

# **Examining the bidirectional associations between adiposity and cognitive function among middle-aged and older adults in the CLSA**

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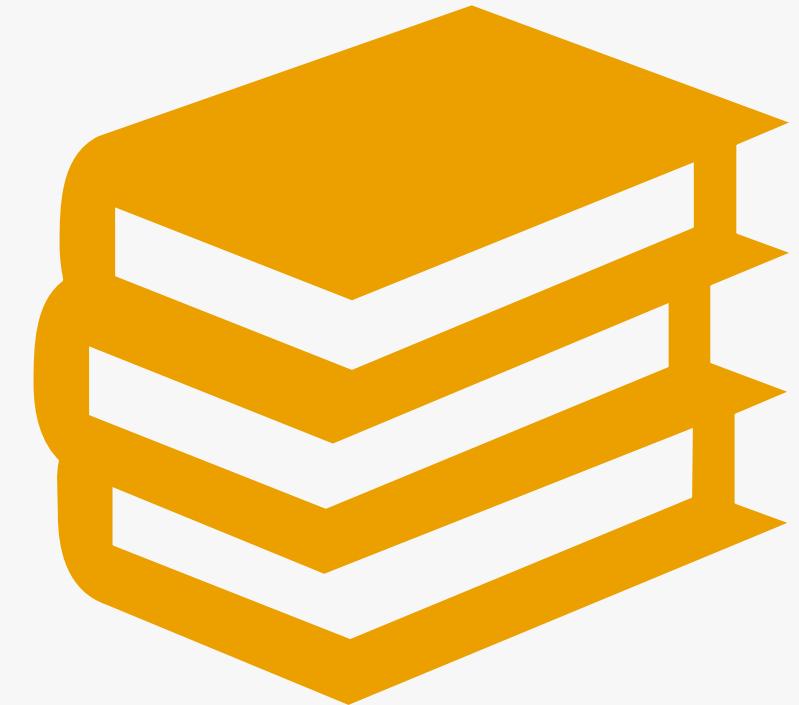
Study 2: CLSA Prospective

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Evidence from the ABCD analysis

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# Background



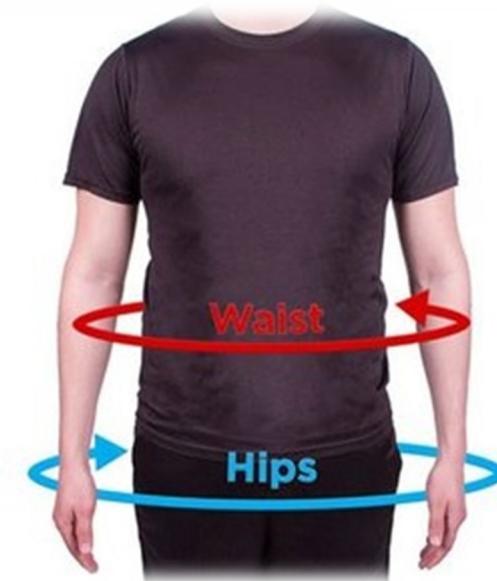
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# Adiposity and obesity



- Excessive fat accumulation that presents a risk to health
- ↑ the risk of chronic diseases and deaths
  - Metabolic syndrome
  - Type 2 Diabetes Mellitus (T2DM)
  - Cardiovascular disease
  - Premature death
- Effects on cognitive function
  - ↓ Executive function (EF)
  - ↓ Memory
  - ↓ Performance on neurocognitive testing
  - ↑ Risk for dementia and Alzheimer's disease

# Measures of adiposity



Body mass index  
(BMI)

Waist circumference  
(WC)

Waist-hip ratio  
(WHR)

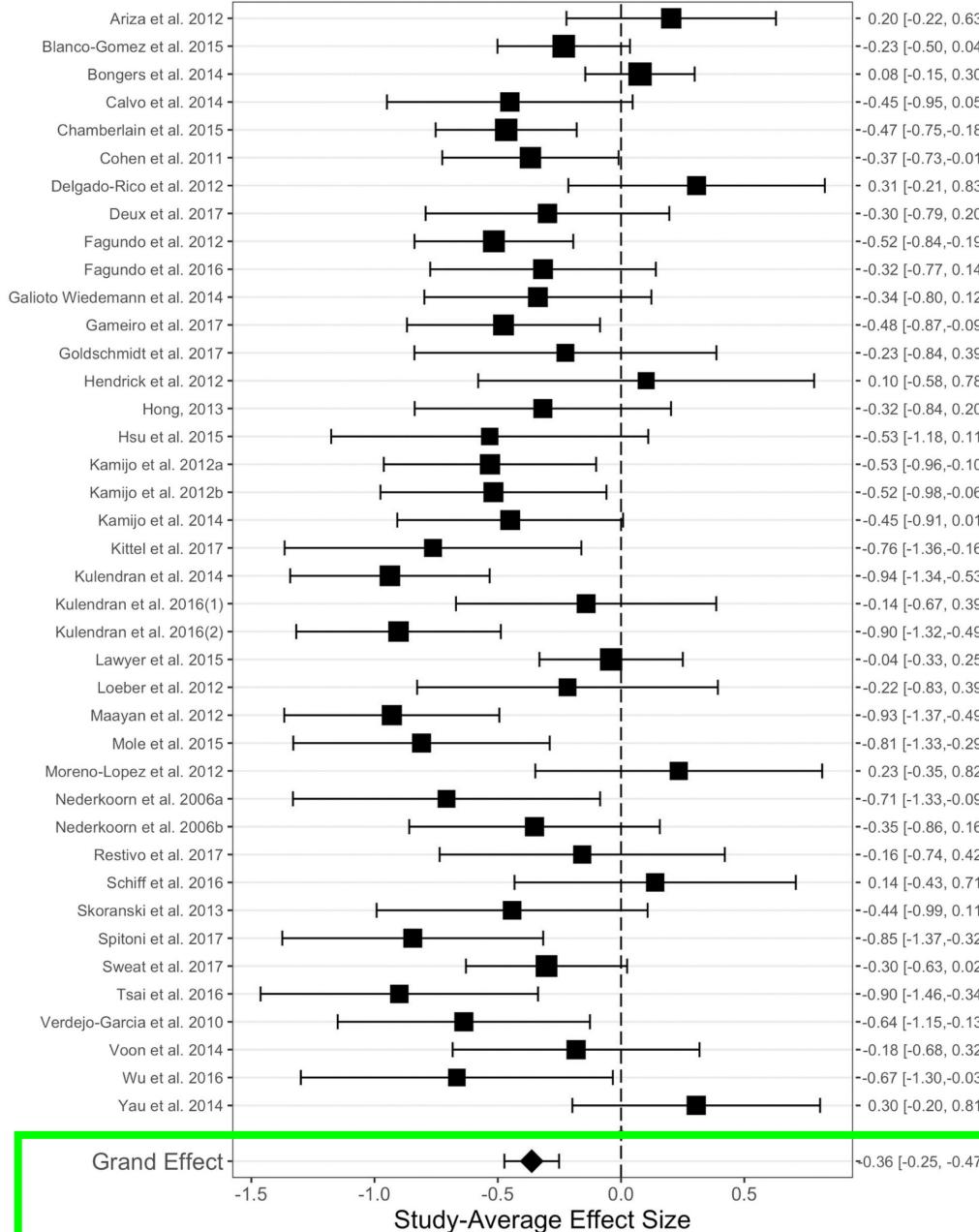
Dual energy X-ray  
absorptiometry (DXA)

# Brain-as-outcome perspective

- Baseline obesity predicts future cognitive impairments.
- Predominantly affects:
  - Executive function
  - Attention
  - Memory
- Midlife obesity → ↑ Dementia and Alzheimer's disease in late life



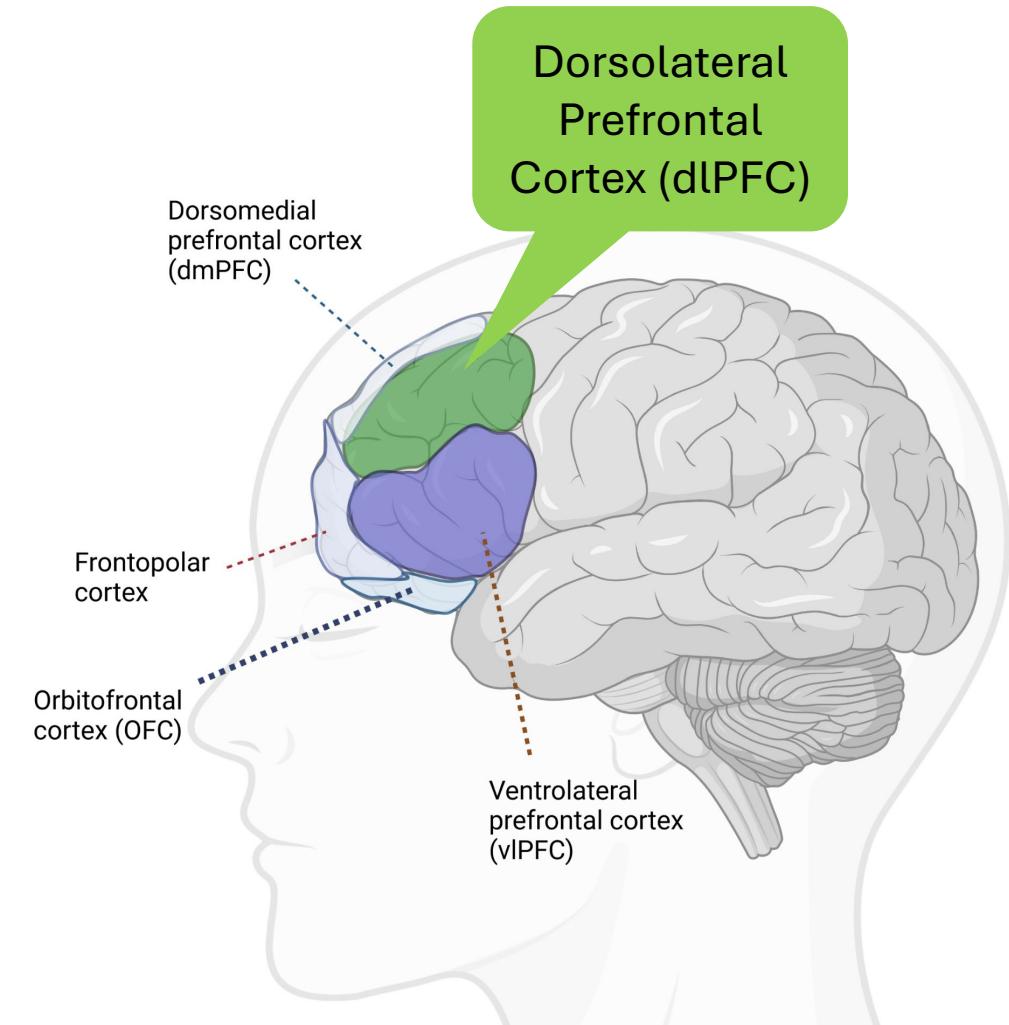
## Inhibition Deficit in Obesity Individuals



