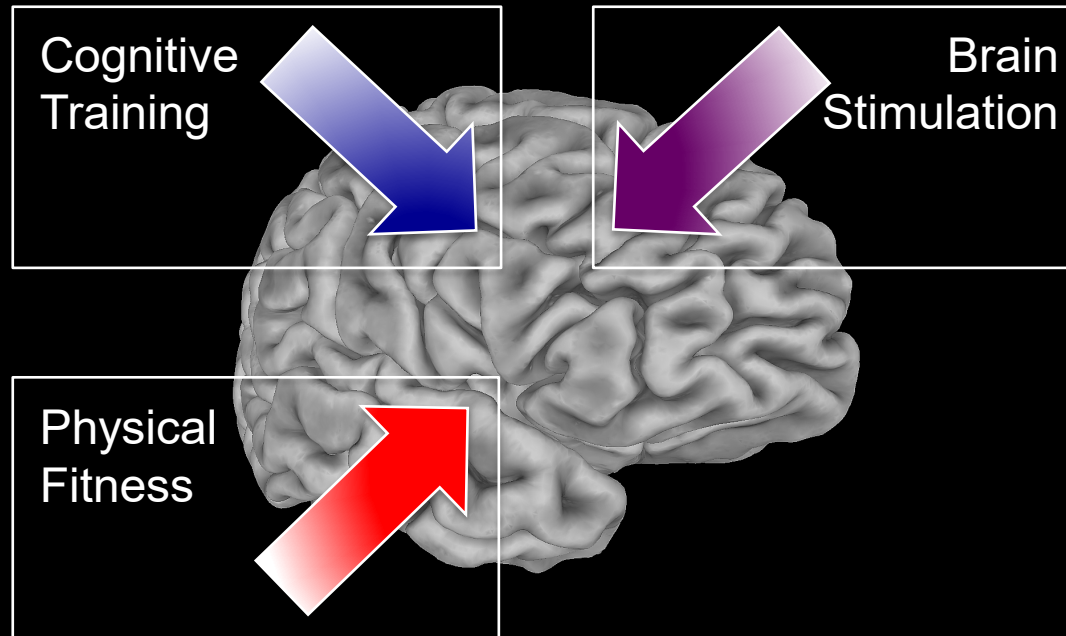
Human-Centered Engineering



The City  
University  
of  
New York



# INSIGHT Project Phase 1a

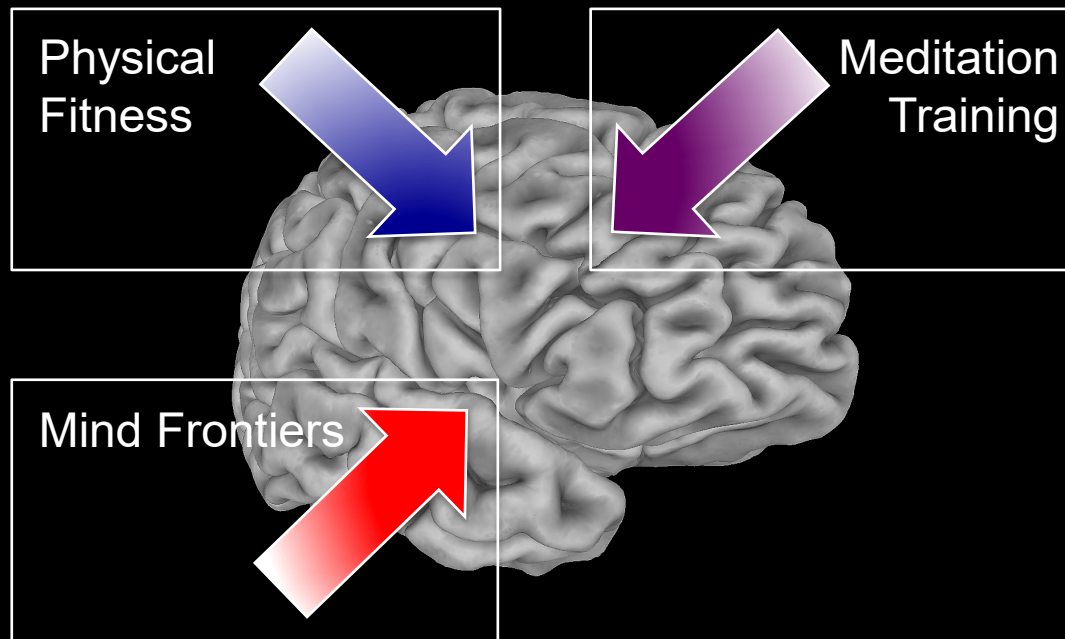


**INSIGHT**

Comprehensive Brain Training

# Experimental Design: Phase 1b

- Three experimental groups
  1. Physical Fitness
  2. Physical Fitness + Mind Frontiers
  3. Physical Fitness + Mind Frontiers + Mindfulness Meditation



