

Predicting Problematic Internet Use

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The Problem

Systematic review and meta-analysis of epidemiology of internet addiction

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Internet addiction
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Gaming disorder
Prevalence
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ABSTRACT

Background: The field of internet addiction has experienced significant debates. A meta-analysis investigated the prevalence rates of generalized internet addiction (IGD).

Methods: We included 113 epidemiologic studies covering 693,306 subjects with IGD. We examined prevalence rates for GIA or IGD. We examined prevalence rates for GIA or IGD. We examined prevalence rates for GIA or IGD.

Results: All 133 effect sizes included 53,184 subjects with GIA or IGD. We examined prevalence rates for GIA or IGD. We examined prevalence rates for GIA or IGD.

Conclusions: The prevalence of GIA was higher than the prevalence of IGD over time and varied with different assessments. Our results suggest a human-machine interaction.

1. Introduction

Although internet addiction has become a popular research topic more than two decades, the reported prevalence rates of internet addiction may still be influenced by the wide range of conceptual approaches. Young (1996) first conceptualized internet addiction as a generalized impulse control disorder based on its core psychopathological features—impaired control. Griffiths (1996) described this kind of technological addiction as behavioral addiction that involves human-machine interactions. Similarly, Beard (2005) claimed that internet addiction should be classified as a type of behavioral addiction. In 2013, the American Psychiatric Association (APA) specified criteria of the DSM-5 (APA, 2013). The World Health Organization (WHO) has also listed “Gaming Disorder” as a substance use and addictive disorders in the ICD-11 beta draft (WHO, 2018). However, the psychopathological foundation of internet addiction is still controversial (King et al., 2018; Rumpf et al., 2018). Most self-report scales evaluating internet addiction were

developed based on use disorder (Cher Young, 1998), Altonostic criteria, and the prevalence (Shaw and Blum, 2000). In previous years, significant dependent sequent years, (APA, 2013) fuv go f

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Internet Use, Depression, and Anxiety in a Healthy Adolescent Population: Prospective Cohort Study

Thom et al

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Abstract

Background: Psychiatric disorders, including conduct disturbances, substance abuse, and affective disorders, have increased in prevalence among adolescents. In parallel with the rise in internet use, the prevalence of depression and anxiety has increased. It remains unclear whether and how internet use impacts mental health in adolescents.

Objective: We assess the association between patterns of internet use and two mental health outcomes (depression and anxiety) in a healthy adolescent population.

Methods: A total of 126 adolescents between the ages of 12 and 15 years were recruited. Participants reported their computer and internet usage patterns. At baseline and one-year follow-up, they completed the Beck Depression Index for Primary Care (BDI-PC) and the Beck Anxiety Inventory for Primary Care (BAI-PC). Individual linear regressions were completed to determine the association between markers of internet use at baseline and mental health outcomes at one-year follow-up. All models controlled for age, gender, and ethnicity.

Results: There was an inverse correlation between minutes spent on a favorite website per visit and BAI-PC score. No association was found between internet use and BDI-PC score.

Conclusions: There is no relationship between internet use patterns and depression in adolescents, whereas internet use may mitigate anxiety in adolescents with higher levels of baseline anxiety.

(JMIR Ment Health 2018;5(2):e44) doi: [10.2196/mental.8471](https://doi.org/10.2196/mental.8471)

