

# Structure not just Severity

Seth C. Hopkins, PhD



Sam  
Tomioka



Ken  
Koblan



Steven  
Szabo

# DISCLOSURES

employees of Sumitomo Pharma America, Inc.

## Seth C. Hopkins, PhD



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# Key concepts will be represented by historical figures



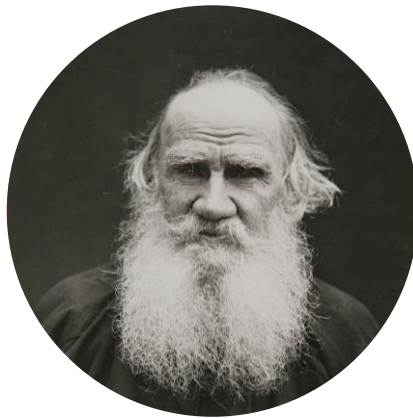
John F. Kennedy  
1917-1963



Ludwig Boltzmann  
1844-1906



James Clerk Maxwell  
1831- 1879



Leo Tolstoy  
1828-1910



Emil Kraepelin  
1856-1926



Eugen Bleuler  
1857-1939

# Can we flip the problem (of measurement)?

*Ask not what scale is best for your study...  
...but what participants are best for your scale*



John F. Kennedy

## PANSS

### The Positive and Negative Syndrome Scale (PANSS) for Schizophrenia

by Stanley R. Kay, Abraham Flaszbein, and Lewis A. Opler

#### Abstract

The variable results of positive-negative research with schizophrenia underscore the importance of well-characterized, standardized measurement techniques. We report on the development and initial standardization of the Positive and Negative Syndrome Scale (PANSS) for typological and dimensional assessment. Based on two established psychiatric rating systems, the 30-item PANSS was conceived as an operationalized, drug-sensitive instrument that provides balanced representation of positive and negative symptoms and gauges their relationship to one another and to global psychopathology. It thus constitutes four scales measuring positive and negative syndromes, their differential, and general severity of illness. Study of 101 schizophrenics found the four scales to be normally distributed and supported their reliability and stability. Positive and negative scores were inversely correlated once their common association with general psychopathology was extracted, suggesting that they represent mutually exclusive constructs. Review of five studies involving the PANSS provided evidence of its criterion-related validity with antecedent, genealogical, and concurrent measures, its predictive validity, its drug sensitivity, and its utility for both typological and dimensional assessment.

## MADRS

*Brit. J. Psychiat.* (1979), 134, 382-9

### A New Depression Scale Designed to be Sensitive to Change

By STUART A. MONTGOMERY and MARIE ÅSBERG

**SUMMARY** The construction of a depression rating scale designed to be particularly sensitive to treatment effects is described. Ratings of 54 English and 52 Swedish patients on a 65 item comprehensive psychopathology scale were used to identify the 17 most commonly occurring symptoms in primary depressive illness in the combined sample.

Ratings on these 17 items for 64 patients participating in studies of four different antidepressant drugs were used to create a depression scale consisting of the 10 items which showed the largest changes with treatment and the highest correlation to overall change.

The inter-rater reliability of the new depression scale was high. Scores on the scale correlated significantly with scores on a standard rating scale for depression, the Hamilton Rating Scale (HRS), indicating its validity as a general severity estimate. Its capacity to differentiate between responders and non-responders to antidepressant treatment was better than the HRS, indicating greater sensitivity to change. The practical and ethical implications in terms of smaller sample sizes in clinical trials are discussed.

# Visualize the key mathematical construct

symptom structure is inside the matrix

Variance-Covariance Matrix

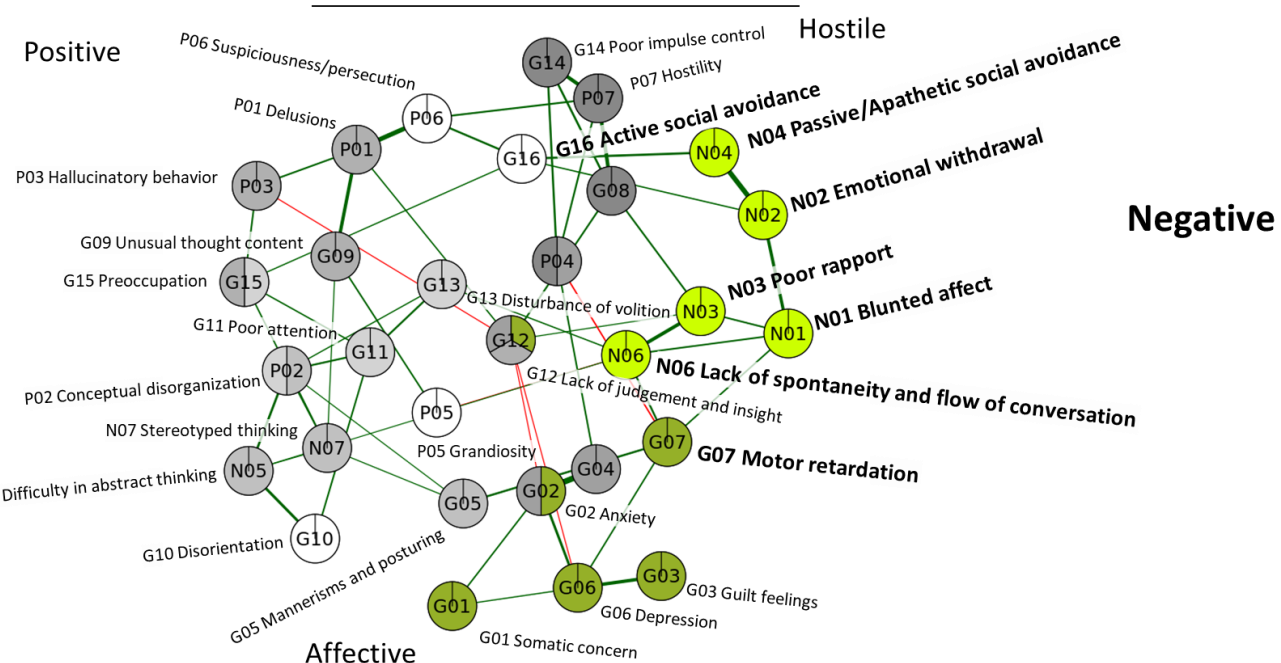
PANSS  
acute schizophrenia

13 trials  
N=5,793



Negative symptom change is difficult to interpret (in standard trials of acute schizophrenia)