# Adiposity predicts cognitive function (Brain-as-outcome)

# Brain-as-predictor perspective

- Baseline cognitive impairment predicts future weight gain.
- Prefrontal cortex (PFC) plays a significant role.
- Suppression of dorsolateral PFC (dlPFC) → ↑ consumption
- ↓ Executive function → ↑ adiposity





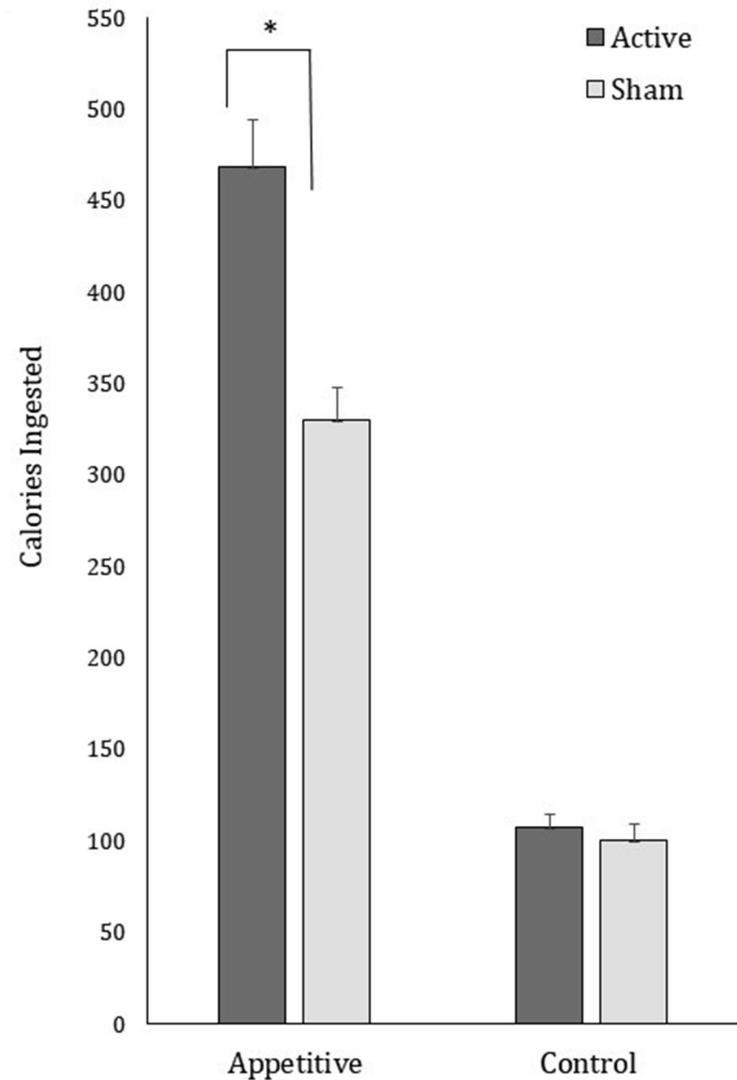
The neurocognitive mechanisms underlying food cravings and snack food consumption. A combined continuous theta burst stimulation (cTBS) and EEG study

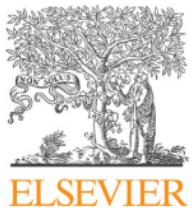
Cassandra J. Lowe<sup>a</sup>, William R. Staines<sup>b</sup>, Felicia Manocchio<sup>a</sup>, Peter A. Hall<sup>a,\*</sup>

<sup>a</sup> Prevention Neuroscience Lab, School of Public Health and Health Systems, University of Waterloo, Waterloo, ON, N2L 3G1, Canada

<sup>b</sup> Department of Kinesiology, University of Waterloo, Waterloo, ON, N2L 3G1, Canada

- cTBS-induced attenuation of the left dlPFC increased appetitive snack food consumption.





Contents lists available at ScienceDirect

## Brain Stimulation

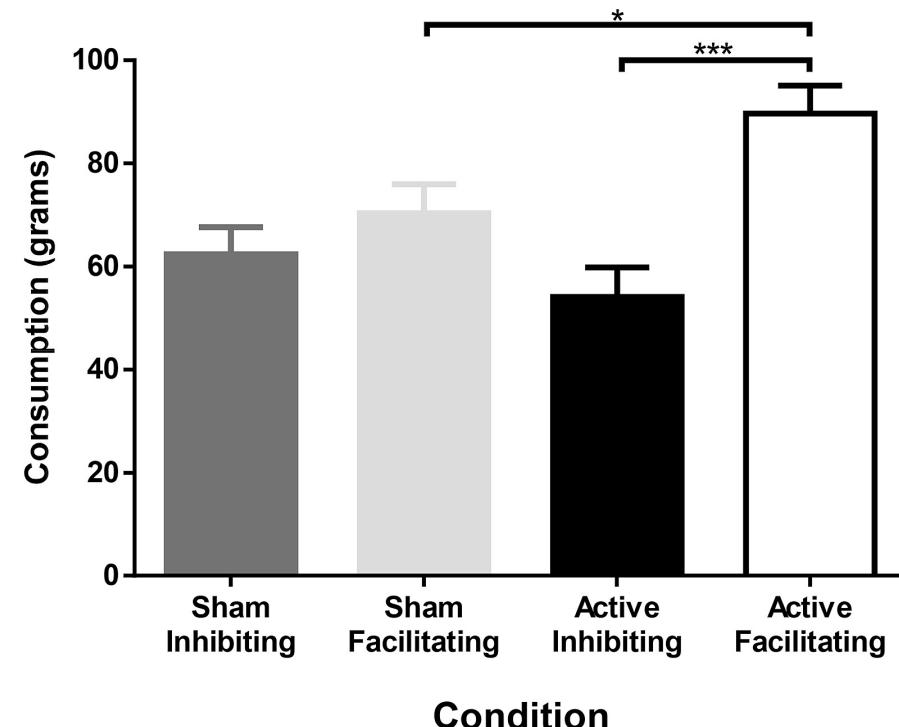
journal homepage: <http://www.journals.elsevier.com/brain-stimulation>

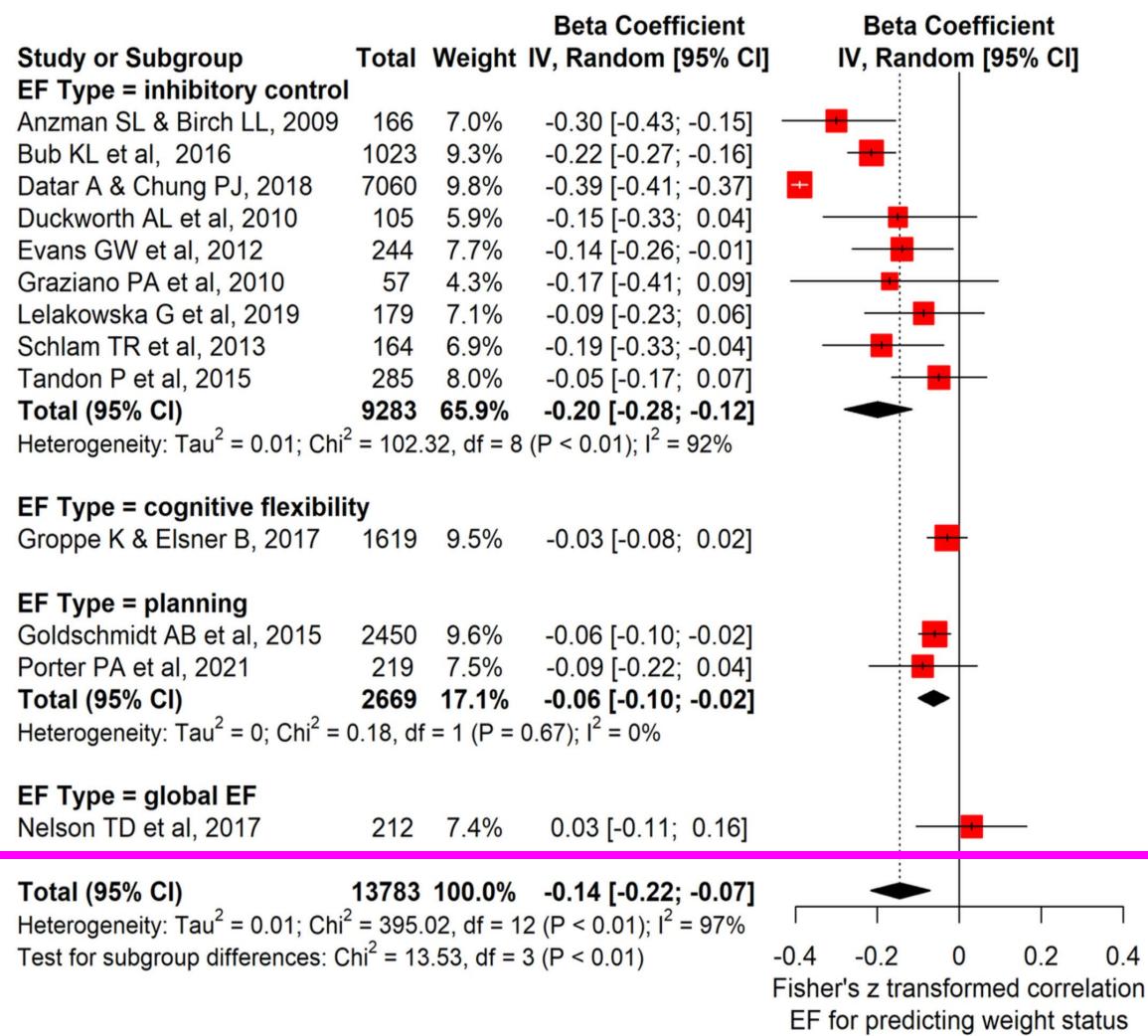
### Contextual cues as modifiers of cTBS effects on indulgent eating

Adrian B. Safati<sup>1</sup>, Peter A. Hall<sup>\*,1</sup>

Prevention Neuroscience Laboratory, School of Public Health & Health Systems, University of Waterloo, Waterloo, Ontario, N2L 3G1, Canada

- The joint effects of contextual cues and cTBS on eating were examined.
- Findings suggested stronger cTBS effects in the presence of facilitating cues.