KEYWORDS

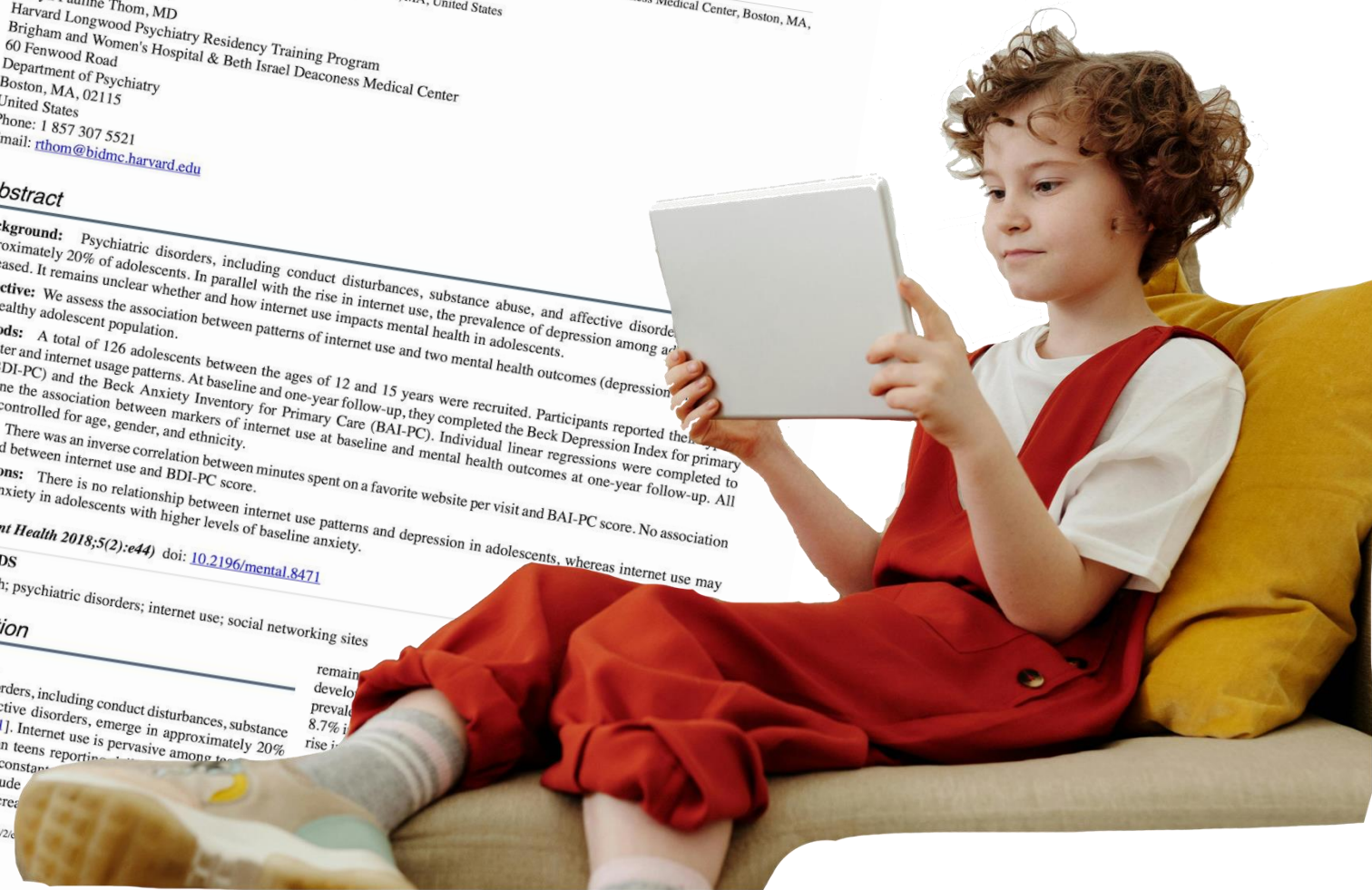
mental health; psychiatric disorders; internet use; social networking sites

Introduction

Background

Psychiatric disorders, including conduct disturbances, substance abuse, and affective disorders, emerge in approximately 20% of adolescents [1]. Internet use is pervasive among the 92% of American teens reporting nearly constant internet use during adolescence include self-image, and cre

remain
develop
prevalen
8.7% i
rise i



Client Identifier: _____

Physical Activity Level Questionnaire

Current Exercise Program

- Do you exercise regularly? Yes No
 - If not, are you interested in starting to exercise regularly? Yes No
- Are there any medical conditions that preclude you from exercising? Yes No
Specify: _____
- Do you have a medical condition or other physical reason not mentioned here that might need special attention in an exercise program (such as insulin-dependent diabetes, injury...)? Yes No
Specify: _____