ITEM	0.94	1.44	2.03	1.04	1.03	1.70	1.03	1.36	1.14	1.40	1.22	1.18	0.97	0.99	1.12	1.14	1.29	1.27	1.12	1.16	0.87	1.10	1.14	1.40	1.27	1.45	1.50	1.07	1.55	
P01 DELUSIONS	0.94																													
P03 HALLUCINATORY BEHAVIOR	0.31	1.44																												
P05 GRANDIOSITY	0.30	0.18	2.03																											
P06 SUSPICIOUSNESS/PERSECUTION	0.48	0.23	0.09	1.04																										
N07 STEREOTYPED THINKING	0.17	0.05	0.20	0.04	1.03																									
G01 SOMATIC CONCERN	0.10	0.06	0.16	0.09	0.18	1.70																								
G09 UNUSUAL THOUGHT CONTENT	0.44	0.20	0.40	0.17	0.28	0.18	1.03																							
G12 LACK OF JUDGEMENT AND INSIGHT	0.24	-0.10	0.02	0.05	0.25	0.02	0.28	1.36																						
P02 CONCEPTUAL DISORGANIZATION	0.12	0.00	0.12	-0.06	0.38	0.11	0.27	0.33	1.14																					
N05 DIFFICULTY IN ABSTRACT THINKING	0.01	0.10	0.09	-0.05	0.29	0.06	0.11	0.25	0.46	1.40																				
G05 MANNERISMS AND POSTURING	0.02	-0.02	0.10	-0.05	0.30	0.14	0.14	0.18	0.32	0.14	1.22																			
G10 DISORIENTATION	0.01	0.17	0.20	0.01	0.10	0.13	0.04	0.15	0.20	0.42	0.16	1.18																		
G11 POOR ATTENTION	0.05	0.06	0.07	0.00	0.25	0.08	0.13	0.23	0.42	0.31	0.28	0.29	0.97																	
G13 DISTURBANCE OF VOLITION	0.07	0.03	-0.08	0.00	0.27	0.09	0.14	0.26	0.37	0.23	0.30	0.12	0.38	0.99																
G15 PREOCCUPATION	0.24	0.31	0.14	0.15	0.33	0.10	0.28	0.23	0.30	0.16	0.27	0.21	0.33	0.31	1.12															
P04 EXCITEMENT	0.19	0.10	0.32	0.19	0.20	0.16	0.16	0.03	0.20	0.07	0.12	0.06	0.20	0.07	0.16	1.14														
P07 HOSTILITY	0.20	0.03	0.17	0.33	0.13	0.08	0.12	0.14	0.04	-0.01	0.04	0.00	0.07	0.02	0.09	0.46	1.29													
G08 UNCOOPERATIVENESS	0.15	-0.04	0.07	0.19	0.23	0.04	0.16	0.38	0.19	0.08	0.22	0.10	0.26	0.20	0.21	0.34	0.68	1.27												
G14 POOR IMPULSE CONTROL	0.12	0.01	0.15	0.16	0.14	0.11	0.13	0.10	0.09	0.01	0.06	0.01	0.14	0.09	0.13	0.46	0.67	0.55	1.12											
N01 BLUNTED AFFECT	-0.06	0.01	-0.20	-0.03	0.14	0.01	-0.05	0.10	0.19	0.23	0.23	0.10	0.15	0.27	0.16	-0.19	-0.12	0.01	-0.13	1.16										
N02 EMOTIONAL WITHDRAWAL	-0.01	0.06	-0.16	0.03	0.10	-0.01	0.00	0.10	0.15	0.18	0.12	0.09	0.11	0.21	0.16	-0.12	-0.02	0.07	-0.06	0.54	0.87									
N03 POOR RAPPORT	0.01	-0.04	-0.19	0.02	0.21	-0.04	0.05	0.35	0.26	0.25	0.29	0.08	0.28	0.31	0.23	-0.01	0.16	0.37	0.06	0.52	0.41	1.10								
N04 PASSIVE/APATHETIC SOCIAL WITHDRAWAL	-0.01	0.05	-0.18	0.02	0.13	-0.01	0.00	0.12	0.15	0.19	0.14	0.09	0.11	0.24	0.18	-0.13	-0.02	0.09	-0.08	0.51	0.64	0.42	1.14							
N06 LACK OF SPONTANEITY AND FLOW OF CONVERSATION	-0.11	-0.01	-0.33	-0.06	0.23	-0.06	-0.04	0.26	0.28	0.36	0.31	0.16	0.28	0.42	0.23	-0.14	-0.01	0.22	-0.04	0.62	0.47	0.71	0.51	1.40						
G07 MOTOR RETARDATION	-0.10	0.02	-0.13	-0.07	0.09	0.11	-0.08	-0.01	0.09	0.16	0.35	0.14	0.17	0.29	0.16	-0.22	-0.07	0.10	-0.11	0.49	0.32	0.35	0.35	0.56	1.27					
G16 ACTIVE SOCIAL AVOIDANCE	0.18	0.17	0.00	0.34	0.08	0.01	0.08	0.01	-0.01	0.05	0.08	0.08	0.06	0.18	0.26	0.04	0.16	0.20	0.13	0.19	0.33	0.20	0.41	0.22	0.19	1.12				
G02 ANXIETY	0.09	0.23	0.17	0.26	-0.03	0.39	-0.04	-0.38	-0.14	-0.10	0.01	0.11	0.02	-0.02	0.07	0.25	0.11	-0.05	0.12	-0.08	-0.05	-0.17	-0.03	-0.20	0.01	0.23	1.45			
G03 GUILT FEELINGS	-0.01	0.10	0.21	0.06	0.02	0.32	0.00	-0.30	-0.11	-0.07	0.00	0.03	-0.02	0.00	-0.01	0.06	0.05	-0.07	0.10	-0.06	-0.02	-0.15	-0.01	-0.12	0.12	0.07	0.43	1.50		
G04 TENSION	0.04	0.11	0.10	0.15	0.09	0.24	0.03	-0.22	0.01	0.02	0.15	0.05	0.16	0.12	0.13	0.31	0.11	0.07	0.16	-0.01	0.00	-0.02	0.02	0.00	0.07	0.17	0.77	0.29	1.07	
G06 DEPRESSION	-0.04	0.13	0.09	0.14	-0.10	0.37	-0.12	-0.41	-0.23	-0.13	-0.08	0.11	-0.09	-0.11	-0.03	0.00	0.06	-0.10	0.03	-0.01	0.03	-0.20	0.05	-0.15	0.22	0.17	0.67	0.64	0.35	1.55



Total Score

pre-randomization data (screening and baseline)

Hopkins SC, Tomioka S, Ogirala A, Loebel A, Koblan KS, Marder SR. *Assessment of Negative Symptoms in Clinical Trials of Acute Schizophrenia: Test of a Novel Enrichment Strategy*. Schizophrenia Bulletin Open, Volume 3, Issue 1, January 2022





# Symptom structure is ergodic

**BETWEEN-SUBJECTS**  
**(FIXED IN TIME)**

“cross-section”

Variance-Covariance Matrix

ABSOLUTE SCORES

look a lot alike

=

**WITHIN-SUBJECTS**  
**(OVER TIME)**

“longitudinal”

Variance-Covariance Matrix

CHANGE SCORES



Ludwig Boltzmann

Ergodic Theory - that it is as good to observe a system over time as it is to make many independent observations of the same system

# Two ways to reveal symptom structure

**BETWEEN-SUBJECTS  
(FIXED IN TIME)**

**WITHIN-SUBJECTS  
(OVER TIME)**

“cross-section”

“longitudinal”

look a lot alike

Variance-Covariance Matrix

=

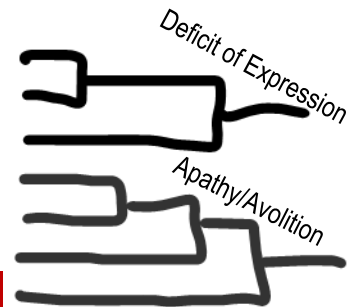
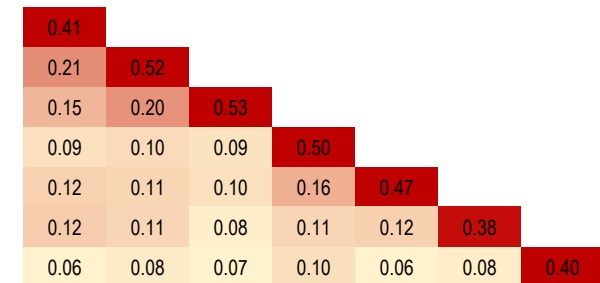
Variance-Covariance Matrix

ABSOLUTE SCORES

CHANGE SCORES



N02 EMOTIONAL WITHDRAWAL  
 N04 PASSIVE/APATHETIC SOCIAL WITHDRAWAL  
 G16 ACTIVE SOCIAL AVOIDANCE  
 N06 LACK OF SPONTANEITY AND FLOW OF CONVERSA  
 N03 POOR RAPPOR  
 N01 BLUNTED AFFECT  
 G07 MOTOR RETARDATION





# We can measure symptom structure prior to study entry



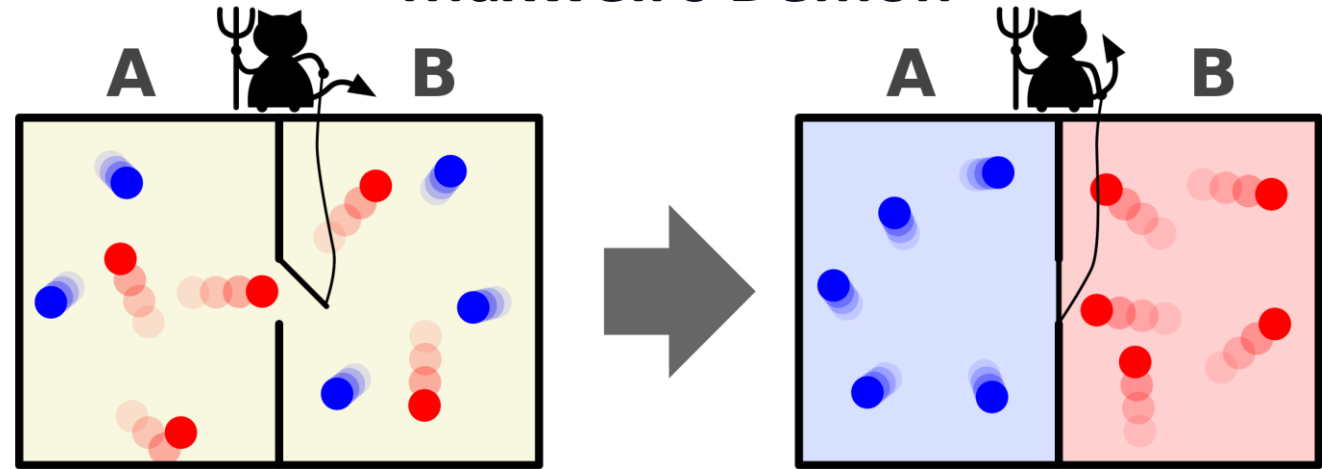
**idea:** what if we could detect symptom structure in individual subjects?

