

# **Delineating the Possible Mechanisms Underlying Longitudinal Associations in Observational Studies on Aging**

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*“Aging seems to be the  
only available way to  
live a long life.”*

*Daniel Francois Esprit Auber*

*Via Troen, Mt Sinai J Med 70:3-22*

# Introduction

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- Holy grail?: What causes adverse aging?
  - Experimental data on humans: hard to come by
  - Observational, longitudinal data: central
- Cohort studies on aging abound
  - EPESE; CHS; HRS/ALIVE
  - Women's Health and Aging Study (WHAS)
  - InCHIANTI

# Introduction

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- Inflammation & Accelerated Aging
  - Cellular repair
  - Muscle wasting (*Ferrucci et al., JAGS 50:1947-54; Cappola et al, J Clin Endocrinol Metab 88:2019-25*)
  - Receptor inhibition: erythropoietin production / anemia (*Ershler, JAGS 51:S18-21*)
- Two themes
  - **Homeostasis/balance**: cytokines, hormones, nutrition, immune response
  - “Causal pathways”

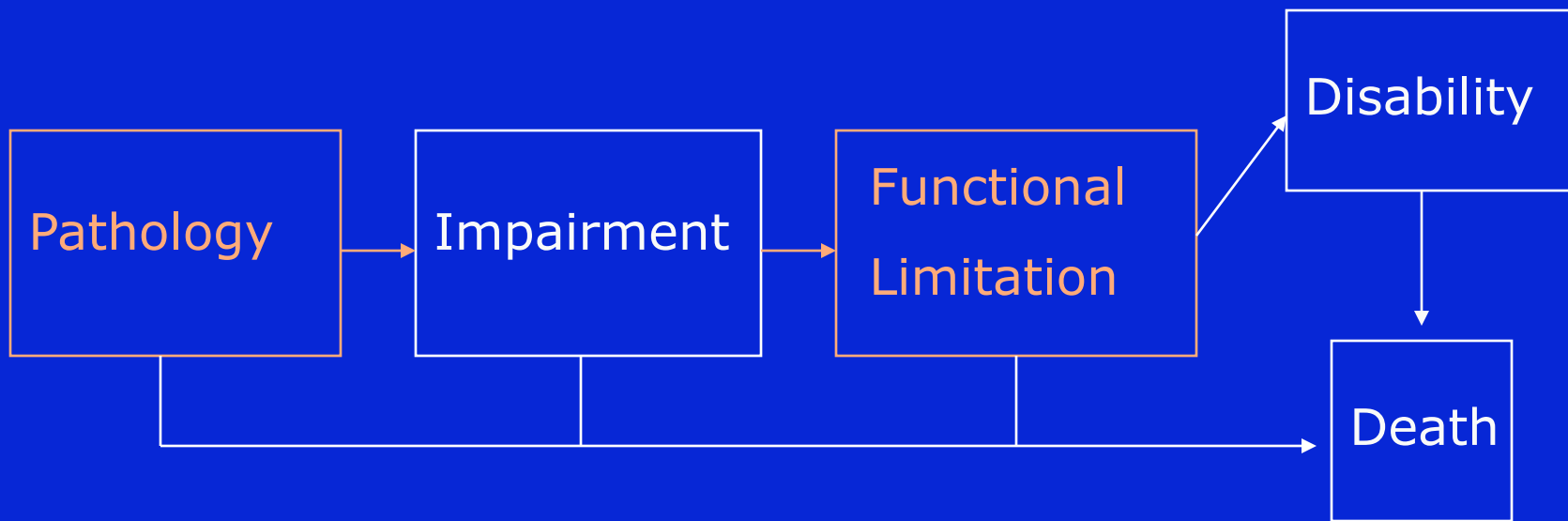
# Outline

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- Goals
  - To what extent “causal mechanisms”?
  - Balance of ideas, methods
- Two challenges in research on aging
- Causality in research on aging
- Methodology / Analysis
  - Focus: Imprecise measurement
  - Bidirectionality: an allusion