If you answered yes to Question 1, please complete the following:

Activity	Times Per Week	Minutes Per Session
<input type="checkbox"/> Brisk Walking		
<input type="checkbox"/> Aerobics		
<input type="checkbox"/> Dance		
<input type="checkbox"/> Run		
<input type="checkbox"/> Bicycle		
<input type="checkbox"/> Team Sports		
Specify:		
<input type="checkbox"/> Yoga		
<input type="checkbox"/> Stretching		
<input type="checkbox"/> T'ai Chi Chaun		
<input type="checkbox"/> Weight Lift		
<input type="checkbox"/> Swimming		
<input type="checkbox"/> Skiing		
<input type="checkbox"/> Rope Jumping		



Child Mind Institute

The Goal

Identify early signs of problematic internet use based on physical activity and fitness data.

5,000 children
Ages 5 through 22

No participants with complete data

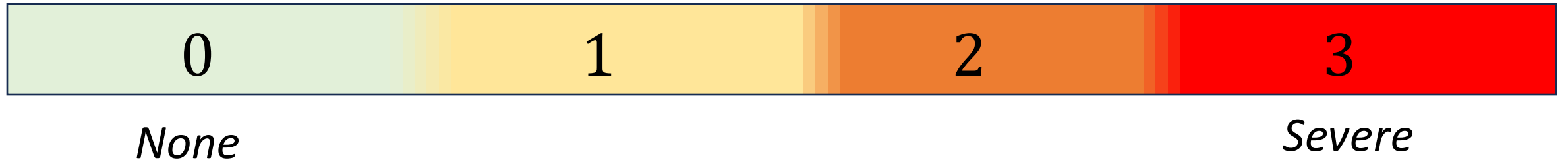


**Child Mind
Institute**

HEALTHY BRAIN NETWORK

The Data

Parent-Child Internet Addiction Test (PCIAT)



Severity Impairment Index (SII)

~3000 with at least some target information

Impute missing PCIAT scores

The Data: Target Variable

Demographics

Age

Sex

Physical

Height

Weight

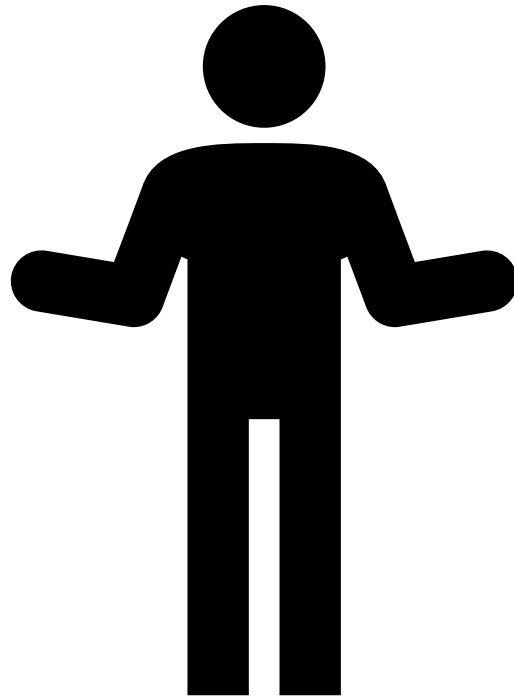
BMI

Waist

Systolic BP

Diastolic BP

Heart Rate



The Data: Predictor Variables

Demographics
Age
Sex

Physical
Height
Weight
BMI
Waist
Systolic BP
Diastolic BP
Heart Rate

Internet Use
Hours per Day

Children's Global Assessment Scale

Sleep Disturbance Scale

Physical Activity Questionnaire



PAQ MVPA Zone

Client Identifier: _____

Physical Activity Level Questionnaire

Current Exercise Program

1. Do you exercise regularly?
1a. If not, are you interested in starting to exercise regularly? Yes No

2. Are there any medical conditions that preclude you from exercising?
Specify: Yes No

3. Do you have a medical condition or other physical reason not mentioned here that might need special attention in an exercise program (such as insulin-dependent diabetes, injury...)? Yes No
Specify: _____