WE COULD DO ENRICHMENT



James Clerk Maxwell

Maxwell's Demon



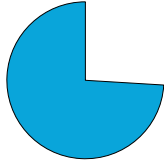
subjects having the most variance explained by a negative symptom construct

subjects whose symptom variance is **NOT** explained by a negative symptom construct



# SINGLE SUBJECTS' VECTORS

CANONICAL SYMPTOMS

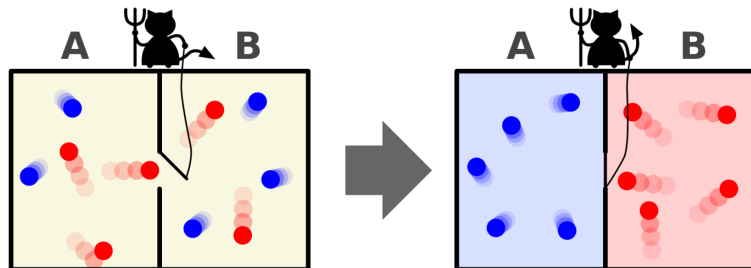
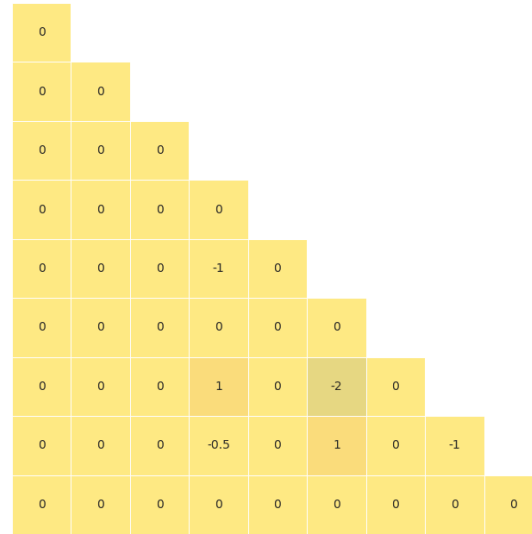
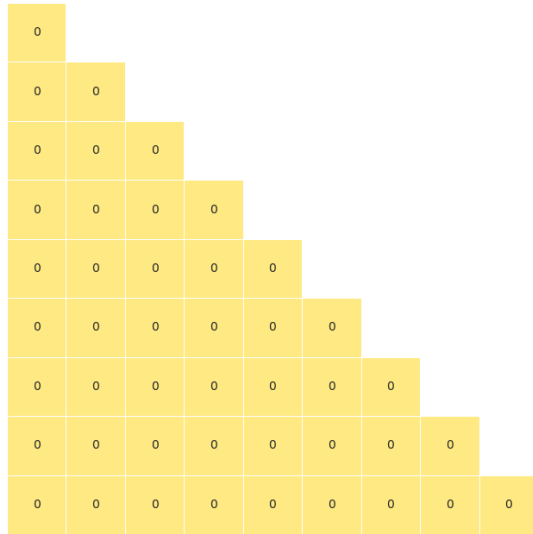


many vectors resemble each other

ANOMALOUS SYMPTOMS



some look different, but each in their own way



# POPULATION'S MATRIX

Variance-Covariance Matrix

**MADRS**

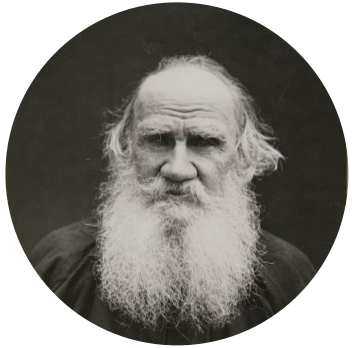
bipolar depression

5 trials  
N=2,026 subjects

Apparent Sadness	0.63									
Reported Sadness	0.36	0.65								
Inner Tension	0.13	0.13	1.21							
Reduced Sleep	0.19	0.14	0.11	1.92						
Reduced Appetite	0.33	0.30	0.05	0.52	2.66					
Concentration Difficulties	0.17	0.18	0.23	0.16	0.20	1.02				
Lassitude	0.21	0.21	0.10	0.12	0.31	0.26	0.89			
Inability to Feel	0.23	0.23	0.12	0.10	0.25	0.23	0.32	0.90		
Pessimistic Thoughts	0.14	0.14	0.34	0.00	0.07	0.20	0.16	0.27	1.23	
Suicidal Thoughts	0.04	0.06	0.07	0.01	0.04	0.02	0.05	0.10	0.22	0.77

# Anomalous symptom structures are easily isolated

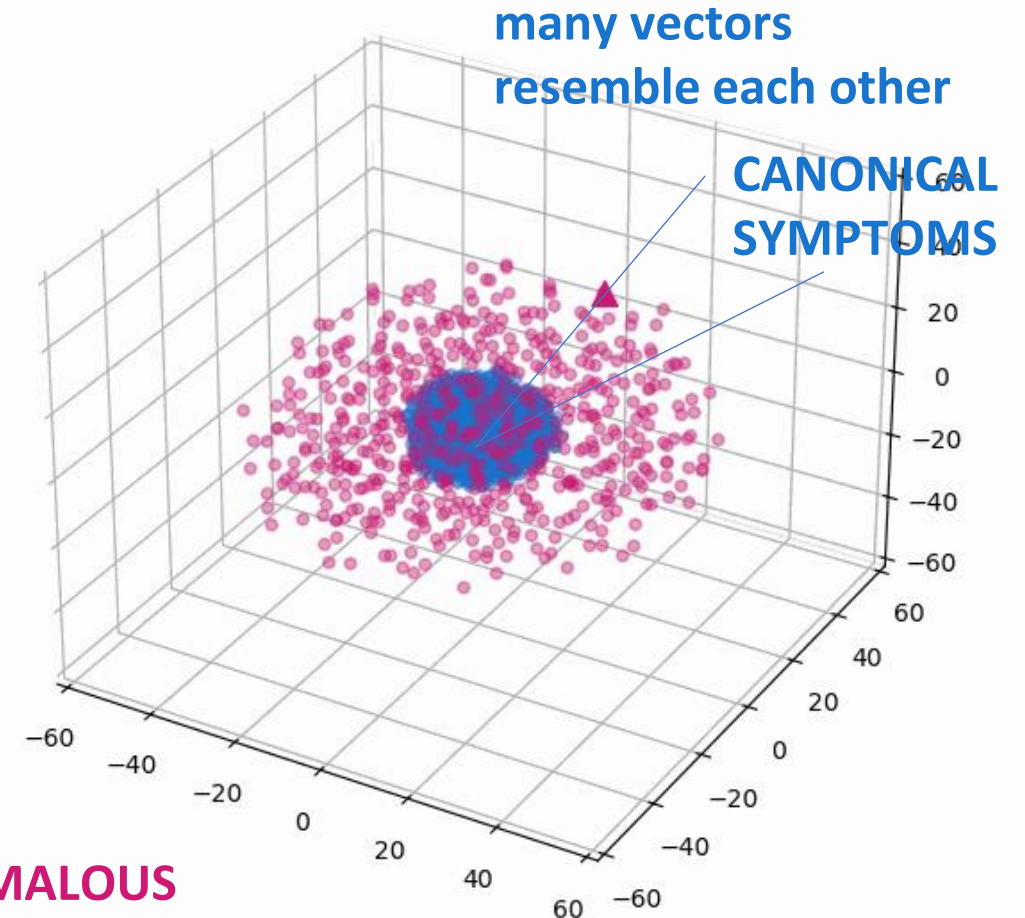
**Conjecture:** canonical symptom structures (*canonical vectors*) resemble each other, but every anomalous symptom structure is different in its own way (*anomalous vectors*).



Leo Tolstoy

ANNA KARENINA  
CHAPTER I  
ALL happy families resemble one another; every unhappy family is unhappy **in its own way.**

The premise of the **Isolation Forest algorithm** is that anomalous data points are easier to separate from the rest of the sample



**ANOMALOUS SYMPTOMS**

**some vectors look different, but each in their own way**

# BIPOLAR DATASET

**ANOMALOUS SYMPTOMS**



**CANONICAL SYMPTOMS**

5 legacy trials  
N=2,026 subjects

# PROSPECTIVE USE

1 trial  
N=129 subjects, pre-randomization data



Phase 3 trial

# RETROSPECTIVE USE

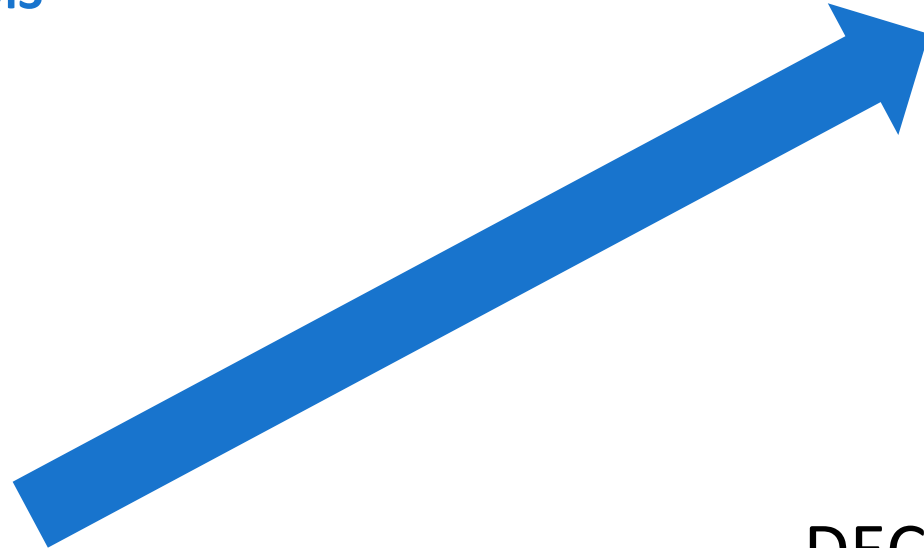
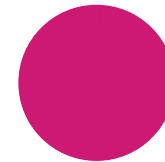