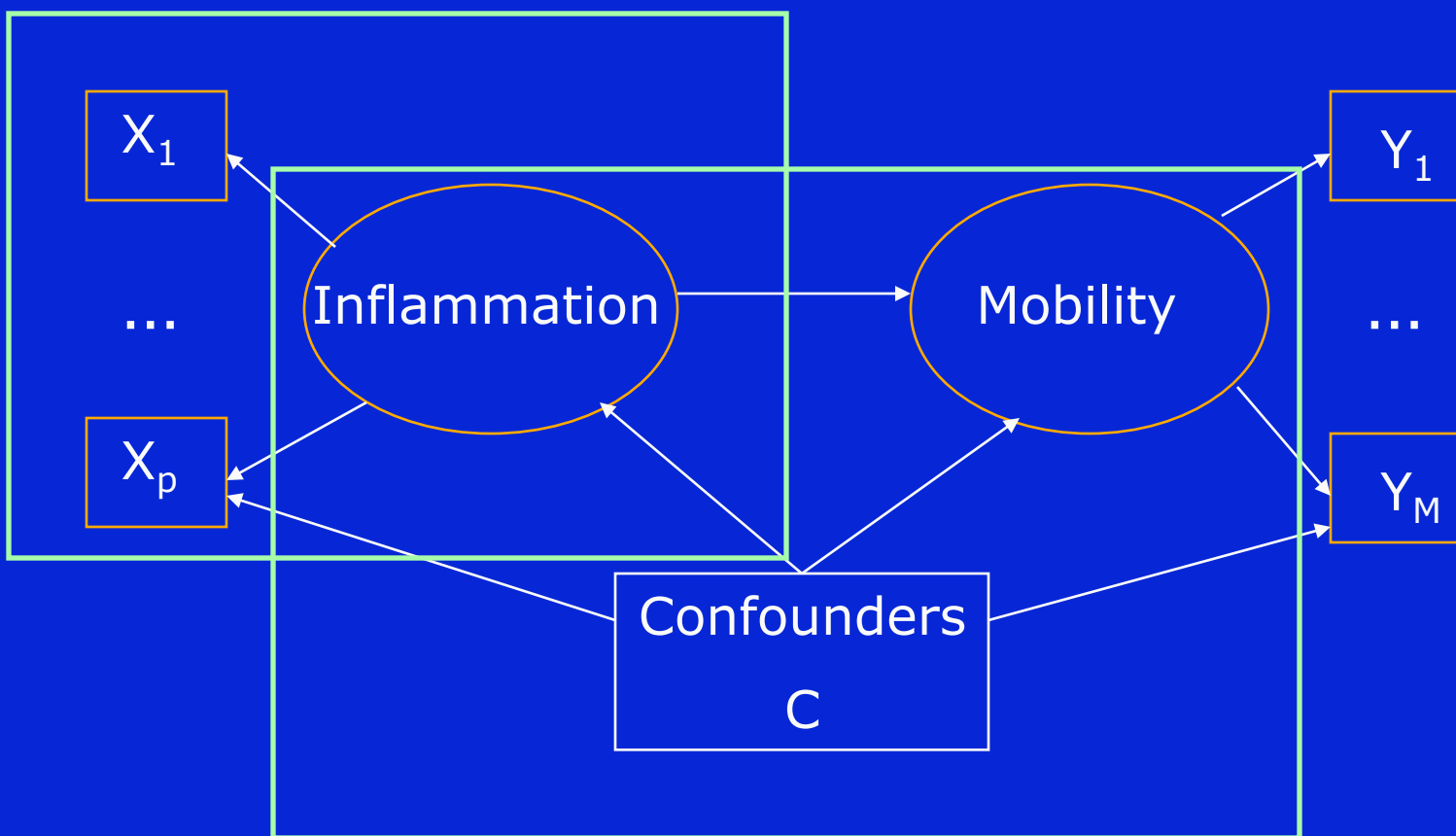
# Classic Conceptual Framework

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