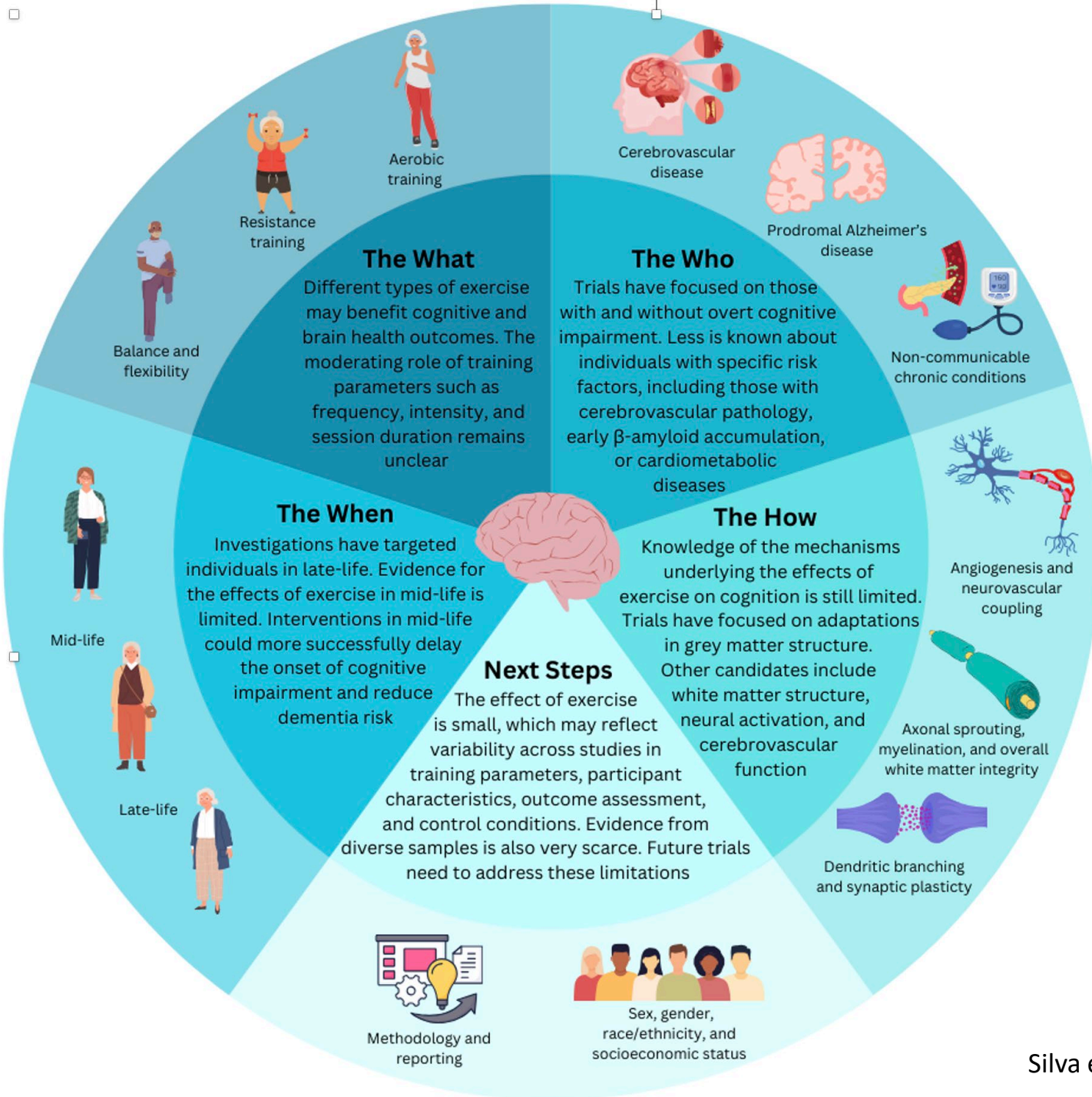
# Summary – INSIGHT brain health study

Transfer	Intervention	Cohen's <i>d</i> (0.50)	Measure
Decision Making	Fitness only	0.74	Composite Score
Decision Making	Fitness only	0.57	Social Norms
Decision Making	Fitness only	0.47	Under/over Confidence
Decision Making	Mind Frontiers + Fitness	0.58	Composite Score
Decision Making	Mind Frontiers + Fitness	0.49	Social Norms
Decision Making	Mind Frontiers + Fitness + Meditation	0.45	Composite Score
Decision Making	Mind Frontiers + Fitness + Meditation	0.86	Resist Sunk Cost
Analogical Reasoning	Fitness only	0.50	Accuracy

Significant effect size increases of up to 0.86

(relative to the active control) in multiple measures of transfer to **Adaptive Reasoning and Problem Solving**

> 250 18 to 44 year old participants



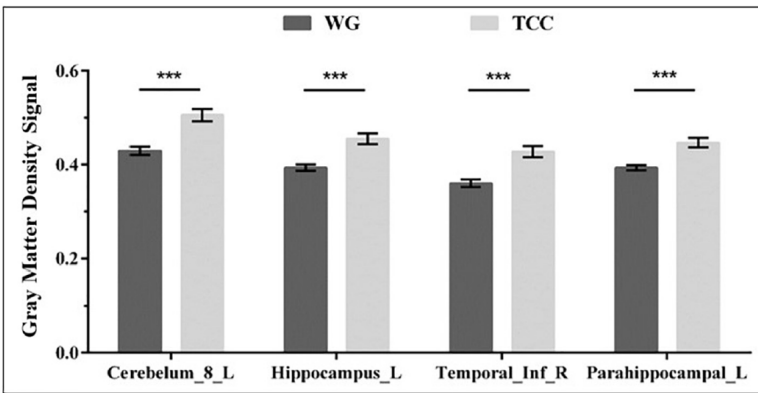
# The End!