1 trial  
N=337 ITT

Phase 2 trial

# DECOY TEST

N=72,671 decoy subjects



# BIPOLAR DATASET

ANOMALOUS SYMPTOMS



CANONICAL SYMPTOMS

5 legacy trials  
N=2,026 subjects

# PROSPECTIVE USE

1 trial  
N=129 subjects, pre-randomization data



Phase 3 trial

Enhancing the **Diversity** of Clinical Trial Populations — Eligibility Criteria, Enrollment Practices, and Trial Designs  
Guidance for Industry

**Enrichment** Strategies for Clinical Trials to Support Determination of Effectiveness of Human Drugs and Biological Products  
Guidance for Industry

# RETROSPECTIVE USE

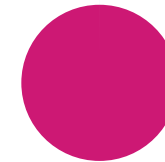


1 trial  
N=337 ITT

Phase 2 trial

# DECOY TEST

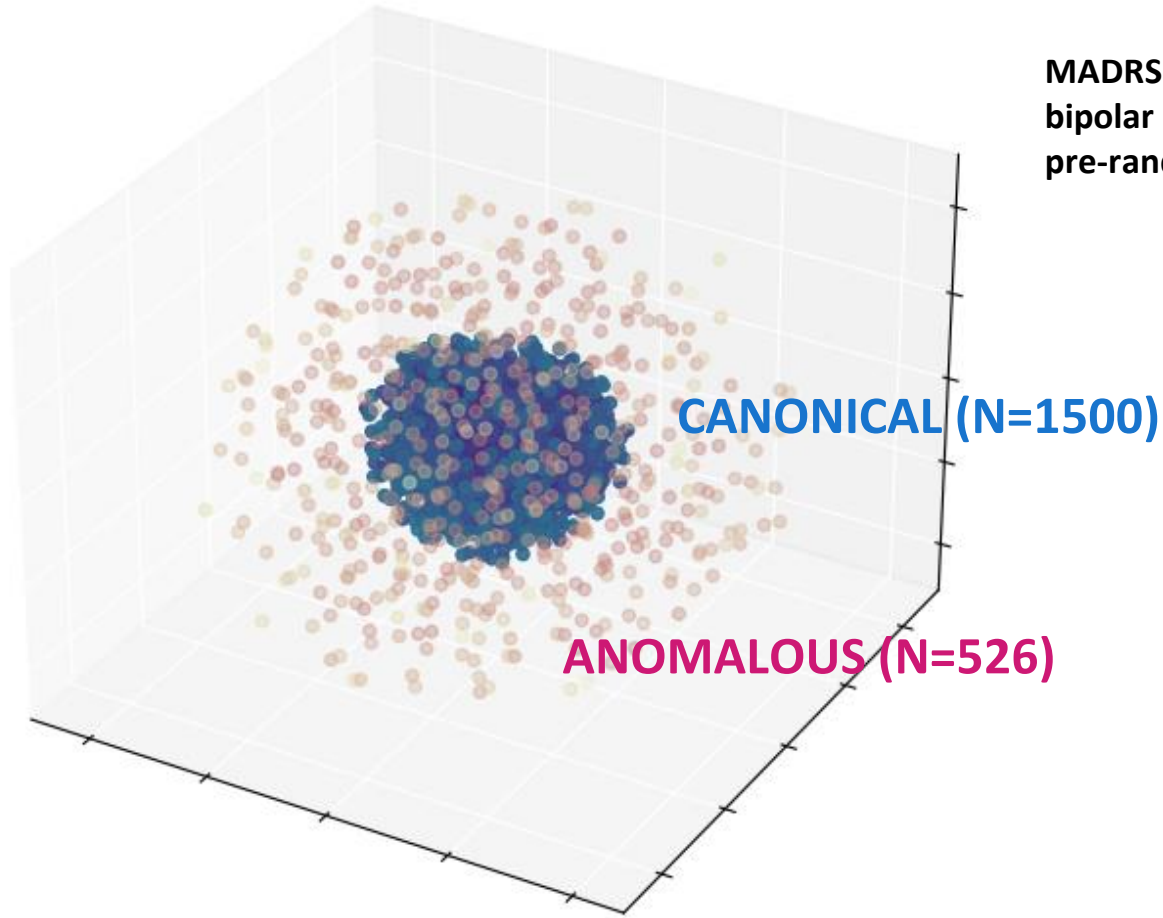
N=72,671 decoy subjects





# BIPOLAR DATASET

5 legacy trials  
N=2,026 subjects

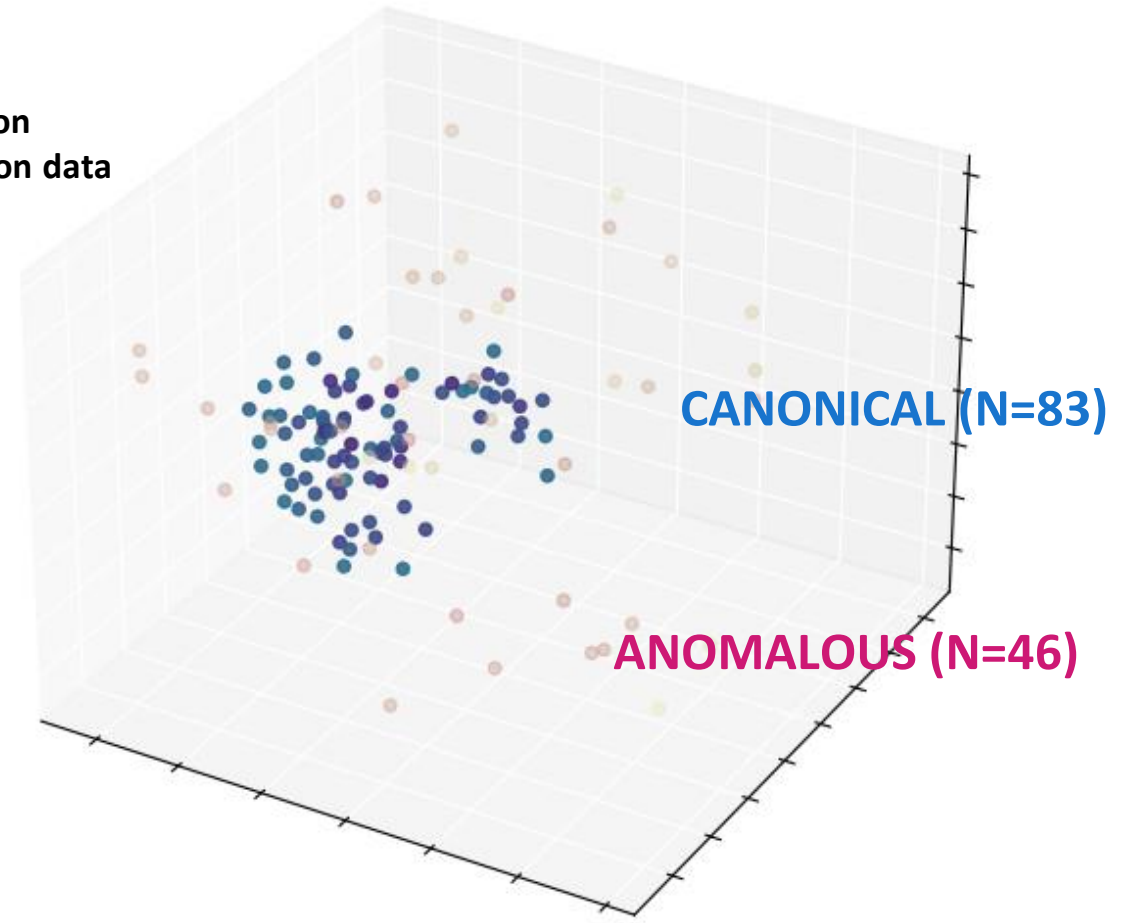


# PROSPECTIVE USE

1 trial  
N=129 subjects, pre-randomization data

Dimension Reduction– each subject's 145-dimension vector is represented in 3-dimensions by t-SNE analysis