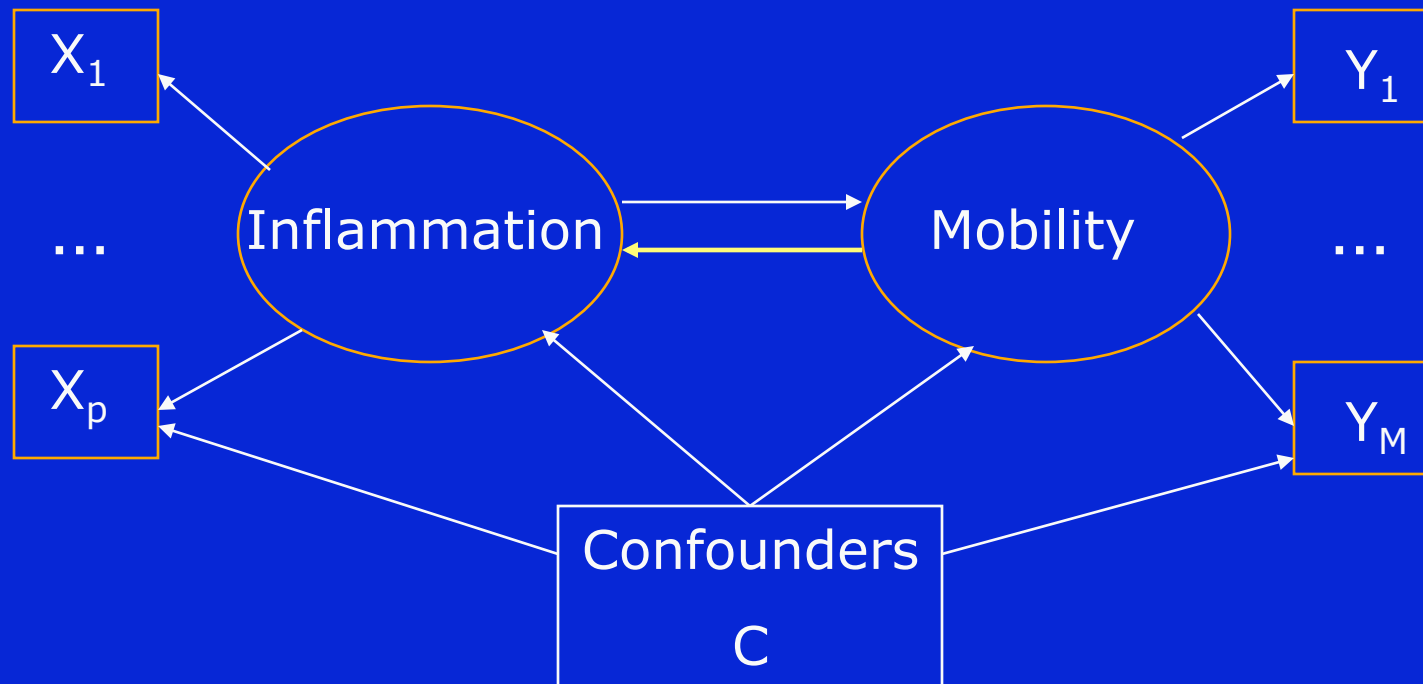
*WHO, 1980; IOM, 1991; Nagi, 1991*