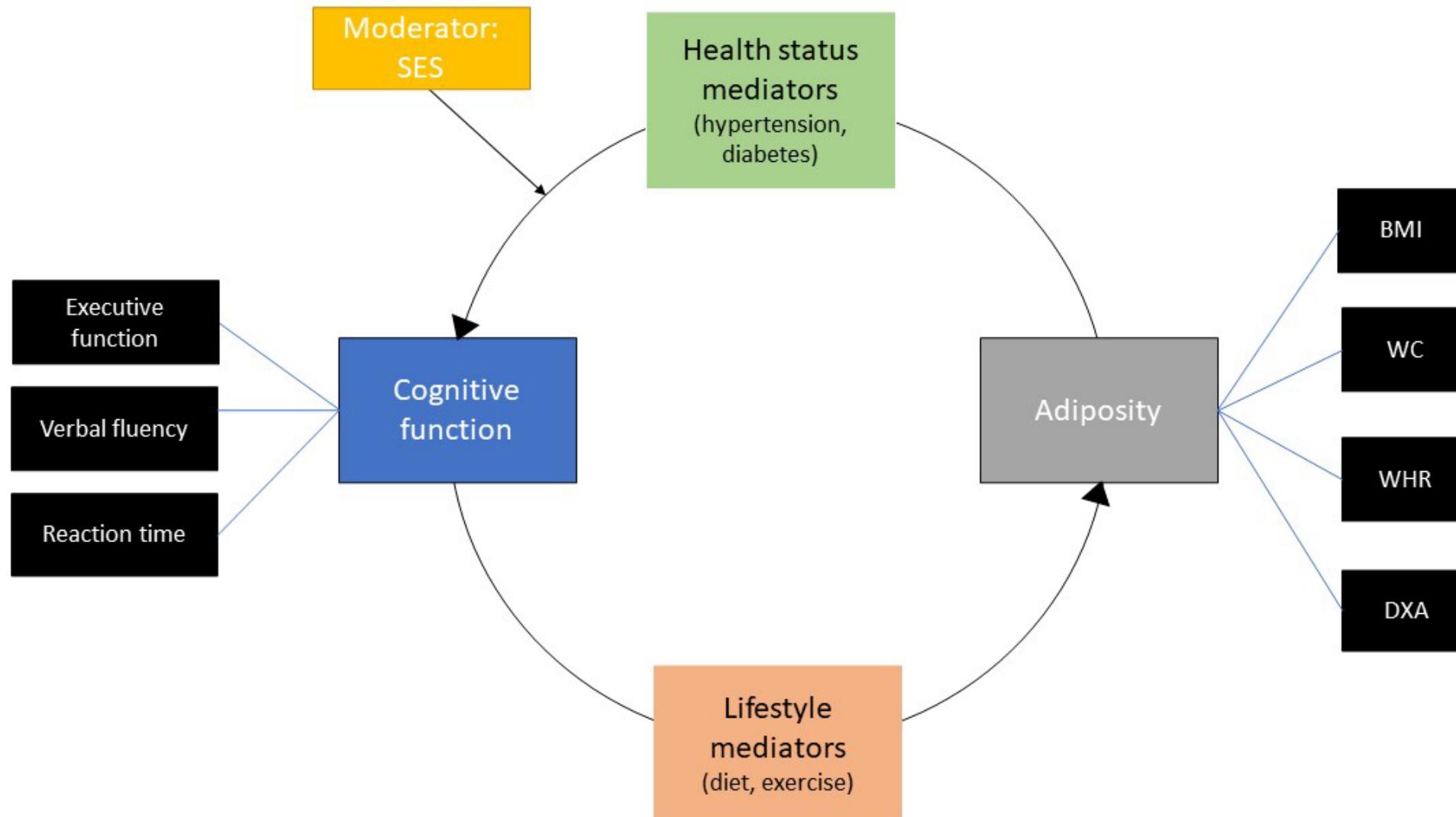


# Cognitive function predicts adiposity (brain-as-predictor)

# Limitations of previous research

- Lack of research using large-scale population-based datasets
- Limitation of previous research:
  - Unidirectional analyses on different samples
  - Lack of temporality
  - Small sample size
  - Insufficient measures on focal variables
  - Limited information on the potential confounders
  - Mediation paths were not explored
- Paucity of research in the Canadian context

# Conceptual diagram



# Study 1

## Cognitive Function Is Associated With Multiple Indices of Adiposity in the Canadian Longitudinal Study on Aging: A Cross-Sectional Analysis

 Sakib, Mohammad Nazmus MBBS, MSc; Ramezan, Reza PhD; Thompson, Mary E. PhD;  Best, John R. PhD;  Hall, Peter A. PhD

[Author Information](#) 

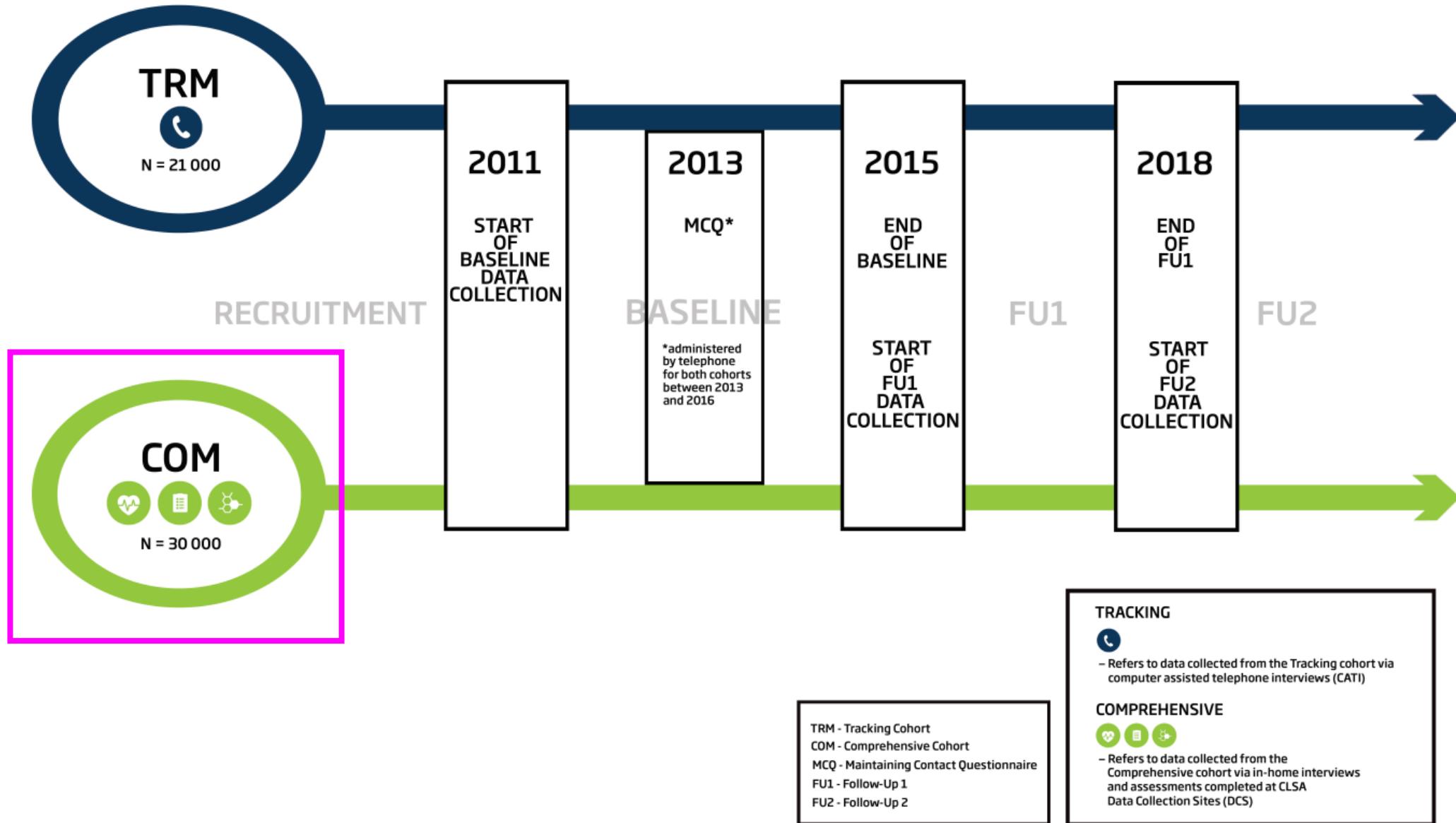
Psychosomatic Medicine: September 2022 - Volume 84 - Issue 7 - p 773-784  
doi: 10.1097/PSY.0000000000001099

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# Objectives and hypotheses

- To examine the association between adiposity and cognitive function and test the potential mediation paths.
- Hypothesis 1
  - Better scores on tests of cognitive function will be associated with lower adiposity.
- Hypothesis 2
  - The aforementioned associations are mediated through lifestyle behaviors and medical conditions.
- Hypothesis 3
  - The aforementioned associations will be stronger for those of higher SES.

# CLSA DATA COLLECTION

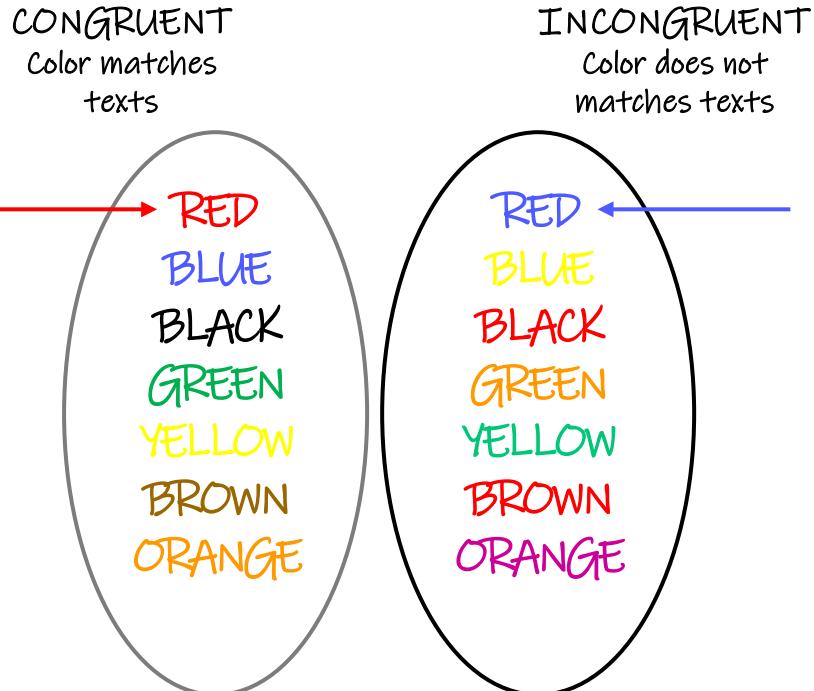


# Methods

Outcome variables (Adiposity indicators)	Explanatory variables (Cognitive function)	Covariates	Mediators
<ul style="list-style-type: none"><li>• Body mass index</li><li>• Total fat mass (DXA)</li><li>• Waist circumference</li><li>• Waist-hip ratio</li></ul>	<ul style="list-style-type: none"><li>• Stroop task</li><li>• Choice reaction time (CRT)</li><li>• Animal fluency task (AFT)</li></ul>	<ul style="list-style-type: none"><li>• Age</li><li>• Sex</li><li>• Ethnicity</li><li>• Income</li><li>• Education</li><li>• Residence</li><li>• Physical activity</li><li>• Comorbidity</li><li>• Somatic</li><li>• Neurologic</li></ul>	<ul style="list-style-type: none"><li>• T2DM</li><li>• Hypertension</li><li>• Physical activity</li><li>• Diet<ul style="list-style-type: none"><li>• Healthy (legume, fruits, salad, carrot)</li><li>• Unhealthy (fries, pastries, snacks, chocolate)</li></ul></li></ul>