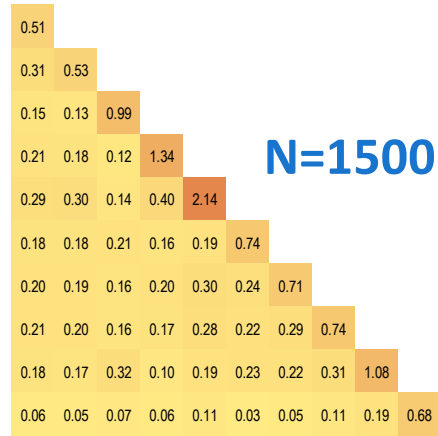
MADRS  
bipolar depression  
pre-randomization data



# BIPOLAR DATASET

5 legacy trials  
N=2,026 subjects

CANONICAL



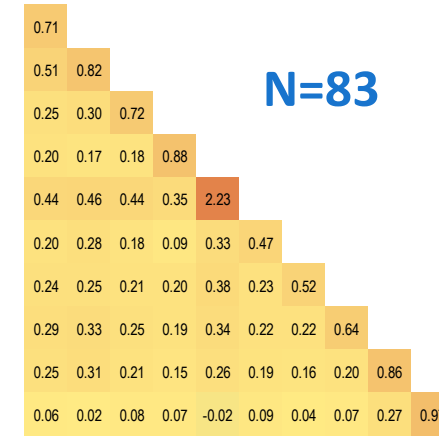
N=1500

# PROSPECTIVE USE

1 trial  
N=129 subjects, pre-randomization data

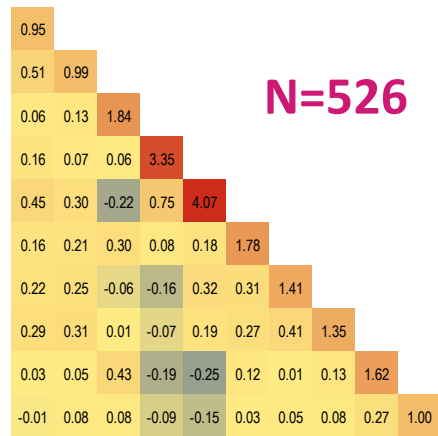
Variance-Covariance Matrix

MADRS  
bipolar depression  
pre-randomization data

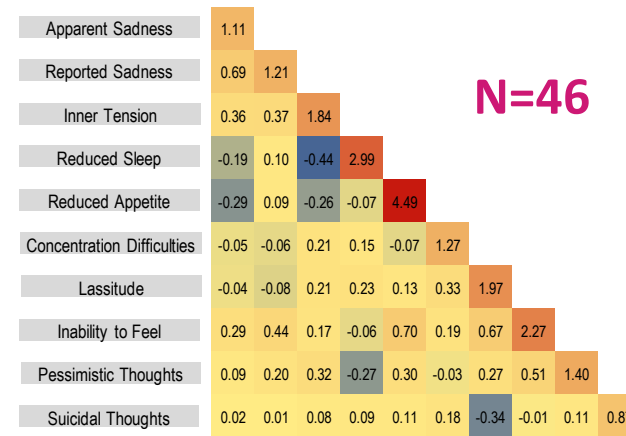


N=83

ANOMALOUS



N=526



N=46

# BIPOLAR DATASET

5 legacy trials  
N=2,026 subjects

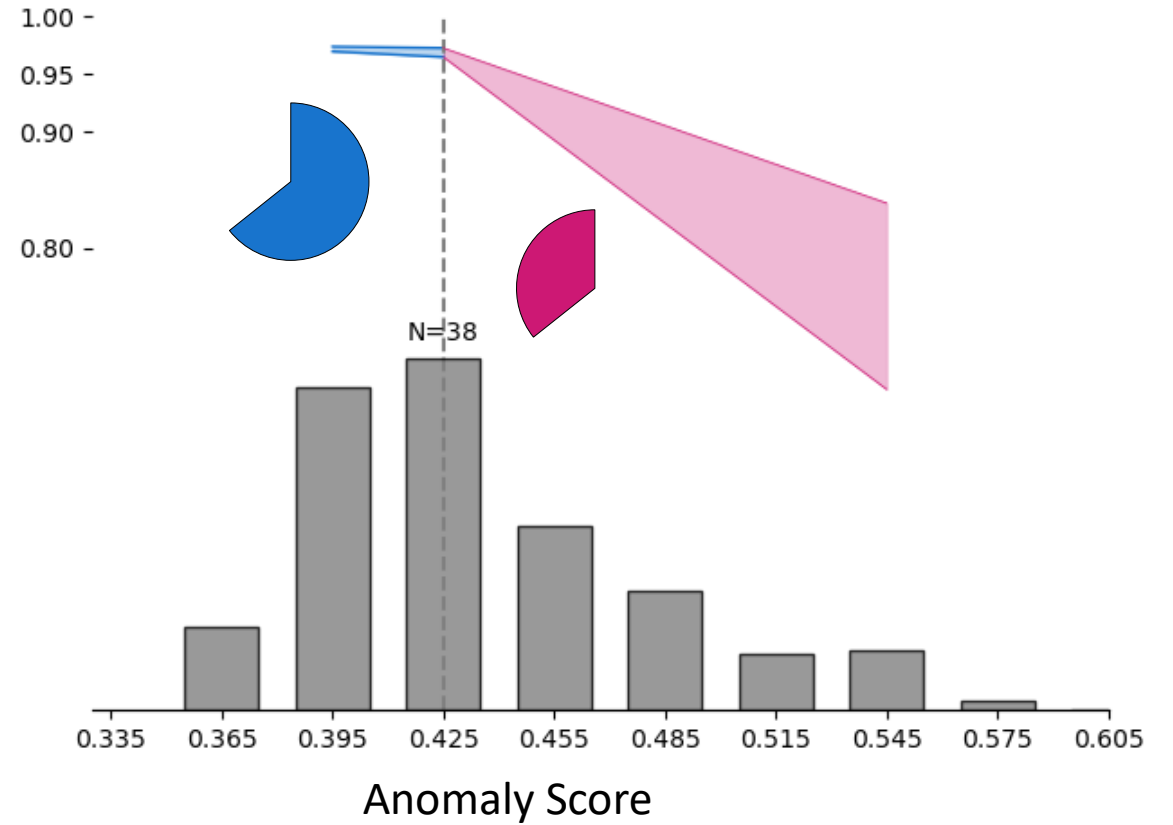
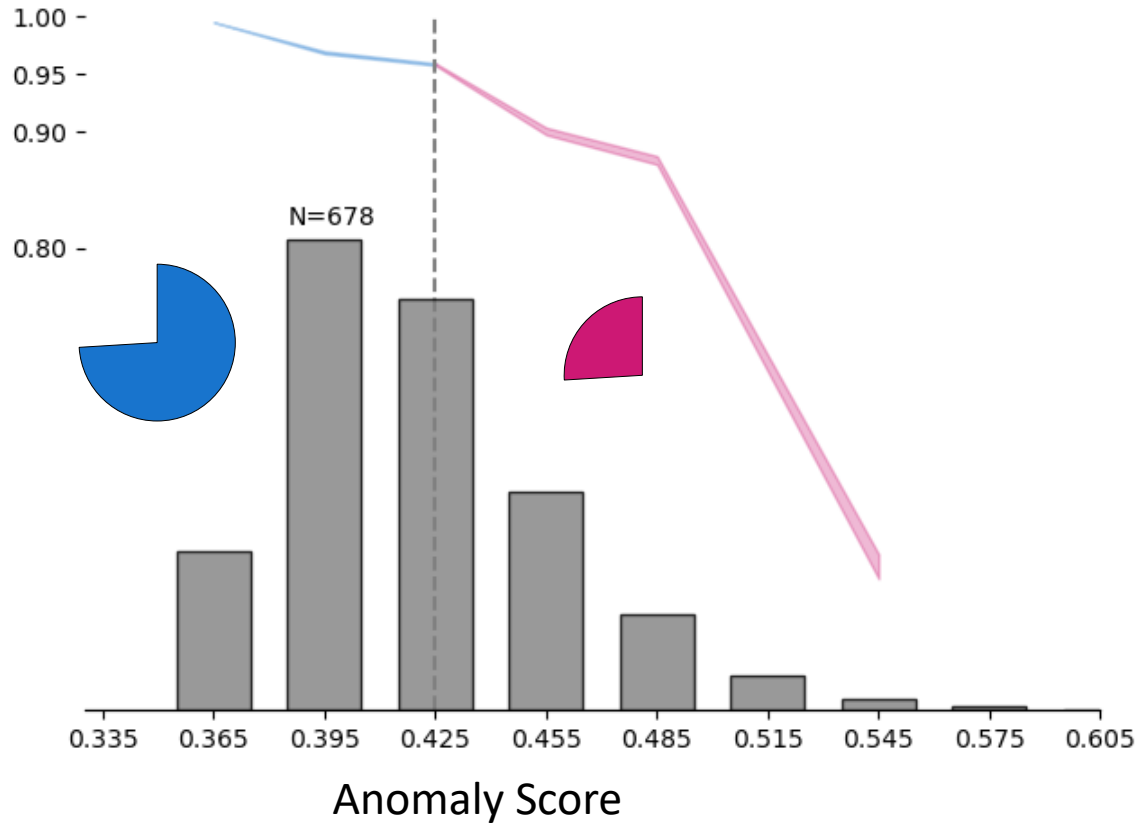
**MADRS**  
bipolar depression  
pre-randomization data