If you answered yes to Question 1, please complete the following:

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<input type="checkbox"/> Dance		
<input type="checkbox"/> Run		
<input type="checkbox"/> Bicycle		
<input type="checkbox"/> Team Sports		
Specify: <input type="checkbox"/> Yoga		
<input type="checkbox"/> Stretching		
<input type="checkbox"/> T'ai Chi Chaun		
<input type="checkbox"/> Weight Lift		
<input type="checkbox"/> Swimming		
<input type="checkbox"/> Skiing		
<input type="checkbox"/> Rope Jumping		

The Data: Predictor Variables

Demographics
Age
Sex

Physical
Height
Weight
BMI
Waist
Systolic BP
Diastolic BP
Heart Rate

Internet Use
Hours per Day

Children's Global Assessment Scale

Sleep Disturbance Scale

Physical Activity Questionnaire

PAQ MVPA Zone

Fitness
Endurance Time
Endurance Max
Curl-Up
Grip Strength D
Grip Strength ND
Push-Up
Sit & Reach Left
Sit & Reach Right
Trunk Lift

Fitness Zone
Curl-Up
Grip Strength D
Grip Strength ND
Push-Up
Sit & Reach Left
Sit & Reach Right
Trunk Lift



The Data: Predictor Variables

Demographics
Age
Sex

Physical
Height
Weight
BMI
Waist
Systolic BP
Diastolic BP
Heart Rate

Internet Use
Hours per Day

Children's Global Assessment Scale

Sleep Disturbance Scale

Physical Activity Questionnaire

PAQ MVPA Zone

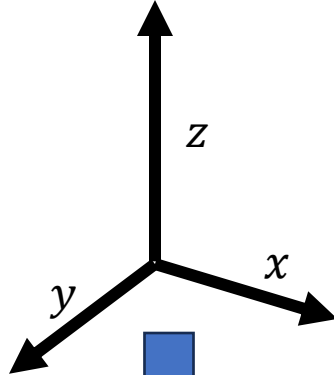
Fitness
Endurance Time
Endurance Max
Curl-Up
Grip Strength D
Grip Strength ND
Push-Up
Sit & Reach Left
Sit & Reach Right
Trunk Lift

Fitness Zone
Curl-Up
Grip Strength D
Grip Strength ND
Push-Up
Sit & Reach Left
Sit & Reach Right
Trunk Lift

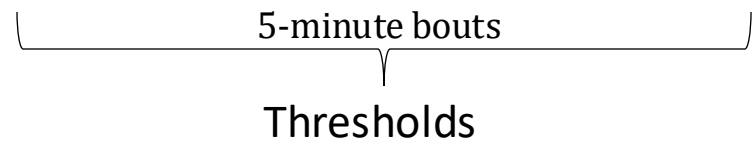
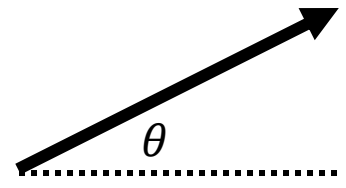
BIA
Bone Mineral Content
BMI
Basal Metabolic Rate
Daily Energy Exp.
Extracellular Water
Fat Free Mass
FFM Index
Fat Mass Index
Body Fat Percentage
Body Frame
Intracellular Water
Lean Dry Mass
Lean Soft Tissue
Skeletal Muscle Mass
Total Body Water

The Data: Predictor Variables

Continuous recording of accelerometer data for ~1000 subjects spanning many days.