# Measures of cognitive function

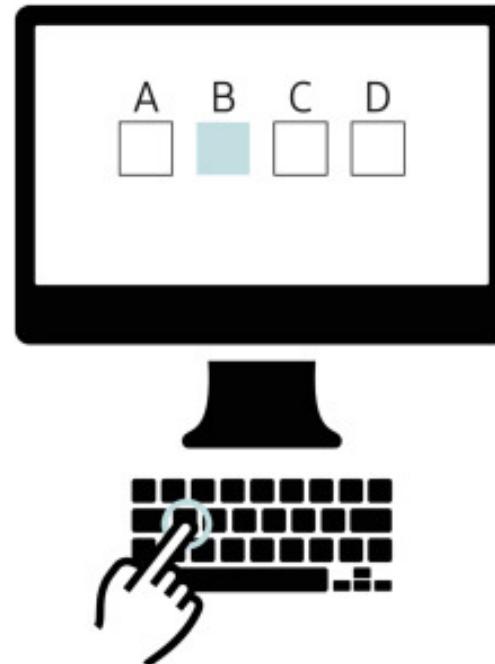
↑ Stroop interference → ↓ EF



Stroop task

(<https://codepen.io/>)

↑ RT → ↓ Processing speed

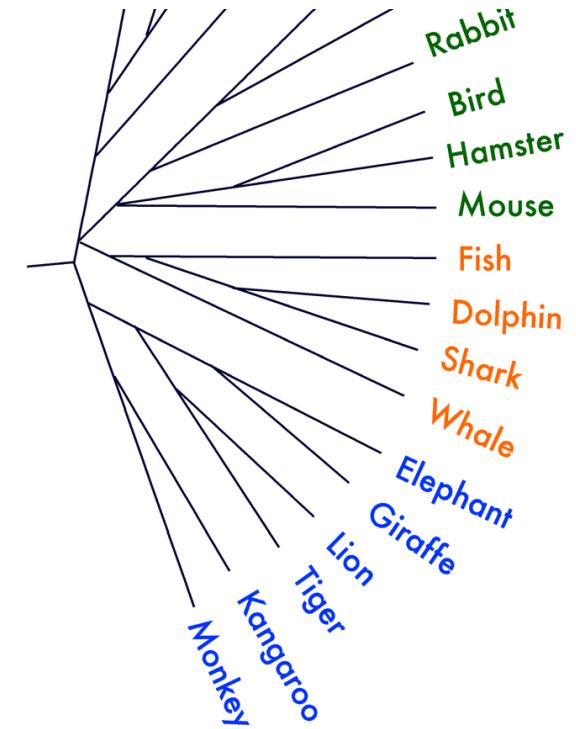


Reaction time task

(<https://www.sciencedirect.com/>)

Horse  
Cow  
Sheep

↑ AF → ↑ Verbal fluency



Animal fluency task

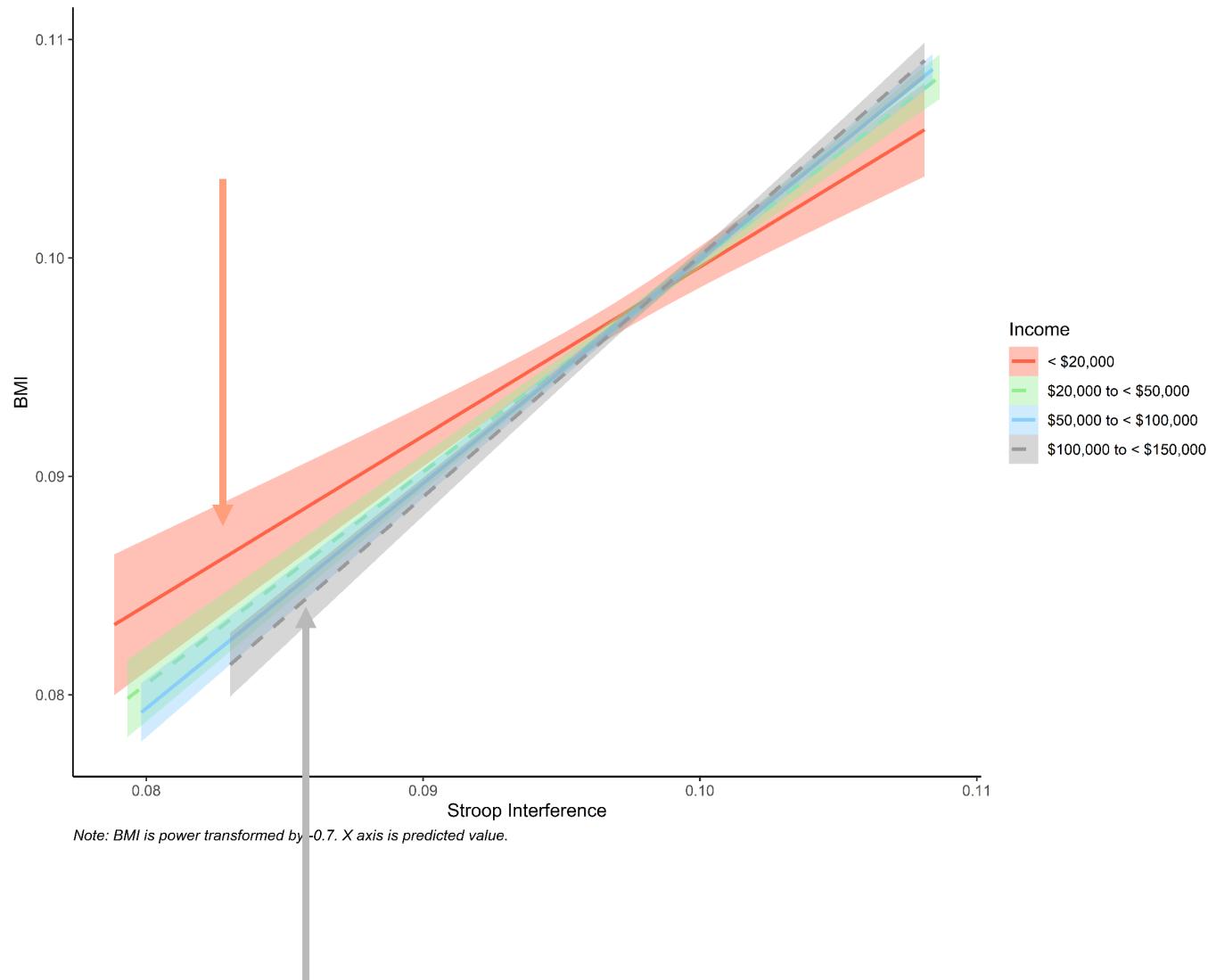
<https://www.wikiwand.com/>

# Statistical analyses

- Hierarchical multivariable linear regression
- Model 1:  $Y_{Adiposity} = \beta_0 + \beta_1 X_{covariate} + \varepsilon$
- Model 2:  $Y_{Adiposity} = \beta_0 + \beta_1 X_{covariate} + \beta_2 X_{Cog} + \varepsilon$
- Mediation analysis for lifestyle and medical conditions
  - T2DM, Hypertension, Physical activity and Diet
- Moderation analysis for income groups

# Results

- ↑ Cognitive function ~ ↓ Adiposity
- Significant mediation paths:
  - Stroop → T2DM/HTN → Adiposity
  - AFT → Lifestyle/HTN → Adiposity
  - CRT → Diet/T2DM → Adiposity
- High SES (i.e., income) > Low SES



# Study 2

## Bidirectional Associations Between Adiposity and Cognitive Function: A Prospective Analysis of the Canadian Longitudinal Study on Aging (CLSA)

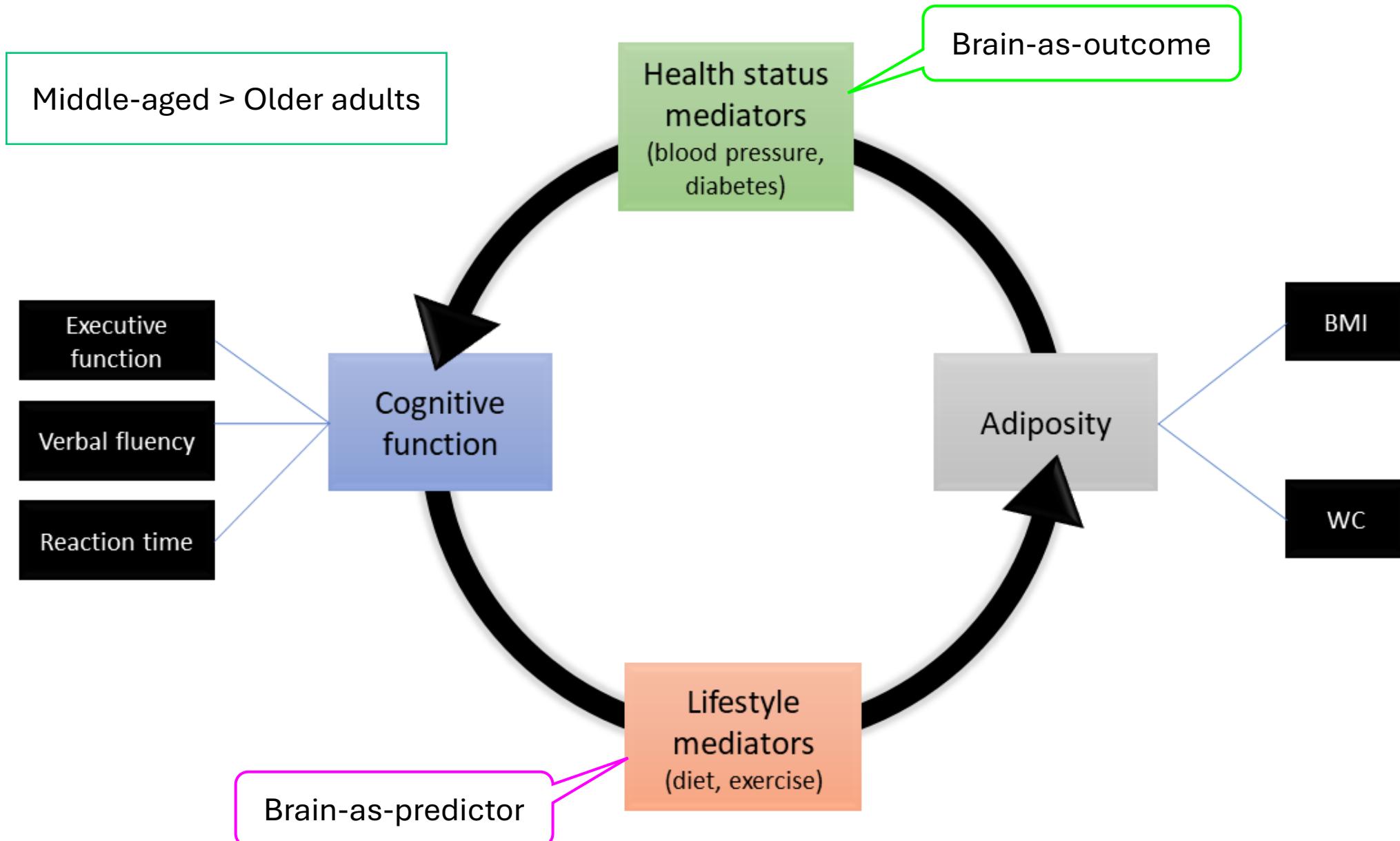
Mohammad Nazmus Sakib, MBBS, MSc, John R Best, PhD, Reza Ramezan, PhD, Mary E Thompson, PhD,  
Peter A Hall, PhD ✉