# PROSPECTIVE USE

1 trial  
N=129 subjects, pre-randomization data

Confirmatory Factor Analysis –goodness of fit and stability to 4-factor model

## Comparative Fit Index (CFI)



# BIPOLAR DATASET

5 legacy trials  
N=2,026 subjects

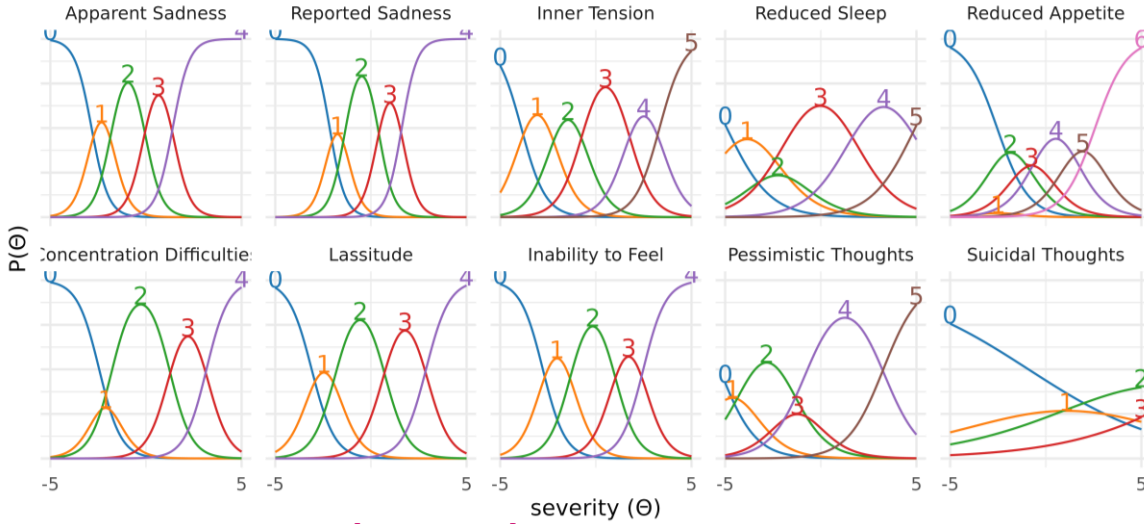
MADRS  
bipolar depression  
pre-randomization data

# PROSPECTIVE USE

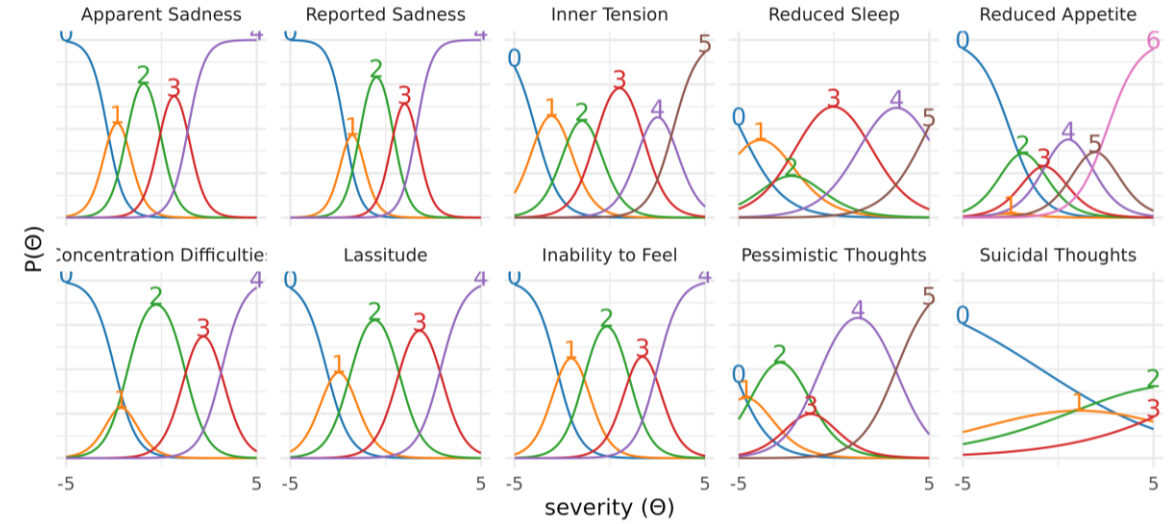
1 trial  
N=129 subjects, pre-randomization data

Item Response Theory – curves are graded model outputs, where distinct peaks at different severity levels indicate each symptoms likelihood of being reported (y-axis) increases along defined gradations in overall depression severity (x-axis)

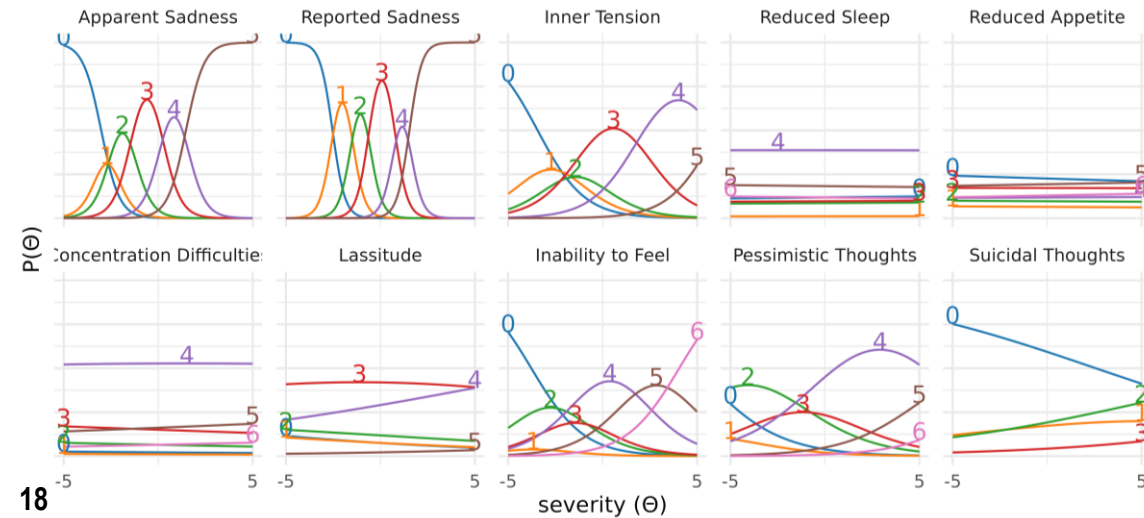
## CANONICAL (N=1500)