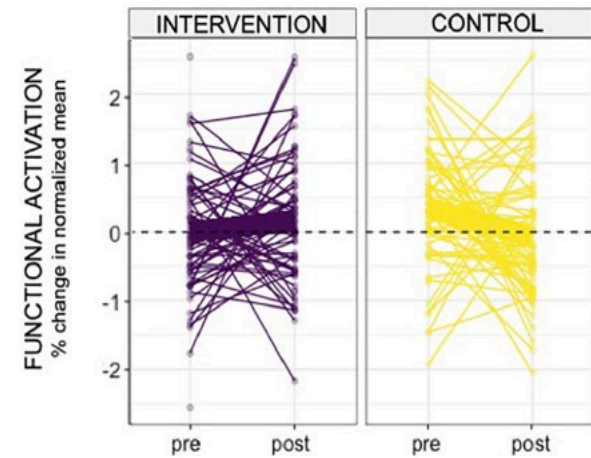
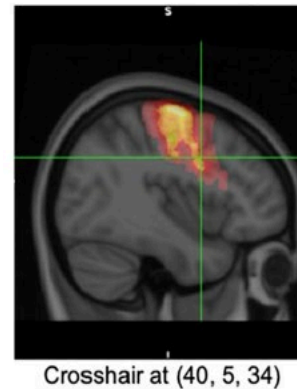
# Regular Tai Chi Practice Is Associated With Improved Memory as Well as Structural and Functional Alterations of the Hippocampus in the Elderly

Chunlin Yue<sup>1</sup>, Qian Yu<sup>2</sup>, Yanjie Zhang<sup>2</sup>, Fabian Herold<sup>3</sup>, Jian Mei<sup>1</sup>, Zhaowei Kong<sup>4</sup>, Stephane Perrey<sup>5</sup>, Jiao Liu<sup>6</sup>, Notger G. Müller<sup>3</sup>, Zonghao Zhang<sup>1</sup>, Yuliu Tao<sup>1</sup>, Arthur Kramer<sup>7,8</sup>, Benjamin Becker<sup>9</sup> and Liye Zou<sup>2,10\*</sup> 2020



# Can a Theater Acting Intervention Enhance Inhibitory Control in Older Adults? A Brain-Behavior Investigation

Aishwarya Rajesh<sup>1,2\*</sup>, Tony Noice<sup>3</sup>, Helga Noice<sup>3</sup>, Andrew Jahn<sup>4</sup>, Ana M. Daugherty<sup>5</sup>, Wendy Heller<sup>1,2</sup> and Arthur F. Kramer<sup>1,6</sup> 2021





# Center for Cognitive & Brain Health

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## OVERARCHING VISION:

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*To use our knowledge of brains, minds & bodies to guide current and future generations to happier healthier lives through novel interdisciplinary interventions.*

To accomplish this, we investigate the effects of lifestyle, early life experiences, the arts, the aging process, demographics, genetics and health behaviors on brain and cognition.

We bring to bear multiple perspectives and methodologies to explicate mechanisms of brain health and disease to improve the lives of individuals across the lifespan:

- computational modeling
- state of the art multimodal neuroimaging
- sophisticated behavioral paradigms
- Interventions
- analyses of large data sets

Currently include 18 interdisciplinary faculty (and lots of post-doc's and students) from 4 different colleges – with more to come .....

# Collaborators

## University of Illinois

- Aga Burzynska
- Laura Chaddock
- Neal Cohen
- Eddie McAuley
- Sean Mullen
- Brad Sutton
- Aron Barbey
- Jeff Woods
- Neha Gothe
- Dominika Pindus