*The Journals of Gerontology: Series A*, glac115, <https://doi.org/10.1093/gerona/glac115>

**Published:** 29 May 2022

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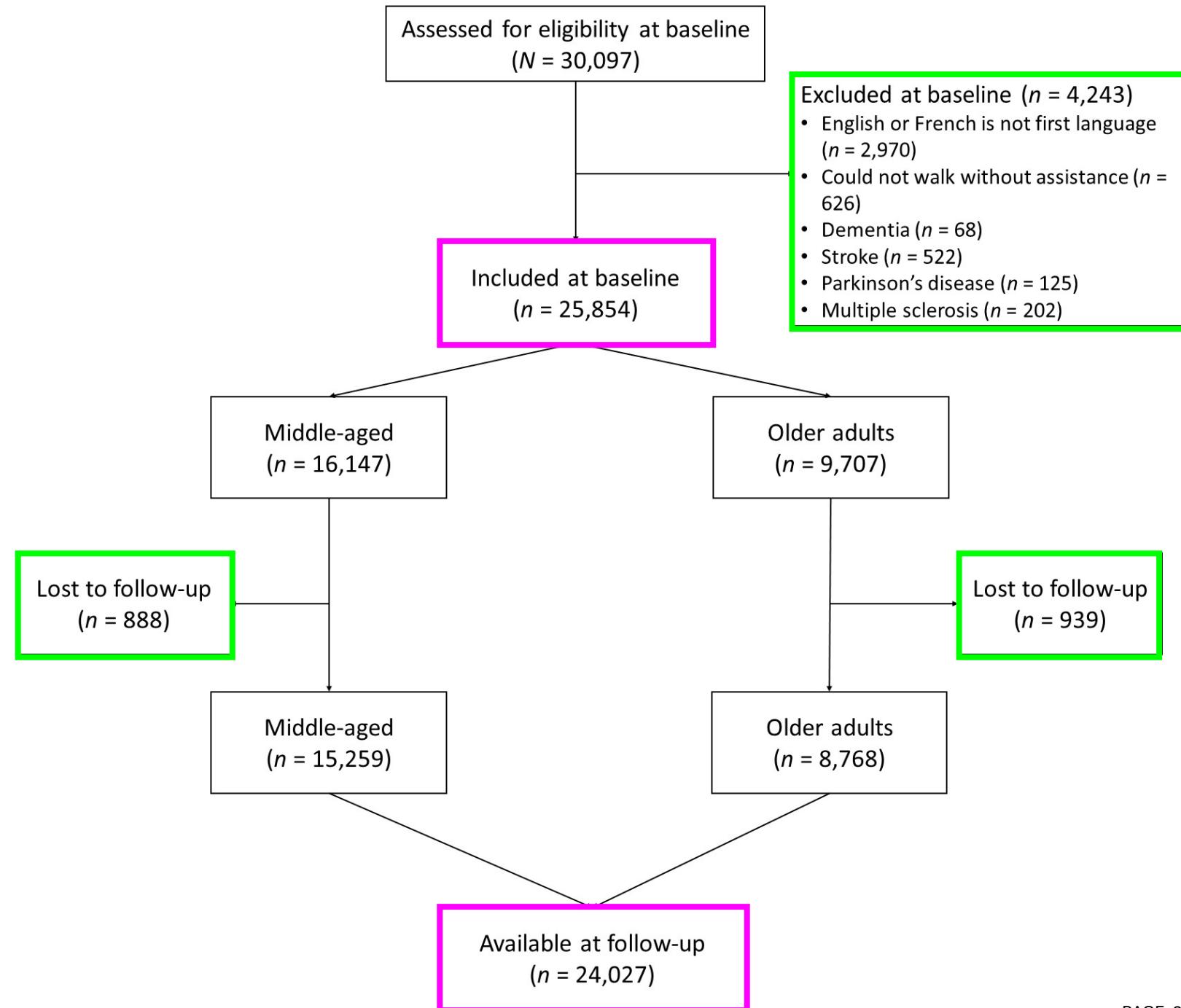
# Objectives and hypotheses



# Methods

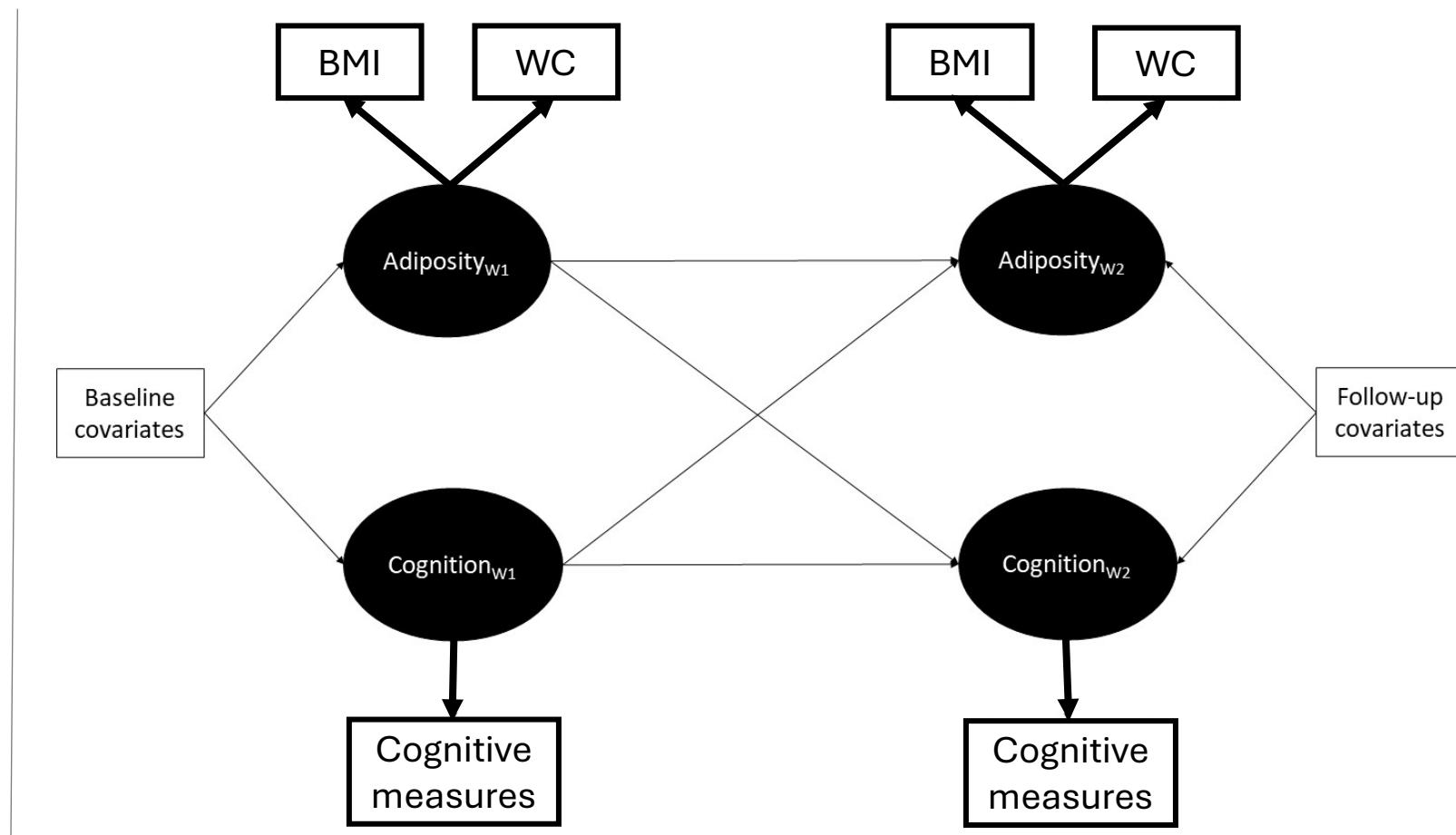
Adiposity indicators	Cognitive indicators	Covariates	Mediators
<ul style="list-style-type: none"><li>• Body mass index</li><li>• Waist circumference</li></ul>	<ul style="list-style-type: none"><li>• Stroop task</li><li>• Choice reaction time (CRT)</li><li>• Animal fluency task (AFT)</li></ul>	<ul style="list-style-type: none"><li>• Age</li><li>• Sex</li><li>• Ethnicity</li><li>• Income</li><li>• Education</li><li>• Residence</li><li>• Physical activity</li><li>• Comorbidity</li><li>• Sleep duration</li></ul>	<ul style="list-style-type: none"><li>• T2DM</li><li>• Blood pressure</li><li>• Physical activity</li><li>• Diet<ul style="list-style-type: none"><li>• Healthy (legume, fruits, salad, carrot)</li><li>• Unhealthy (fries, pastries, snacks, chocolate)</li></ul></li></ul>

# Exclusion criteria



# Statistical analyses

- Multivariate multivariable regressions
- Cross-lagged panel models with latent variable modeling
- Mediation analysis for lifestyle and medical condition variables
- Analyses were stratified by age group
  - Middle-aged (45-65 years)
  - Older adults (> 65 years)