## CANONICAL (N=83)



## ANOMALOUS (N=526)



## ANOMALOUS (N=46)



# BIPOLAR DATASET

5 legacy trials  
N=2,026 subjects

MADRS  
bipolar depression  
pre-randomization data

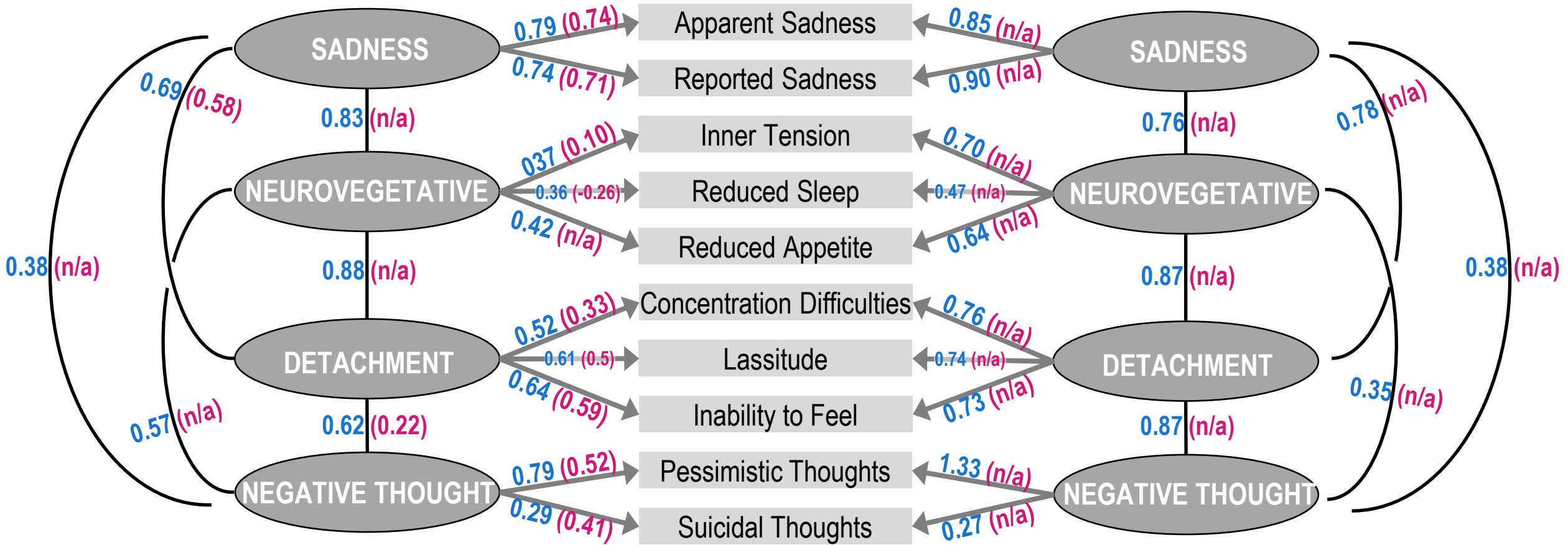
# PROSPECTIVE USE

1 trial  
N=129 subjects, pre-randomization data

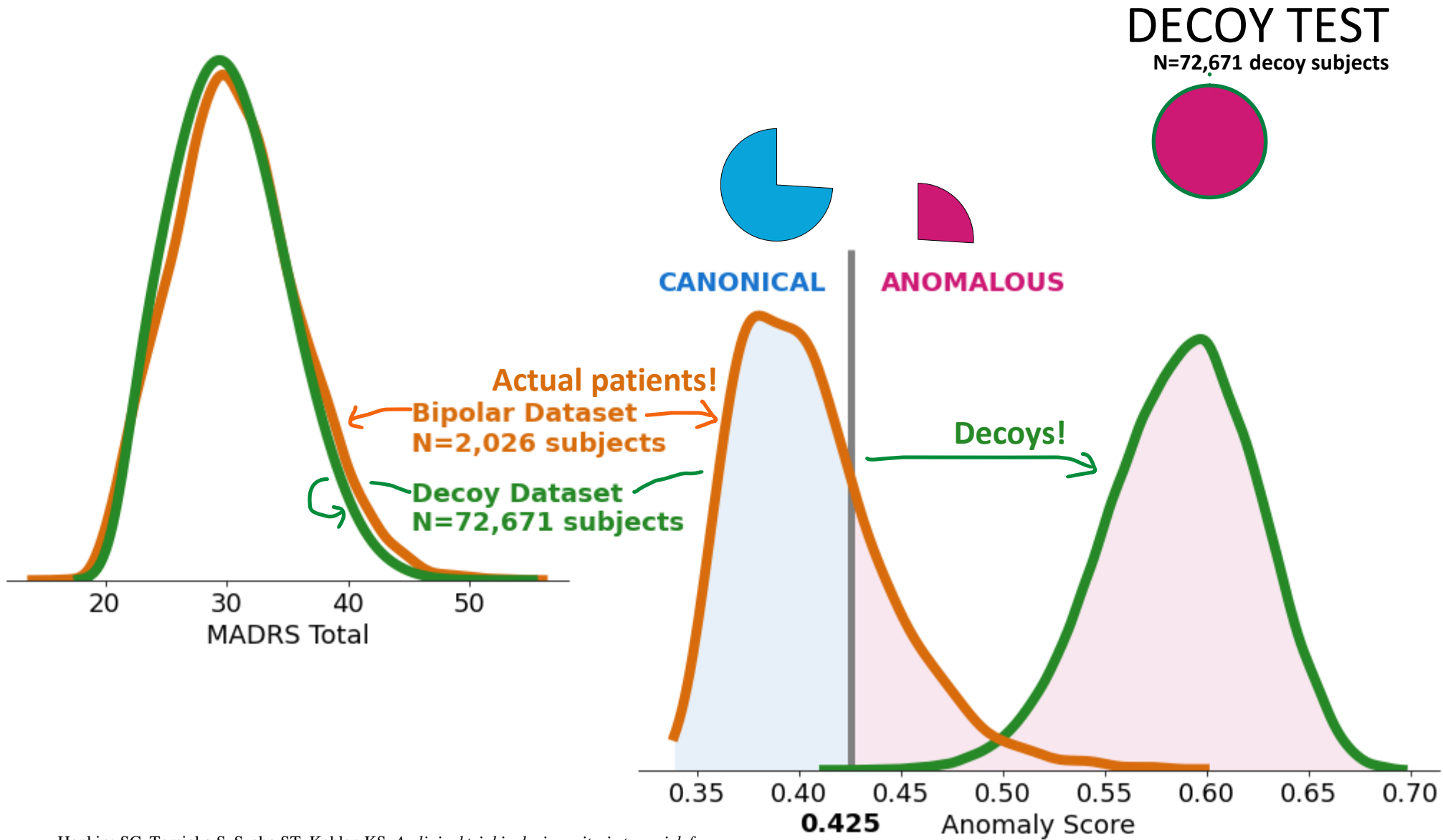
Confirmatory Factor Analysis– path diagrams with arrows label the significant factor loadings and black lines label significant model correlations

CANONICAL (ANOMALOUS)

CANONICAL (ANOMALOUS)

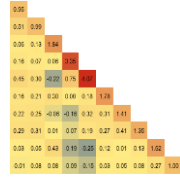


# Anomaly Score detects DECOY subjects





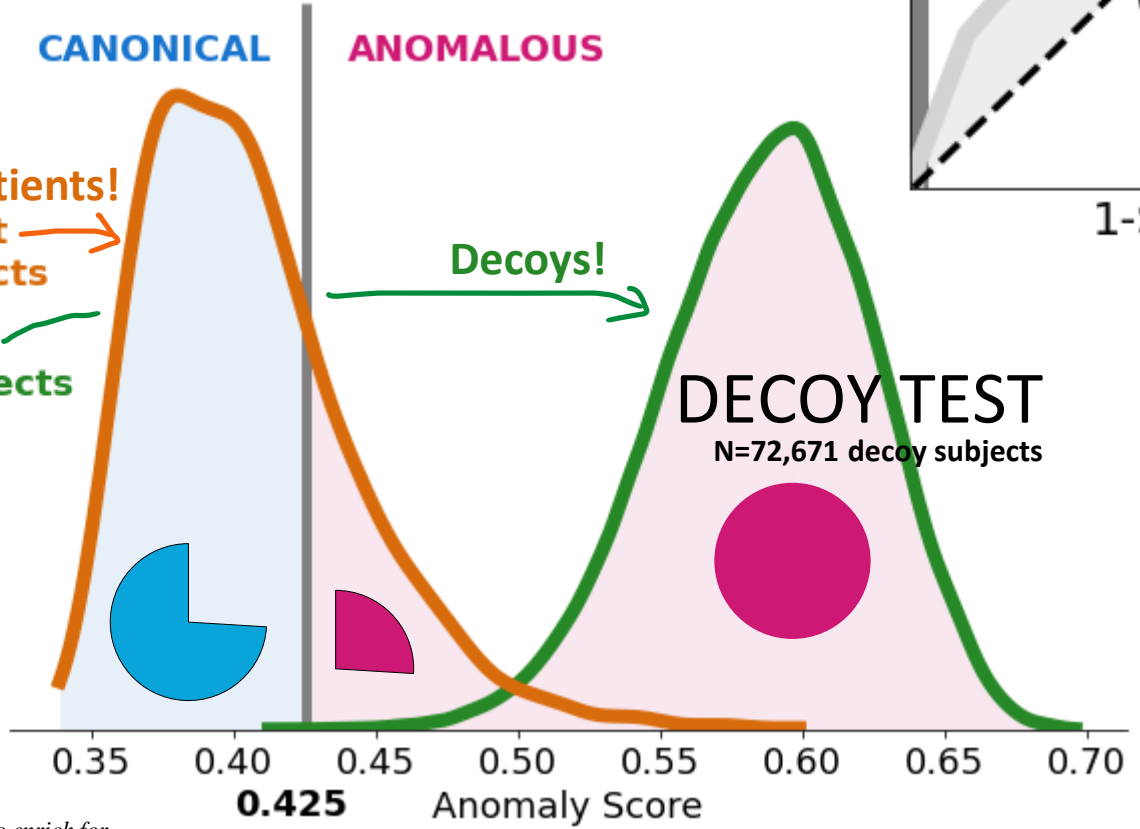
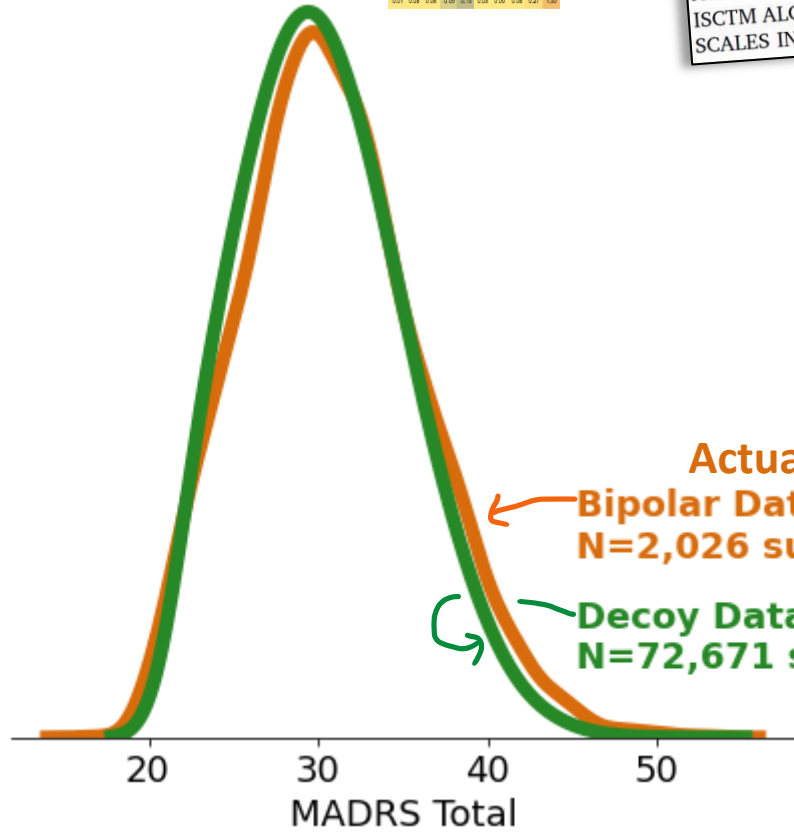
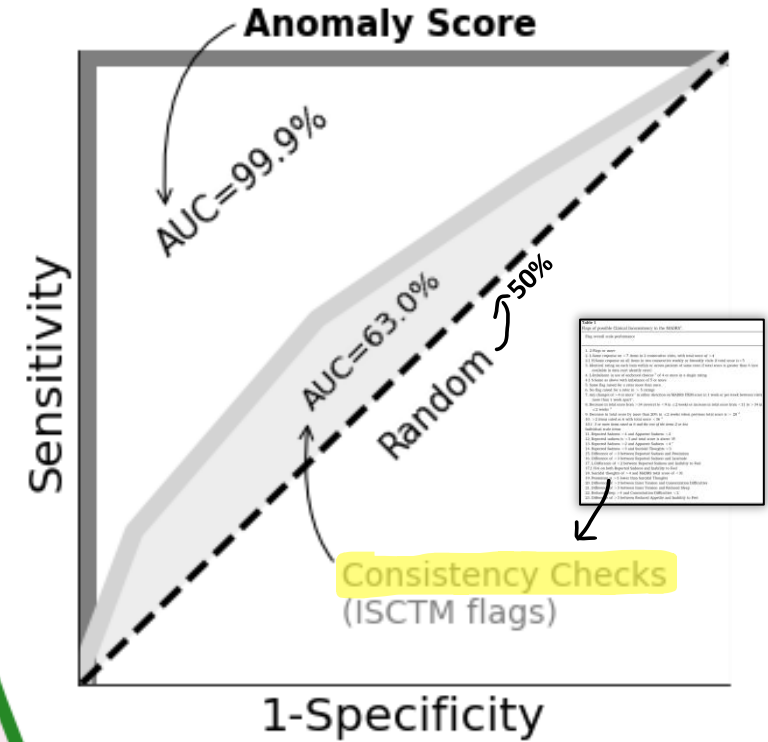
# Anomaly Score versus ISCTM expert working group