## University of Pittsburgh

- Kirk Erickson

## Ohio State

- Ruchika Prakash

## University of Umea

- L. Jonasson, L. Nyberg et al

## Northeastern Univ.

- Chuck Hillman
- Meishan Ai
- Tim Morris
- Sue Whitfield-Gabrieli
- Maya Geddes

## Johns Hopkins

- Michelle Carlson
- George Rebok

## University of Grenada

- F. Ortega, I. Esteban-Cornejo, P. Sollis-Urra and many other team members

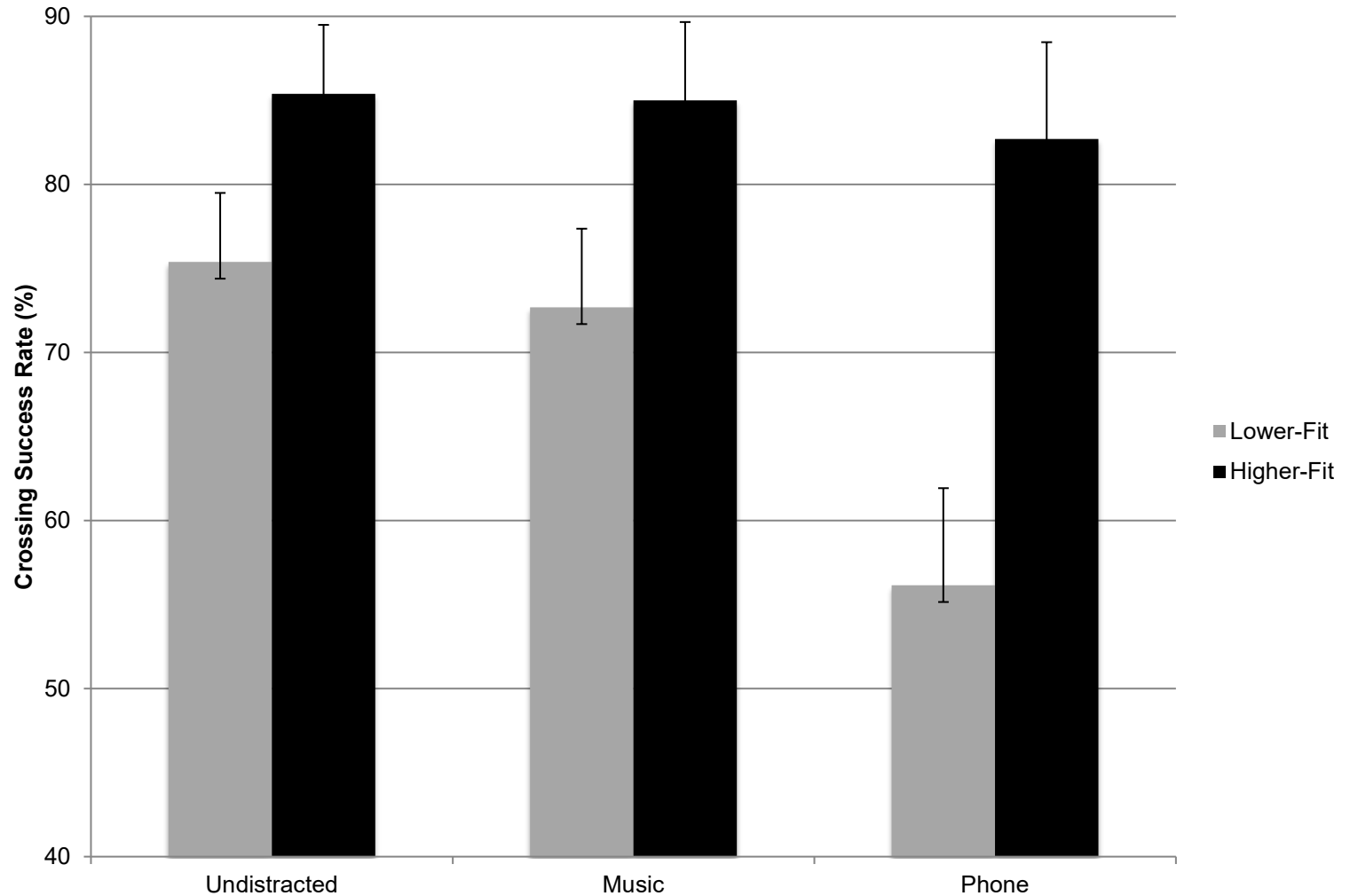
## University of Iowa

- Michelle Voss

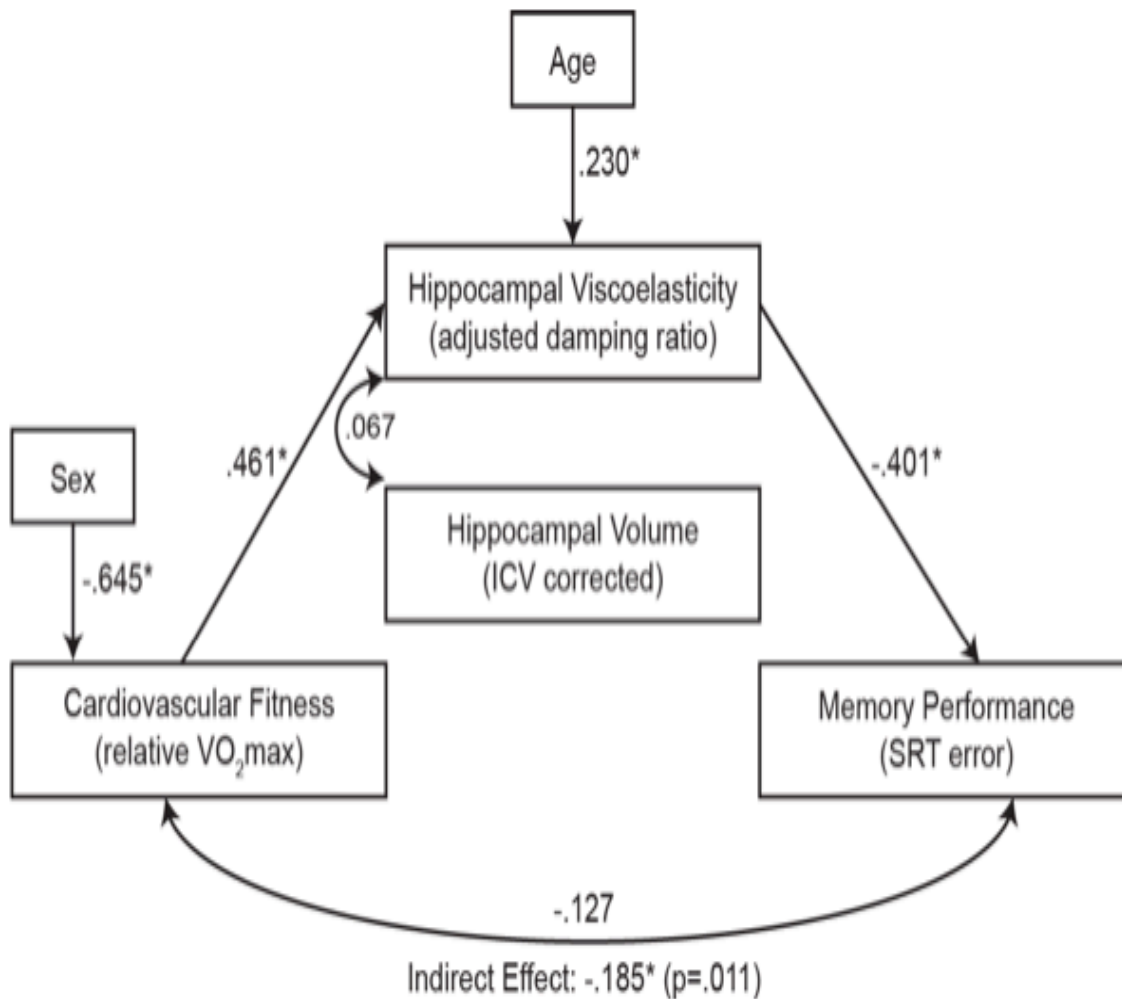
What about implications for the real-world ?