# A Challenge: Determining Roles Amid Complex Measurement



# Another Challenge: Bidirectionality

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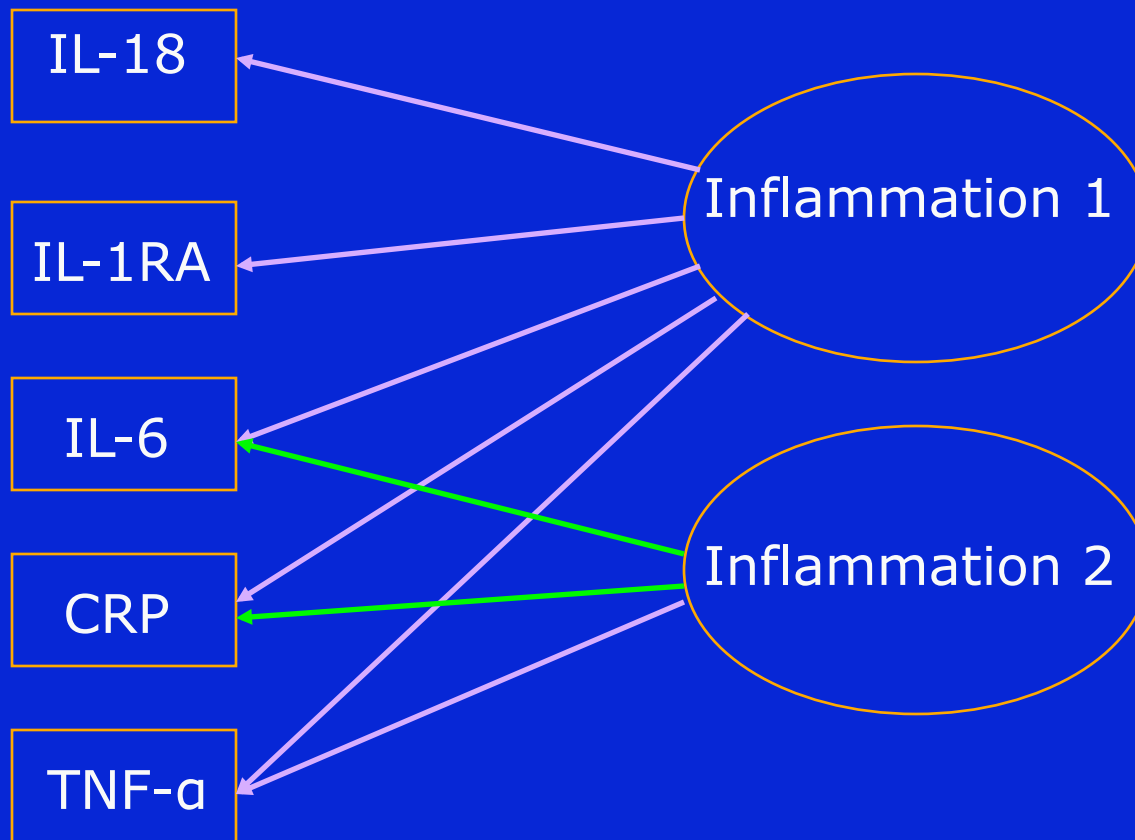
# Causal Models

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- Three queries (*Pearl, 2000*)
  - Predictions
    - “Probabilistic causality” (*von Suppes, 1970*)
    - Is bad function probable among the inflamed?
  - Interventions / Experiments (*Bollen, 1989*)
    - Association, temporality, isolation
    - Does bad function follow inflammation?
  - Counterfactual
    - Does one’s function change if inflamed vs. not?
    - *Neyman, 1923; Stalnaker, 1968; Lewis, 1973; Rubin, 1974; Robins 1986; Holland 1988*

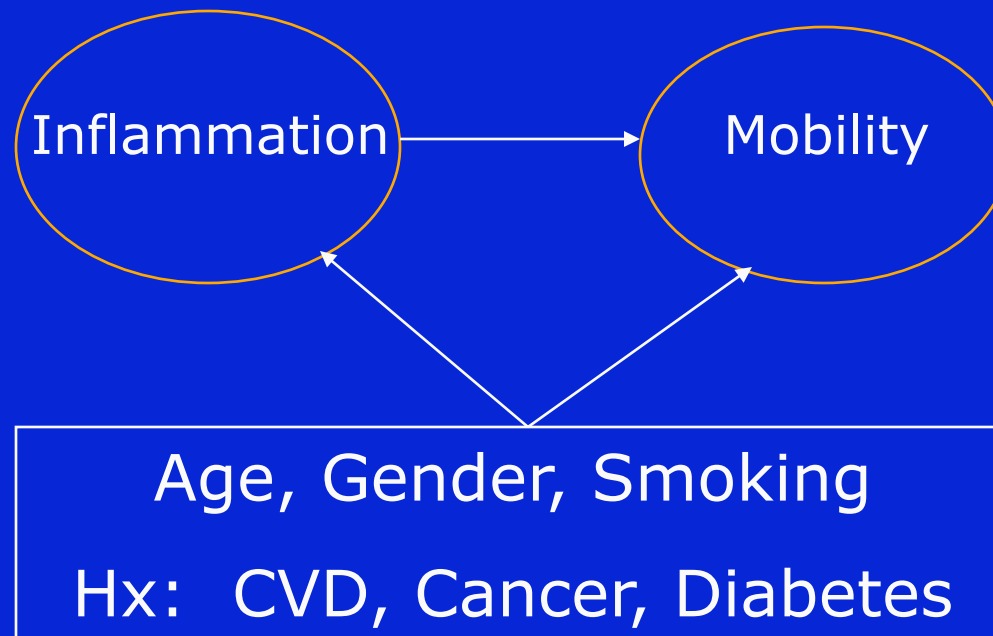
# Challenge #1: Complex Measurement

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# Toward “causal” inferences?