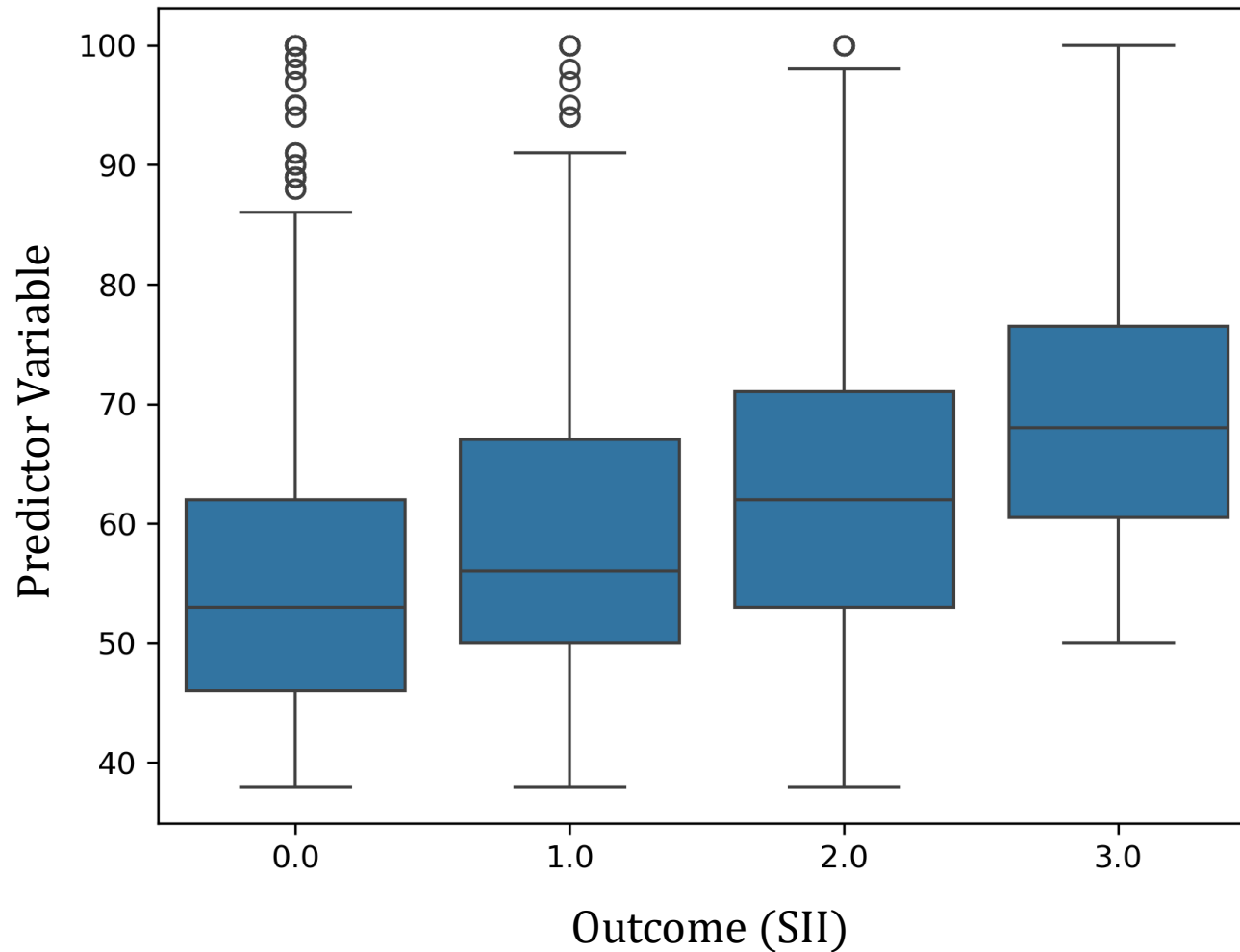
ENMO



The Data: Actigraphy

Missing data

Little predictive power