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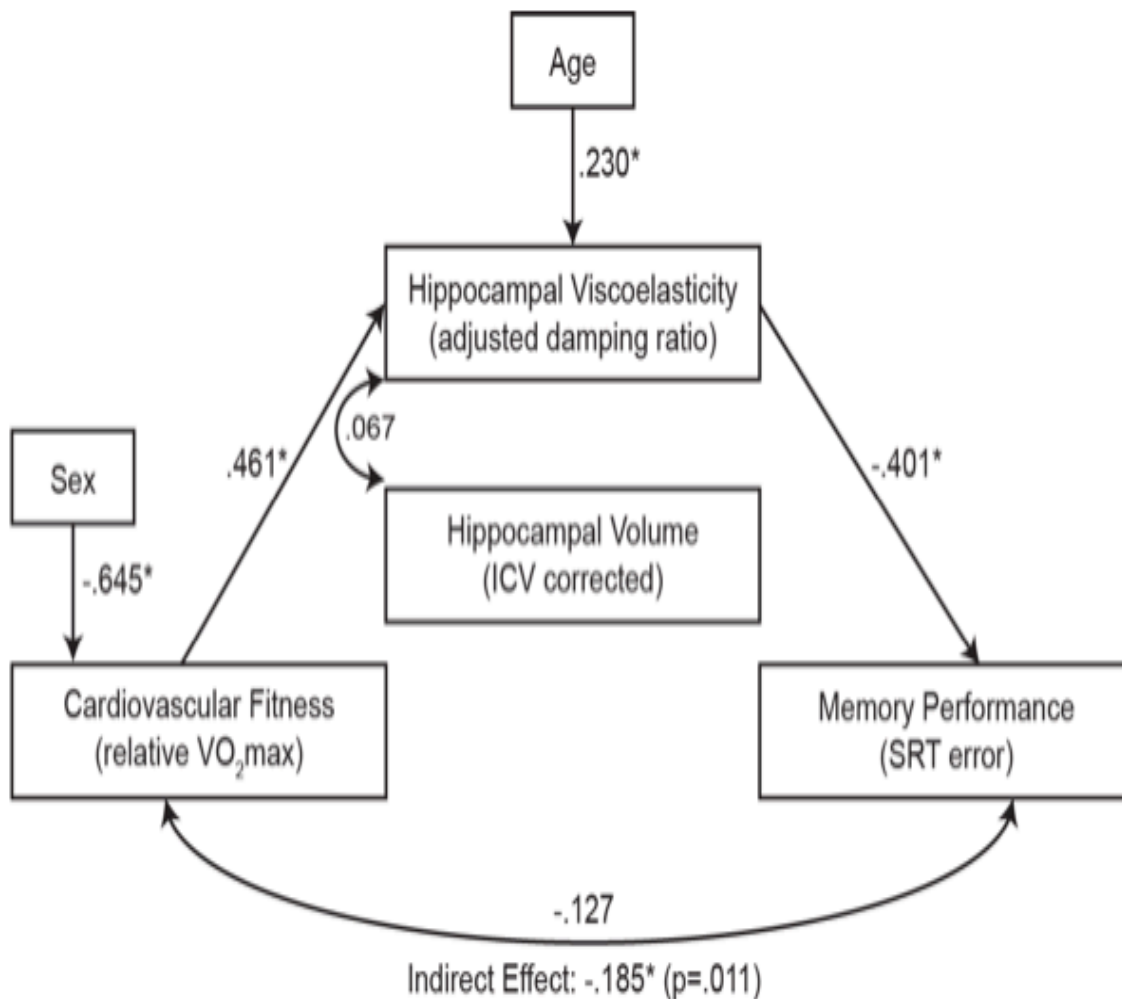


Some new tools &  
measures for  
studying, fitness,  
brain and  
cognition and .....