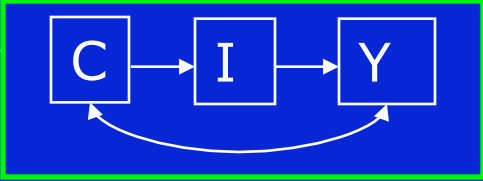
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- Propensity scoring (*Rosenbaum & Rubin, 1983; Imai & Van Dyk, 2004*)
- My work: Implementation amid latent variables

# Success of Approach:

## Counterfactual interpretation or no?

- $\{Y^{(t)}\} \perp\!\!\!\perp I \mid c$  ----- 

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graph LR; C[C] --> I[I]; I --> Y[Y]; C -.-> Y
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- I varies at all levels of c
- **Critical**: characteristics violating strong ignorability
- **Perhaps**: strong ignorability of [I,other] given "external" confounders

# Application: Study

InCHIANTI (*Ferrucci et al., JAGS, 48:1618-25*)

- **Aim** : Causes of walking decline
- Brief design
  - Random sample  $\geq 65$  years (n=1270)
  - Enrichment for oldest-old, younger ages
  - Participation:  $> 90\%$  in the primary sample
- Data
  - Home interview, blood draw, physical exam
  - This talk: one evaluation

# Application: Data

InCHIANTI (*Ferrucci et al., JAGS, 48:1618-25*)