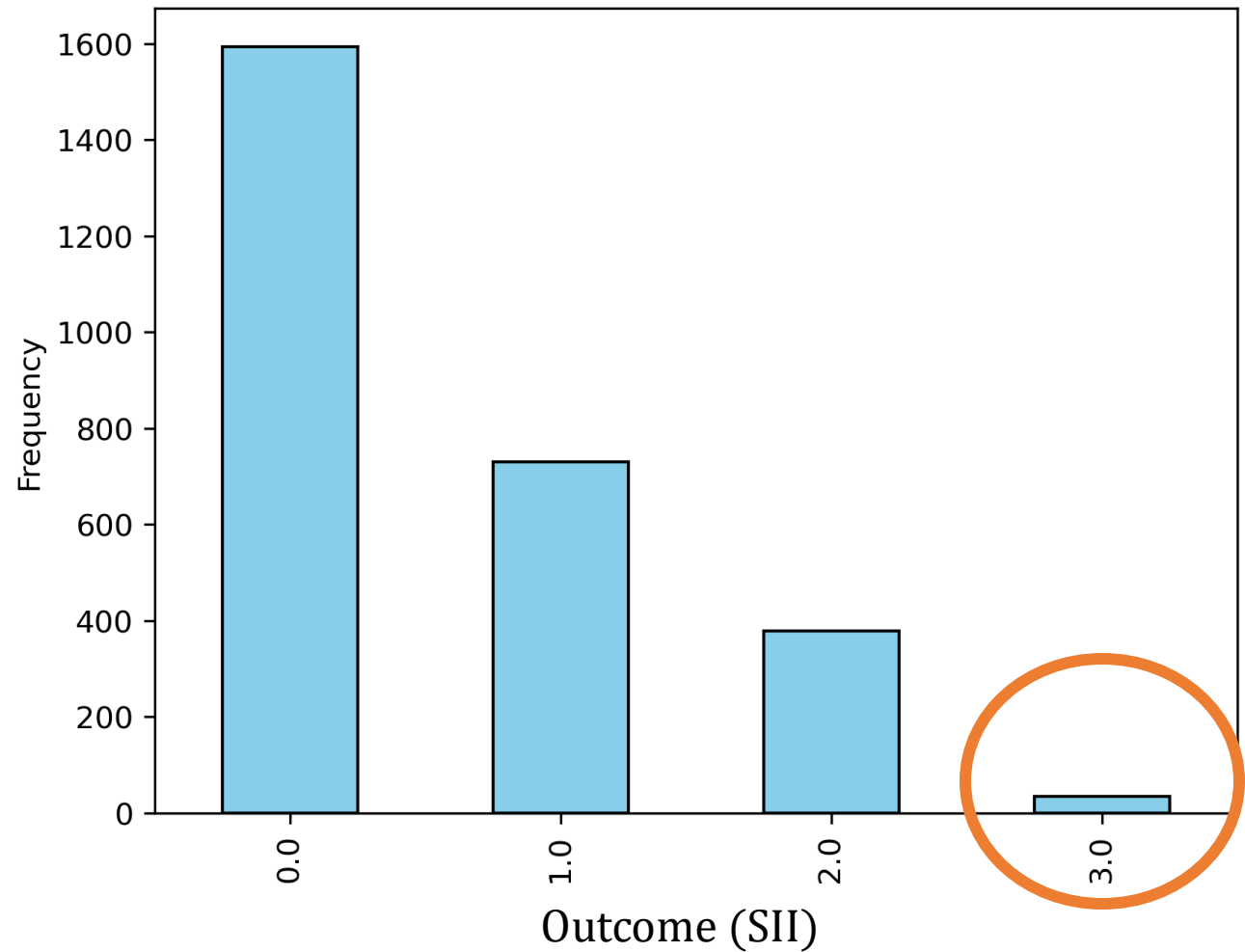


Data Challenges

Missing data

Little predictive power

Sparse data for SII score 3.