# Results

- Multivariate multivariable regressions

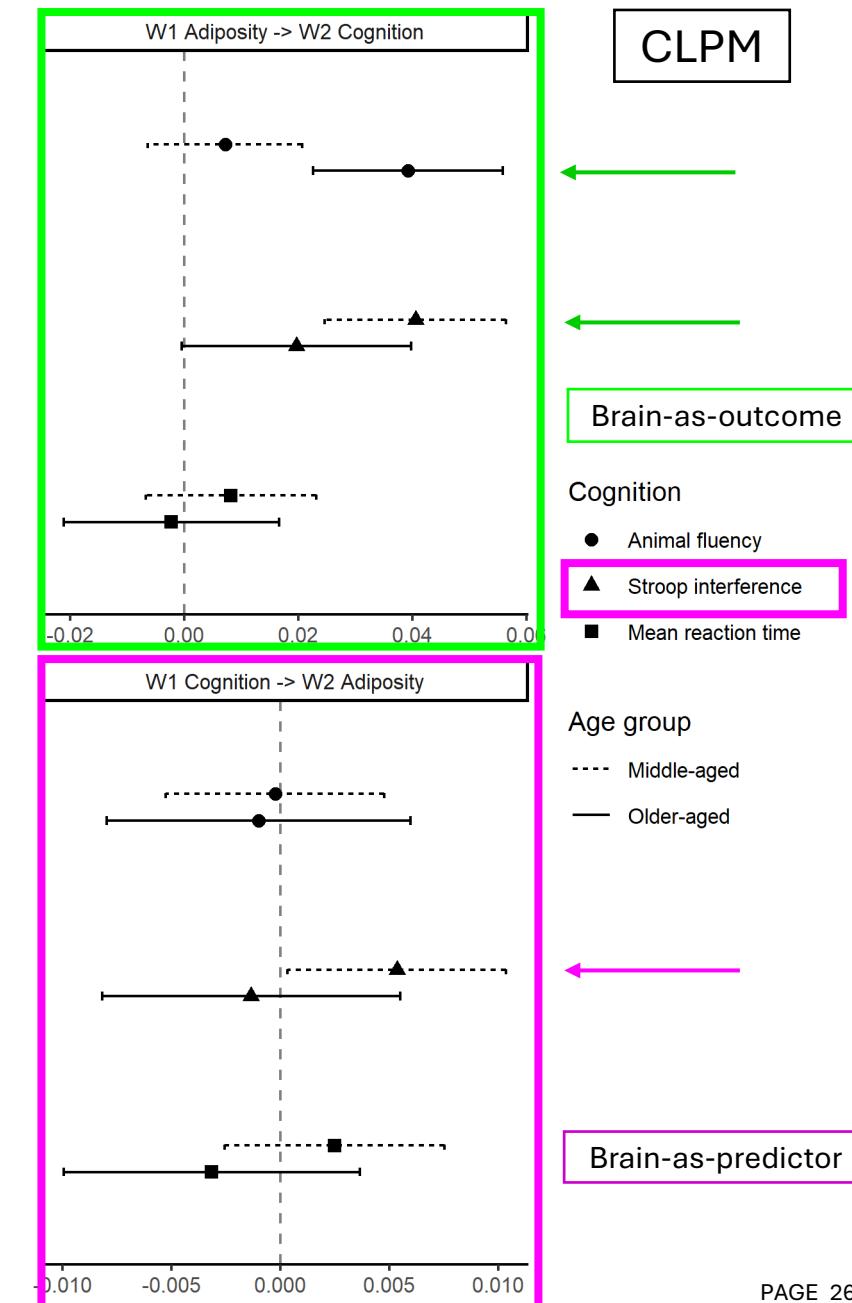
- Brain-as-outcome perspective
  - Middle-aged:  $\uparrow Adiposity_{W1} \rightarrow \uparrow Stroop_{W2}, \downarrow AFT_{W2}$
  - Older adults:  $\uparrow Adiposity_{W1} \rightarrow \uparrow Stroop_{W2}, \uparrow AFT_{W2}$

- Brain-as-predictor perspective
  - Middle-aged:  $\uparrow Stroop_{W1} \rightarrow \uparrow Adiposity_{W2}, \uparrow AFT_{W1} \rightarrow \downarrow Adiposity_{W2}$

- Mediation analyses

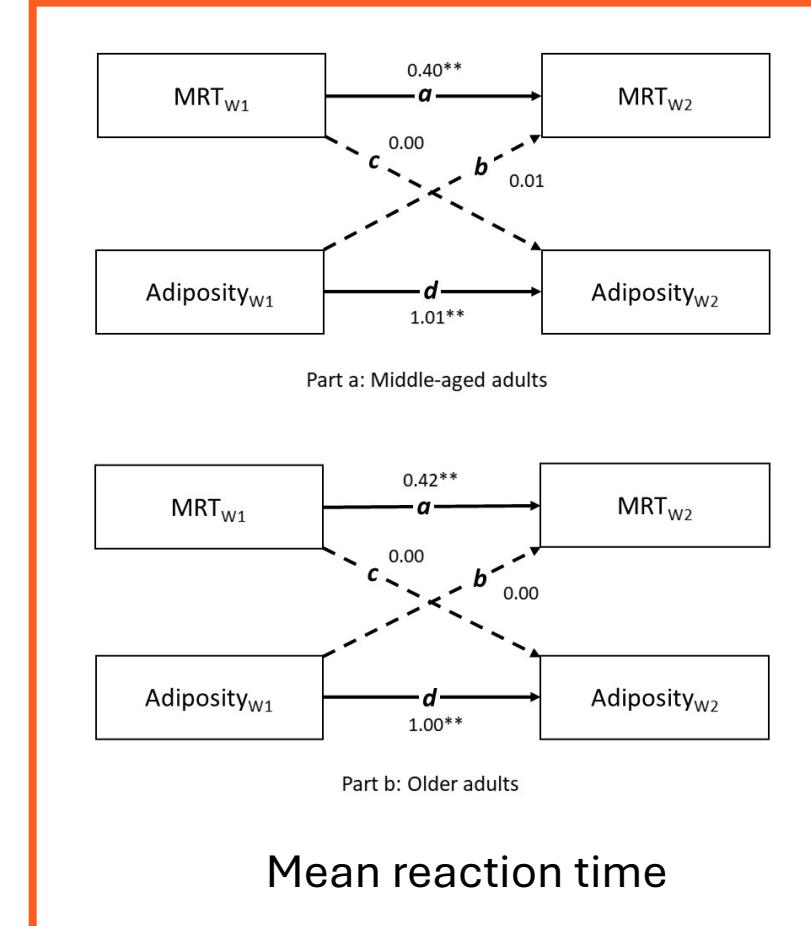
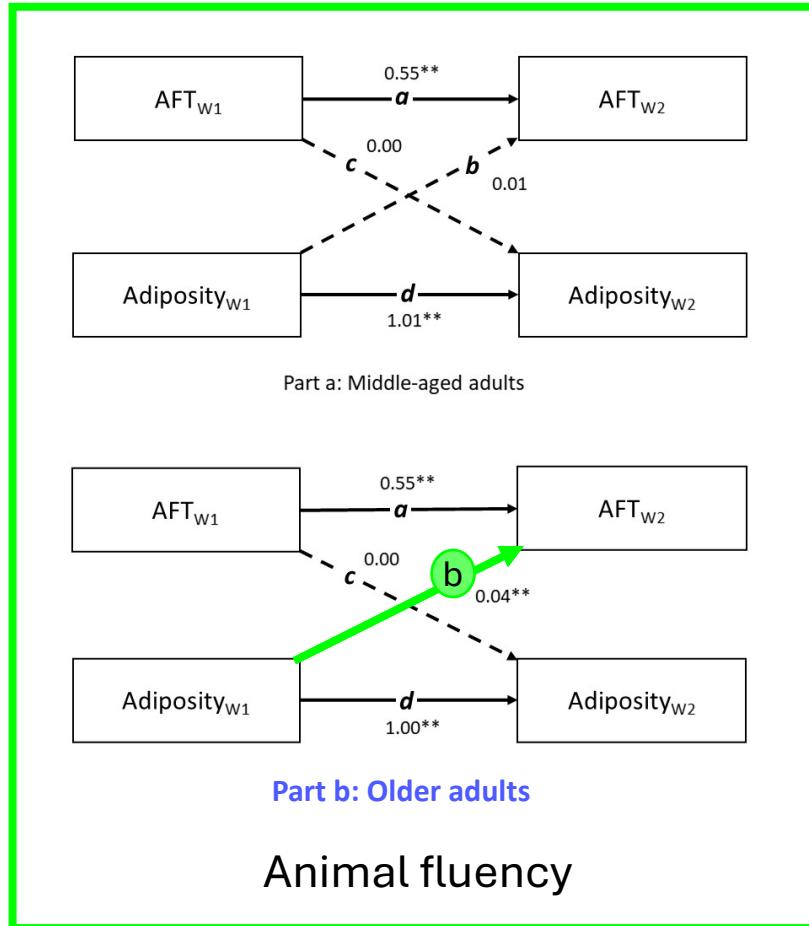
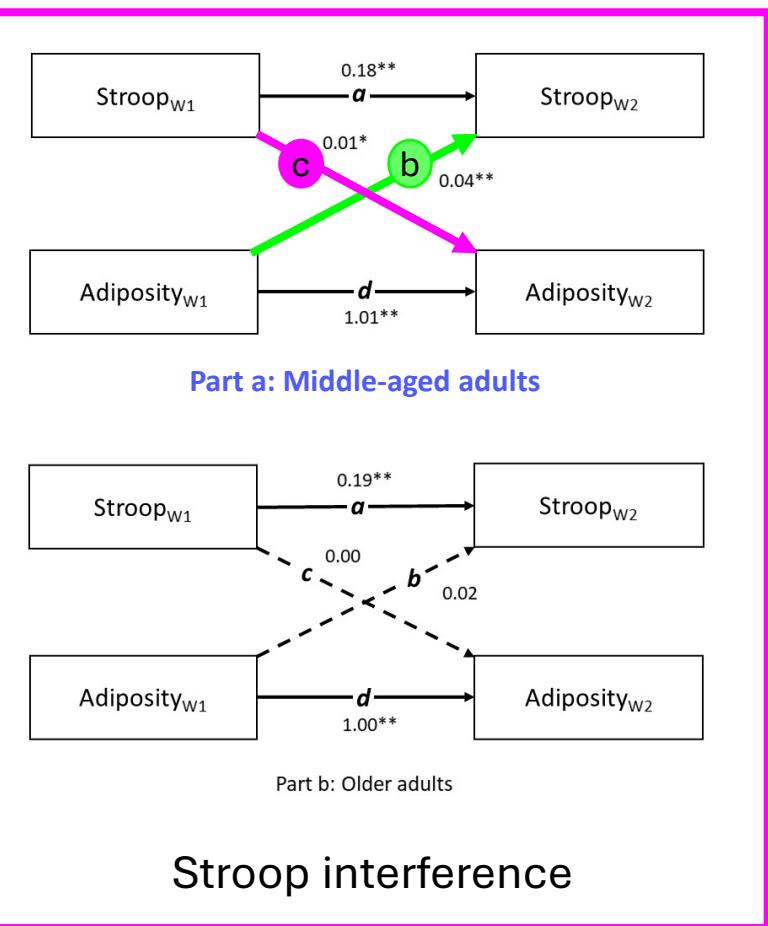
- Brain-as-outcome perspective
  - $WC_{W1} \rightarrow \text{Systolic \& diastolic BP}_{\text{Mid-age}} / T2DM_{\text{Mid-age \& Old-age}} \rightarrow Stroop_{W2}$