- **Inflammation –5 cytokines**

*IL-6, CRP, TNF- $\alpha$ , IL-1RA, IL-18*

- **Functional elements – Z-score average**

*Usual & rapid speed; muscle power;  
range of motion; neurological intactness*

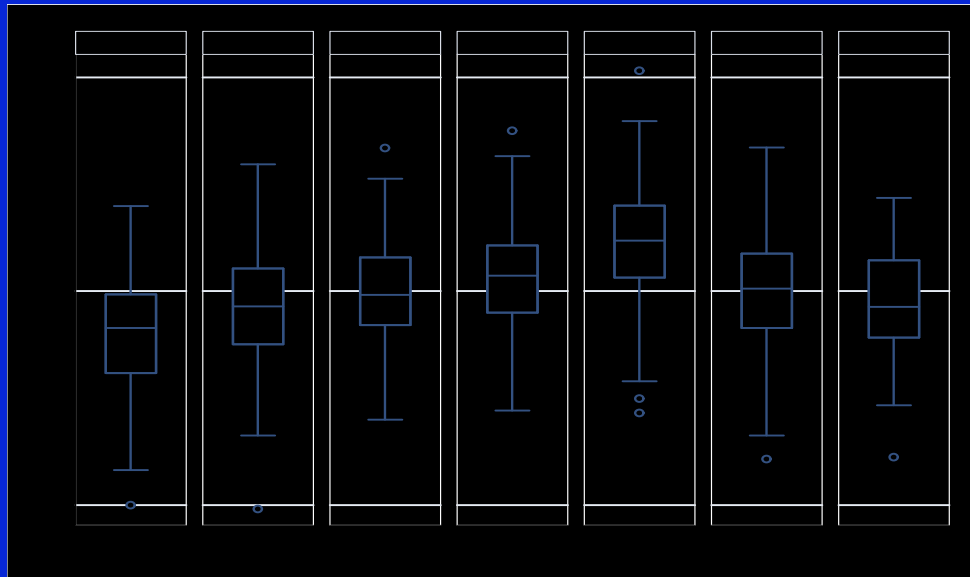
- **Confounders**

*Age, gender, history of: cancer,  
cardiovascular disease, diabetes, smoking*

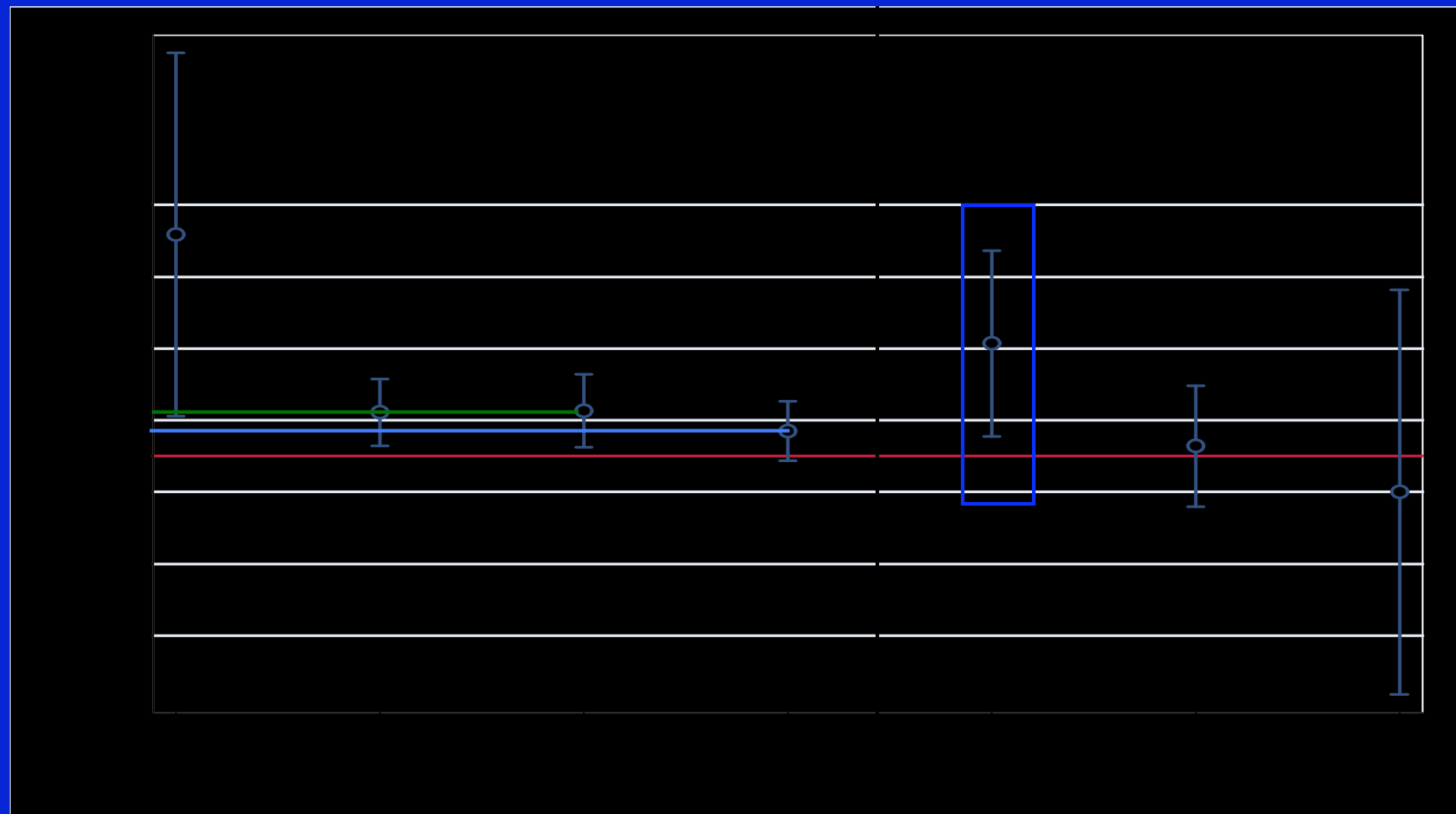
# Propensity Score Model

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- $I_1 \sim$  age, cancer hx, CVD hx
- $I_2 \sim$  age, gender, diabetes hx, smoking hx



# Inflammation Effects (Summary 2)



raw    adjusted    PS-full    PS-red. diab/sm    young    cancer



# Summary

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- “Causality” re natural history of aging: not an immediate concept
- Discussed here: Analytic strategies to advance toward causal inferences
- Needed: Assessment of extent to which causal mechanisms can be delineated with observational data on aging