Data Challenges

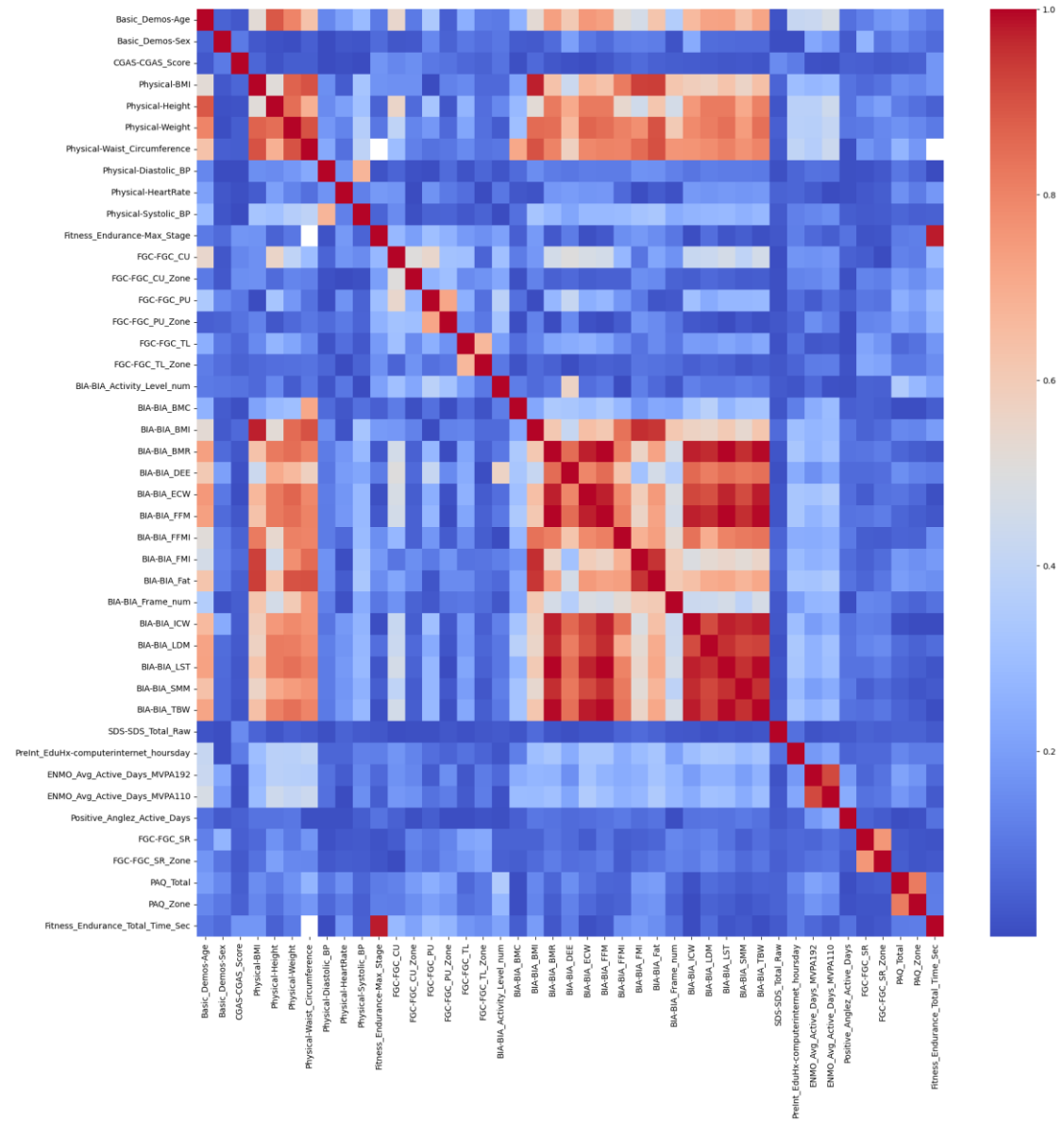
Missing data

Little predictive power

Sparse data for SII score 3.