Schwarb et al (2017)

**Fig 4.** Path model testing the effect of aerobic fitness on relational memory mediated by hippocampal  $\xi'$  accounting for hippocampal volume. Regression path values are standardized coefficients. Asterisks indicate significance ( $p < .05$ ).



Also individual differences in variability in the fMRI (BOLD) signal is useful in predicting & tracking exercise benefits for cognitive & brain health

**Fig 4.** Path model testing the effect of aerobic fitness on relational memory mediated by hippocampal  $\xi'$  accounting for hippocampal volume. Regression path values are standardized coefficients. Asterisks indicate significance ( $p < .05$ ).



Can we predict future benefits of fitness training on cognitive and brain health ?

# Can we predict future benefits of fitness training on cognitive and brain health ?

- Brain networks exhibit a modular organization, comprised of separable sub-networks or modules.
- Networks with high modularity have dense connections within networks and sparser connections between networks.
- More modular networks allow for more efficient & greater adaptive reorganization in response to changing demands.
- *We propose that network modularity may predict outcomes of interventions including when baseline behavioral measures may not reliably distinguish between individuals or cannot be reliably obtained.*
- *Consistent with the literature on cognitive training benefits for younger adults, older adults, and TBI patients.*

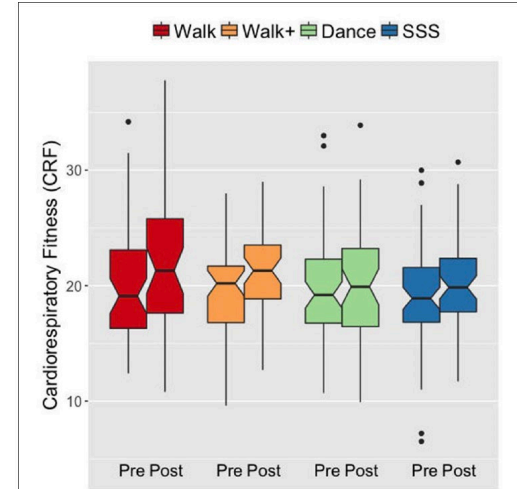
What about exercise-related executive function gains for older adults?

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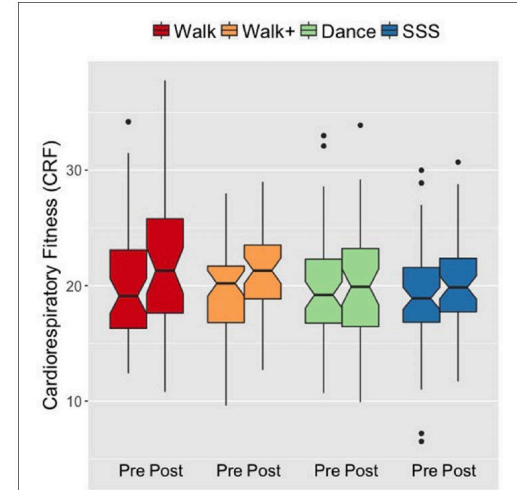
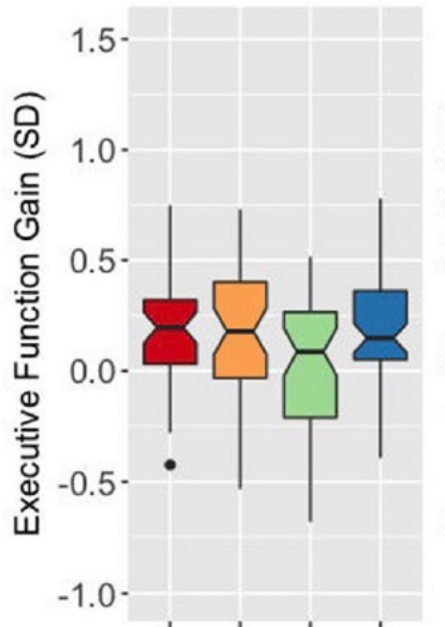
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**FIGURE 1** | Notched box plots show the distribution of CRF values before and after the intervention. The horizontal line marks the median. The notches extend to  $\pm 1.58 \text{ IQR}/\sqrt{n}$ . The upper and lower hinges correspond to the first and third quartiles. The whiskers extend from the hinge to  $\pm 1.5 \times \text{IQR}$  of the hinge. IQR, inter-quartile range.