- Brain-as-predictor perspective
  - $Stroop_{W1} \rightarrow \text{Diet}_{\text{Mid-age}} / \text{Pastries}_{\text{Old-age}} \rightarrow WC_{W2}$



# Summary of CLPM-L

- Solid lines indicate statistically significant paths
  - Path b = Brain-as-outcome
  - Path c = Brain-as-predictor



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# General discussion



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# Major findings

- Study 1
  - $\uparrow$  Cognition  $\sim$   $\downarrow$  Adiposity
- Study 2:
  - $\uparrow$   $Adiposity_{mid-age}$   $\rightleftharpoons$   $\downarrow$   $Executive\ function_{mid-age}$
  - $\uparrow$   $Adiposity_{old-age}$   $\rightarrow$   $\uparrow$   $Verbal\ fluency_{old-age}$
- Mediation: Lifestyle behavior and medical condition

# Strengths

- Large-scale population-based datasets were utilized (Studies 1-2).
- Longitudinal analyses (Study 2)
- Multiple indices of adiposity and cognitive function (Studies 1-2)
- Rich information on potential confounders in modeling (Studies 1-2)

# Limitations

- Prospective analyses were limited to 2 waves for CLSA (Study 2)
- Short follow-up interval (3 years) likely underestimates cross-lagged effects, due to the gradual cumulative nature of the phenomena (Study 2)
- Population representativeness is not perfect despite large sample size (Studies 1-2)
- Cognitive domains examined within CLSA were not exhaustive (Studies 1-2)

# Evidence from the ABCD Analyses

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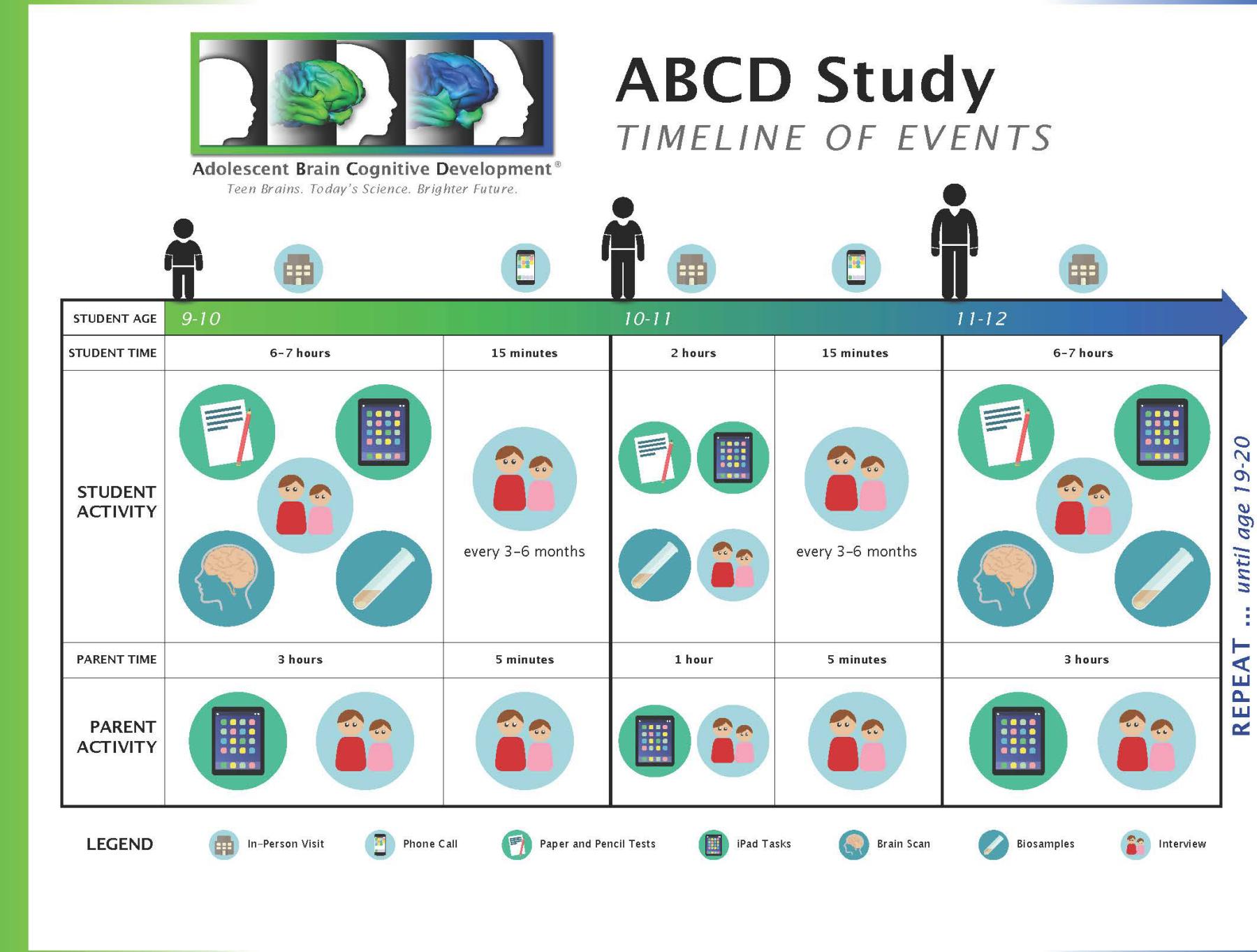
Title: Bidirectional associations between adiposity and cognitive function: Mediation by lateral prefrontal morphology in the ABCD Study

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Authors: Sakib, M. N., Best, J. R., & Hall, P. A.

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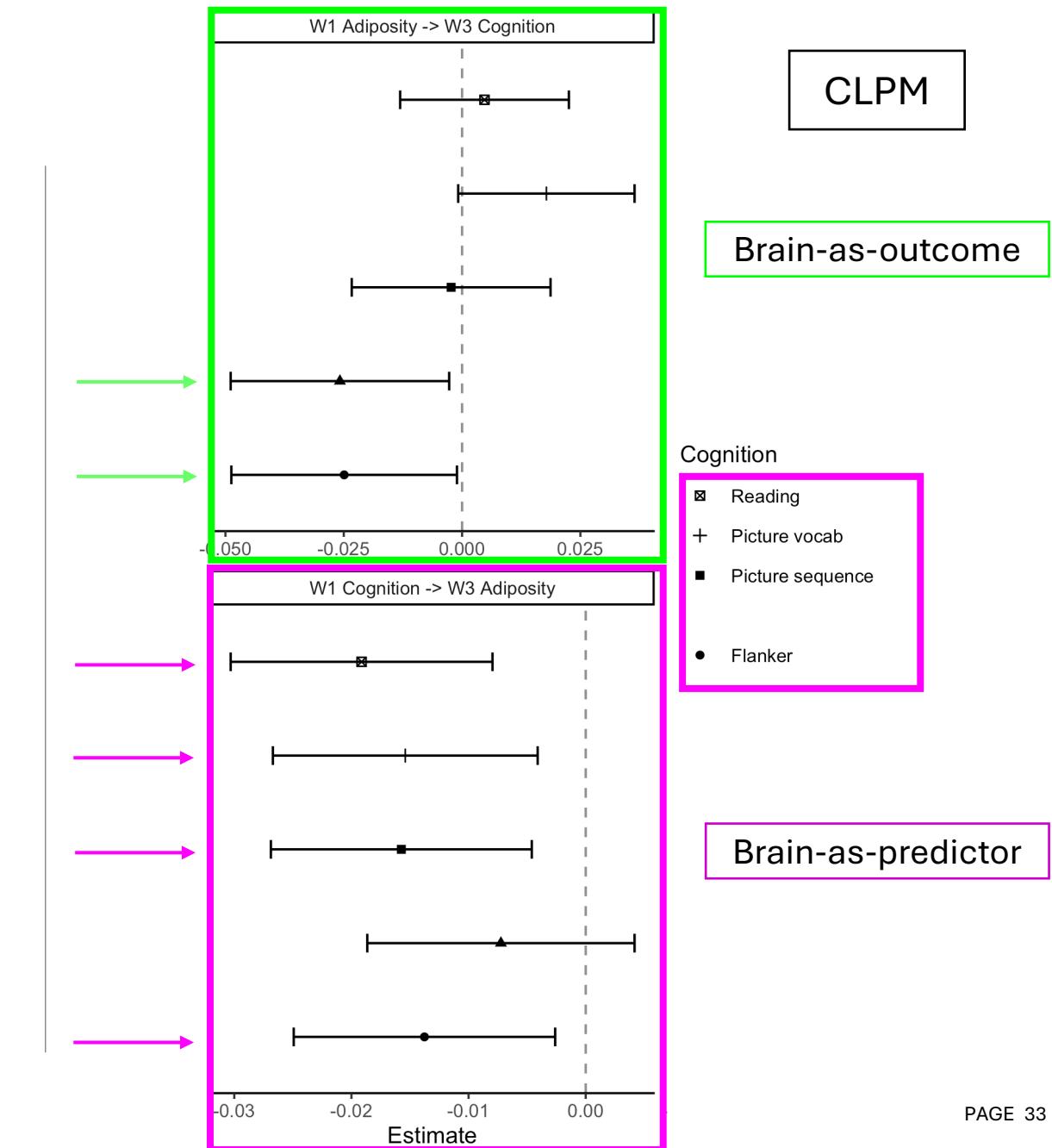
- Multisite longitudinal Study
- 11,878 children ages 9-10
- Begun in 2018
- Wave 1-3 data were available at the time of analyses.