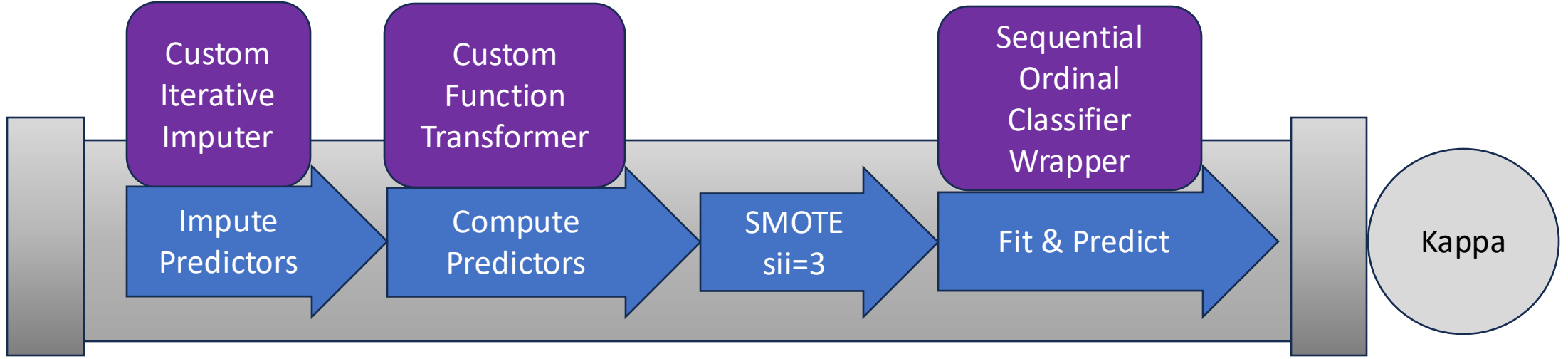
Feature Reduction

Feature Selection



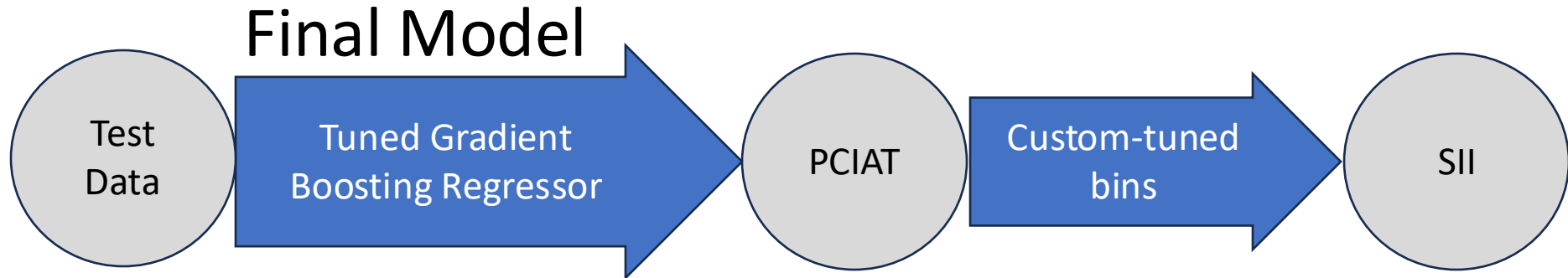
Data Challenges

Cleaned, Computed,
Outcome-Imputed, Feature-
Selected Data



- SLR
- MLR
- Logistic
- Random Forest + Tuning
- SVR
- AdaBoost
- GradientBoost
- XGBoost

Modeling Process



$\kappa = 0.456$

Kaggle leader: $\kappa = 0.5$

0	212	71	32	0
1	47	41	53	0
2	12	31	38	0
3	0	0	4	0
	0	1	2	3

True SII Value

Predicted SII Value

Final Results

Predicting problematic internet use is difficult... with the provided data

Expand methods for ordinal data

Final Results