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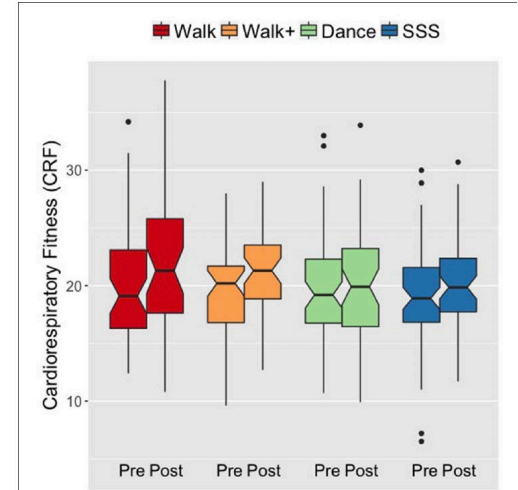
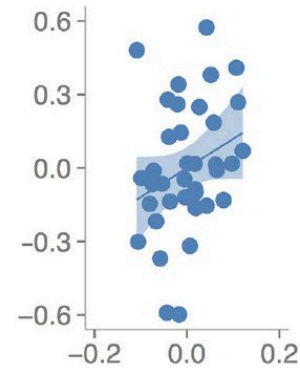
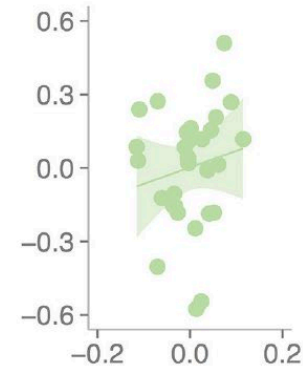
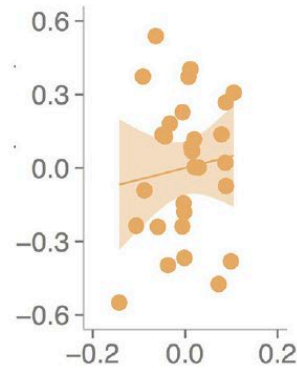
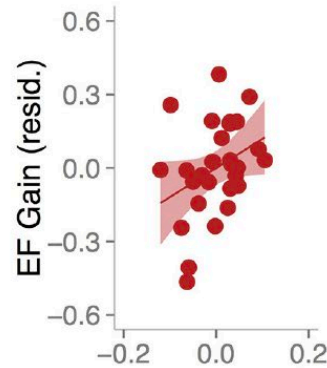
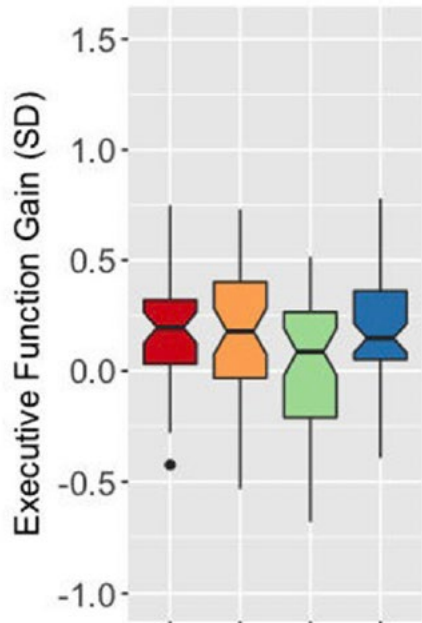
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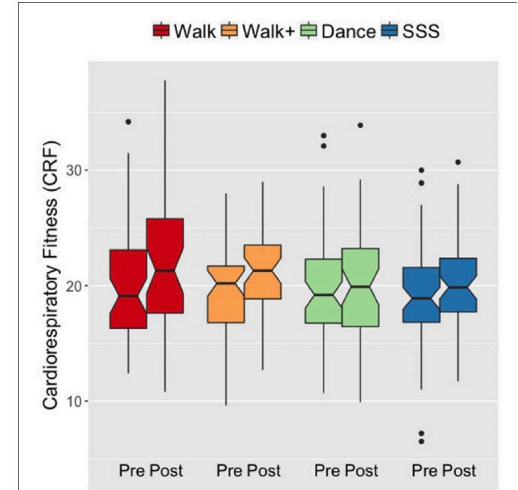
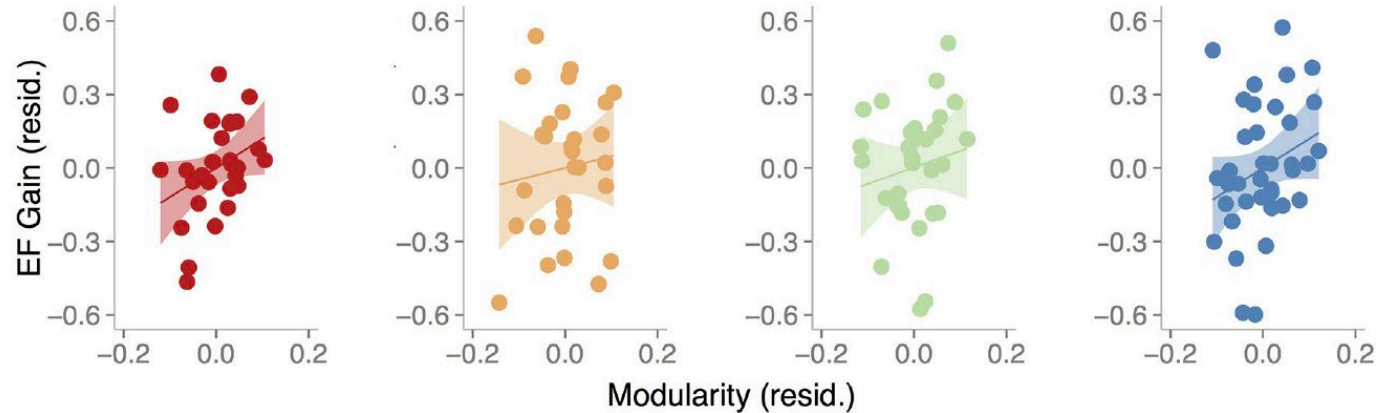
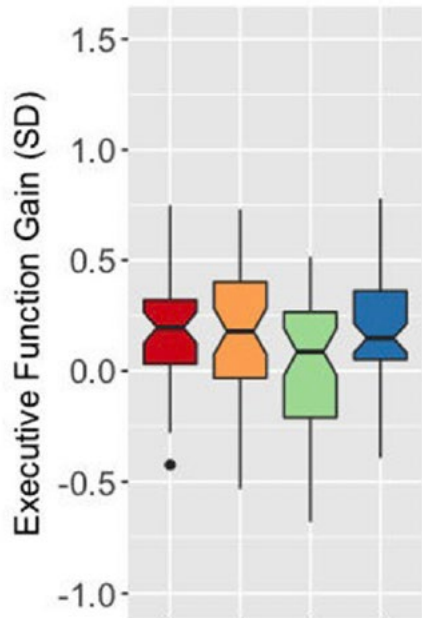
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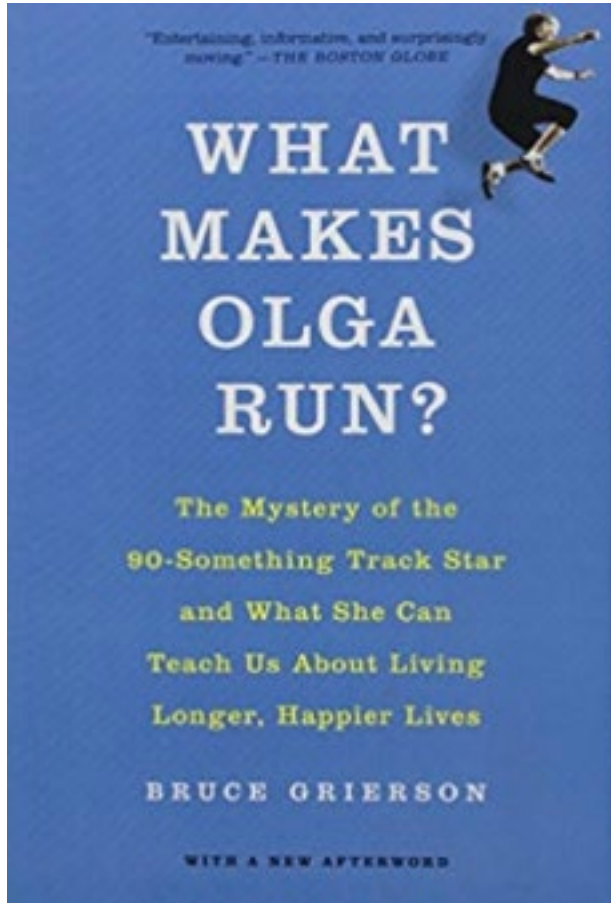