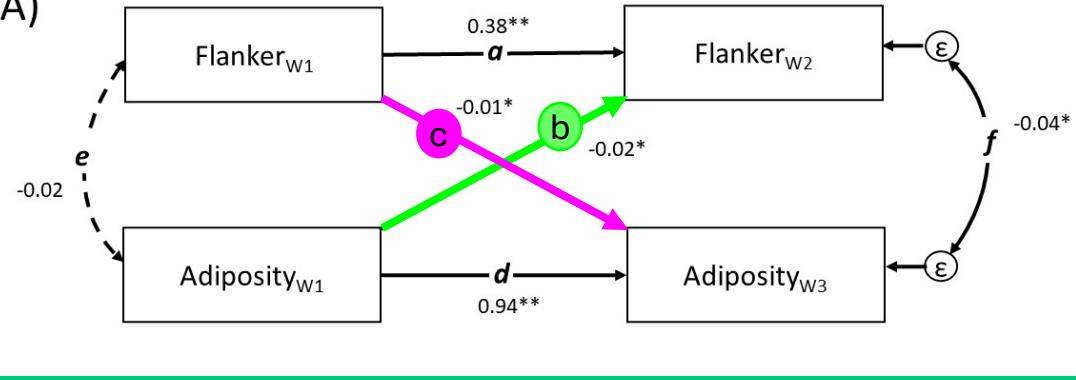
(Source: <https://abcdstudy.org>)

# Variables and Findings

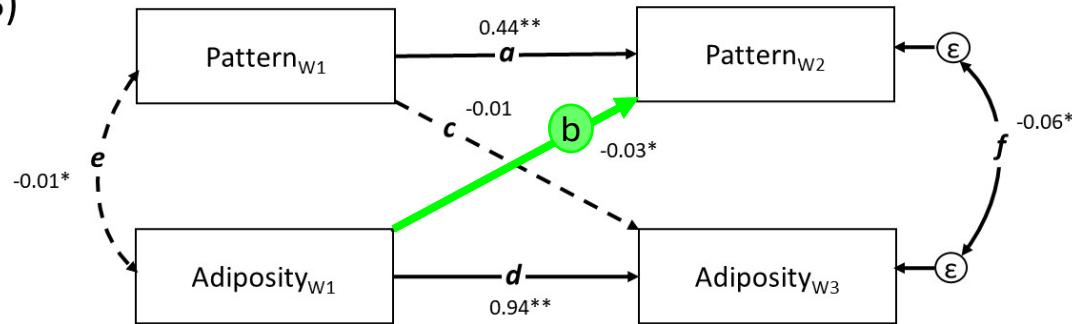
- Cognitive indicators: NIH Toolbox Cognitive Battery
  - Flanker, pattern matching, picture sequence, picture vocabulary, and oral reading
- Adiposity indicators: zBMI, WC
- Multivariate multivariable regressions
  - Brain-as-outcome perspective
    - $\uparrow zBMI_{W1} \rightarrow \downarrow PicSeq_{W3}$
    - $\uparrow WC_{W1} \rightarrow \uparrow PicVocab_{W3}$
  - Brain-as-predictor perspective
    - $\uparrow Flanker_{W1}, \uparrow PicSeq_{W1} \rightarrow \downarrow zBMI_{W3}, \downarrow WC_{W3}$



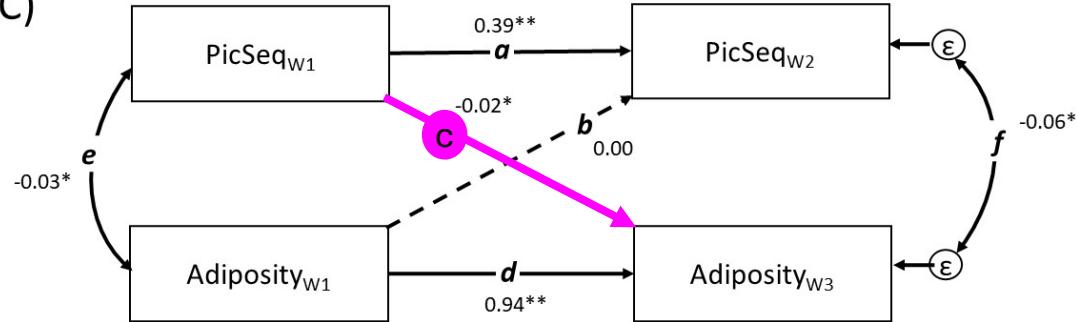
A)



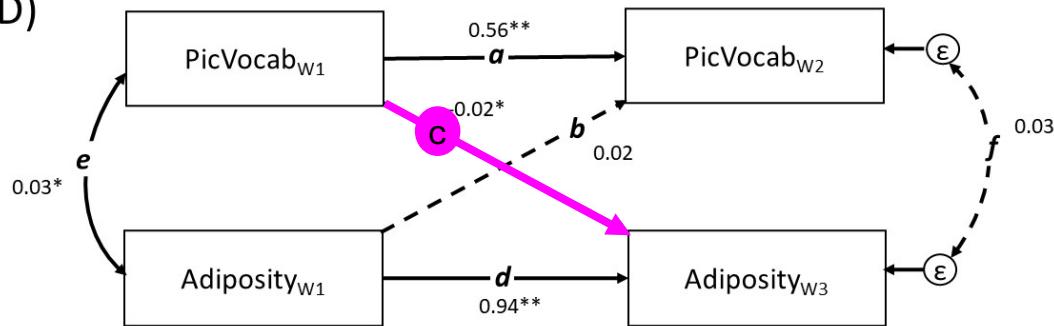
B)



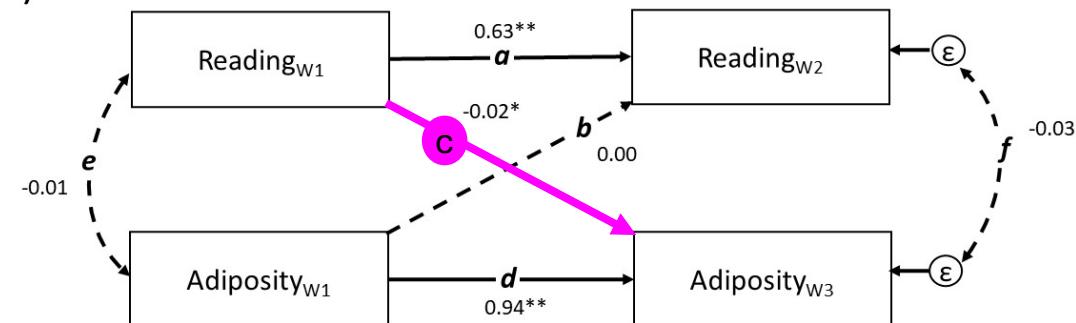
C)



D)



E)

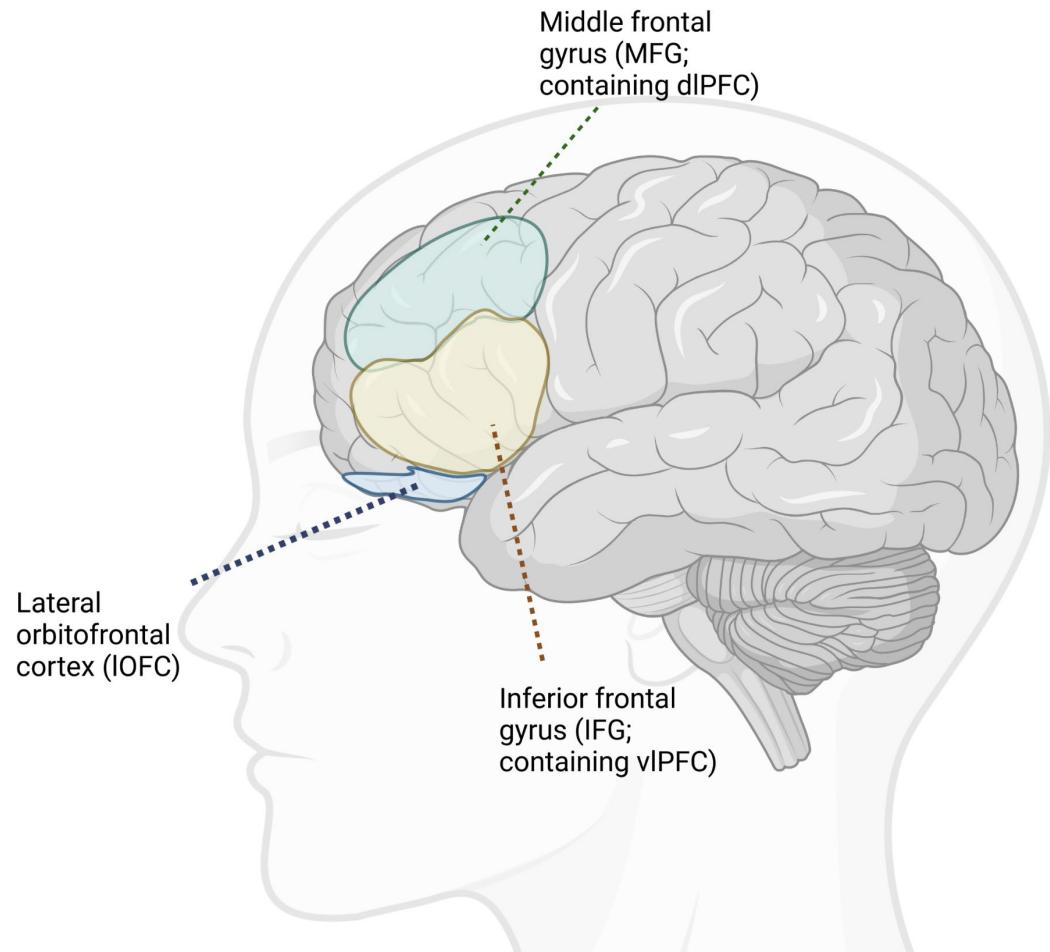


## Summary of CLPM-L

- Solid lines indicate statistically significant paths
- Path b = Brain-as-outcome
- Path c = Brain-as-predictor

# Mediation through brain morphology features

- Brain-as-outcome
  - Adiposity → Mediator → Cognition
    - $\text{Adiposity}_{W1} \rightarrow \text{MFG}_T \rightarrow \text{Pattern}_{W3}$
    - $\text{Adiposity}_{W1} \rightarrow \text{MFG}_T/\text{IFG}_T \rightarrow \text{PicVocab}_{W3}$
    - $\text{Adiposity}_{W1} \rightarrow \text{LPFC}_V/\text{MFG}_V \rightarrow \text{Reading}_{W3}$
- Brain-as-predictor
  - Cognition → Mediator → Adiposity
    - $\text{Pattern}_{W1} \rightarrow \text{LPFC}_T \rightarrow \text{WC}_{W3}$

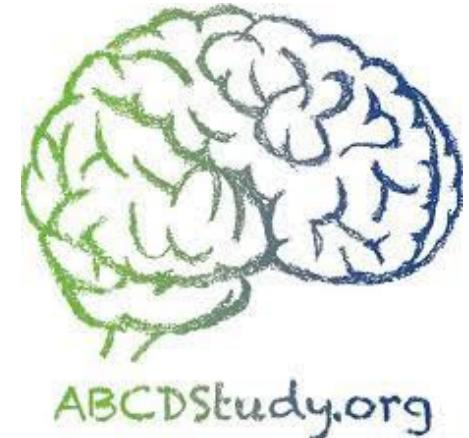


# Implications and future directions

- Future studies should employ **longer prospective data collection intervals** to more conclusively characterize the magnitude of the cross-lagged effects (ideally 10 years or more).
- Explore the **extent of bidirectionality** using other cognitive domains.
- Use a **comprehensive set** of adiposity measures in future studies.
- Utilize **brain morphology and functional imaging** data to explore bidirectionality.
- Explore the utility of **executive function training** in eating and weight loss interventions, particularly for those who have undergone bariatric surgery.
- Explore **novel methods** of enhancing executive function using **TMS**.

# Thank you..

UNIVERSITY OF  
**WATERLOO**



**Supervisor**

Dr. Peter Hall

**Collaborators**

Dr. Reza Ramezan

Dr. John Best

Dr. Mary Thompson

All the participants and research staffs associated with the CLSA and ABCD studies.

All the previous and current members of the Prevention Neuroscience Laboratory (Anna, Jessica, Alkarim, Adrian, Mia, Idris).



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