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So .... Generalizable effects across populations and intervention types .....



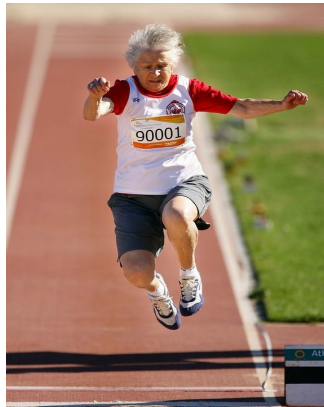
# An exemplar of successful aging .....



Olga Kotelko – 95 years of age ( 30 world records since 75 years of age)

# Olga Kotelko vs. 60 older women

## WHOLE BODY



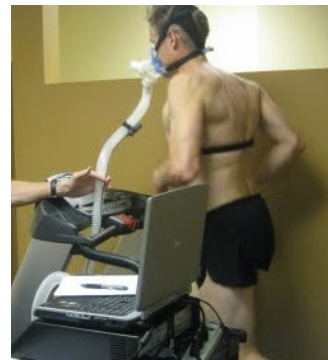
PHYSICAL ACTIVITY

## BRAIN (WHITE MATTER)



16313 voxels

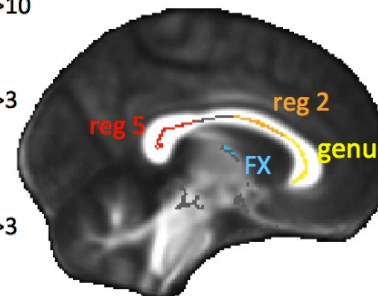
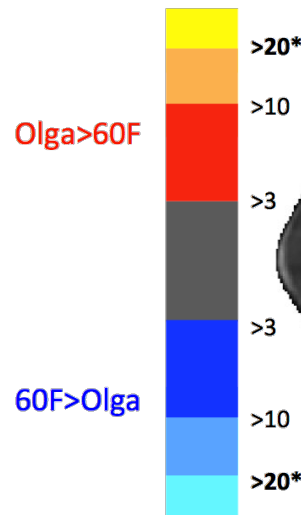
MACROSTRUCTURE



GOOD AEROBIC CAPACITY

Peak  $VO_2 = 16$

t-value



MICROSTRUCTURE