Consistency checks to improve measurement with the Montgomery-Asberg Depression Rating Scale (MADRS)

Jonathan Rabinowitz<sup>a,1,\*</sup>, Nina R Schooler<sup>b,1</sup>, Brienne Brown<sup>c,1</sup>, Mads Dalsgaard<sup>d</sup>, Nina Engelhardt<sup>e</sup>, Gretchen Friedberger<sup>f</sup>, Bruce J Kinon<sup>g</sup>, Daniel Lee<sup>h</sup>, Felice Ockun<sup>i</sup>, Atul Mahabeshwarkar<sup>j</sup>, Joyce Tsai<sup>k</sup>, Janet B.W. Williams<sup>l</sup>, Colin Sauder<sup>m,n</sup>, Christian Yavorsky<sup>o</sup>, ISCTM ALGORITHMS/FLAGS TO IDENTIFY CLINICAL INCONSISTENCY IN THE USE OF RATING SCALES IN CNS RCTs working group members

VS.



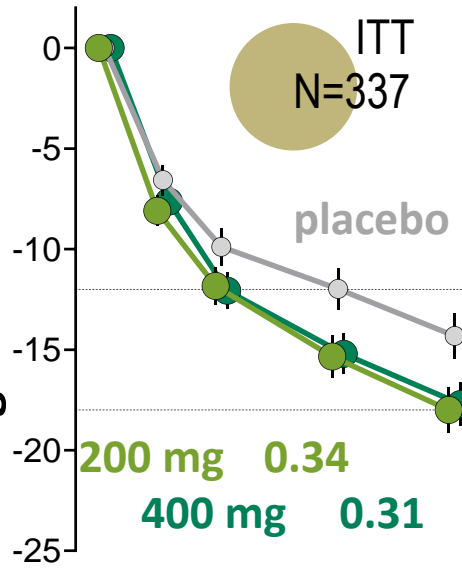
# MADRS

## bipolar depression

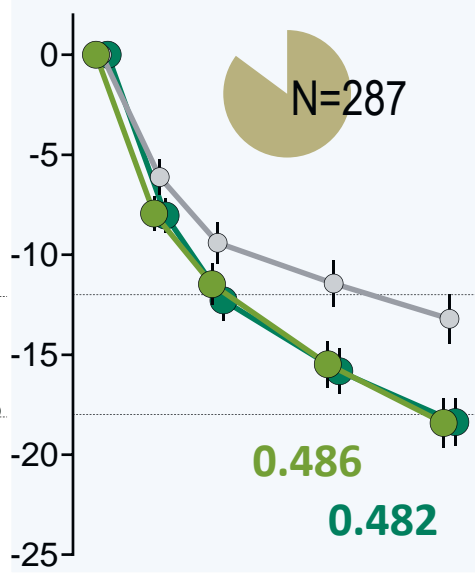
$\Delta$  MADRS

change from baseline

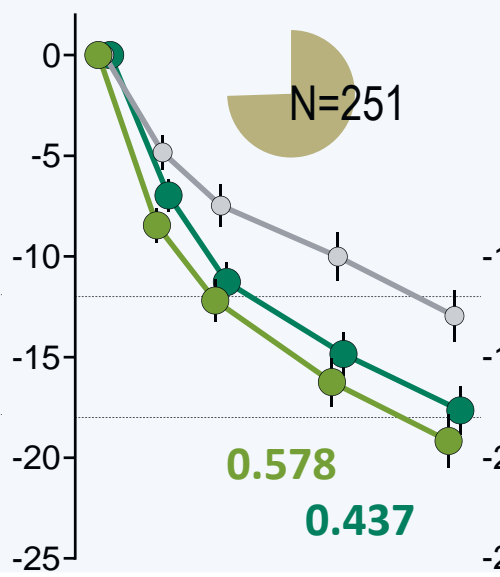
ALL SUBJECTS



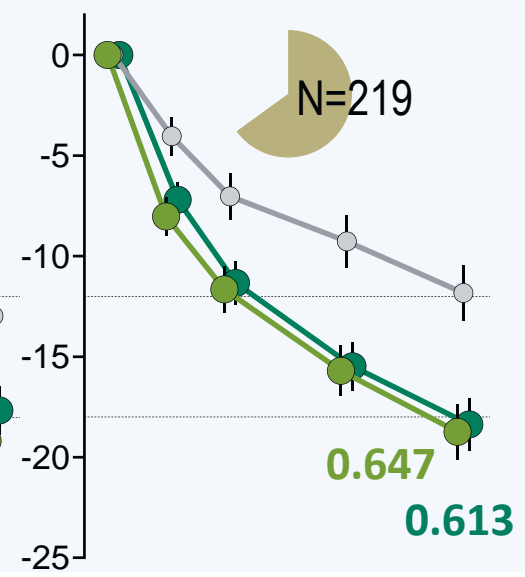
SUBJECTS w/  
MEDICAL RECORDS



SUBJECTS w/  
CANONICAL SYMPTOMS



CANONICAL SYMPTOMS  
AND  
MEDICAL RECORDS

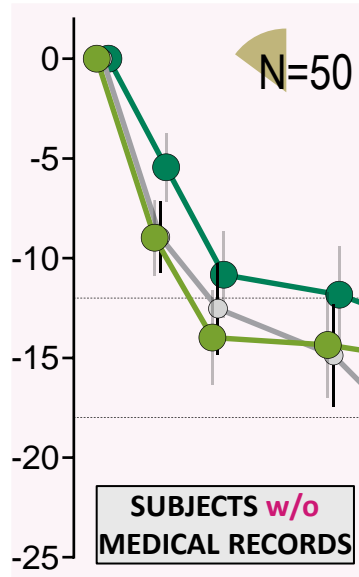


# RETROSPECTIVE USE

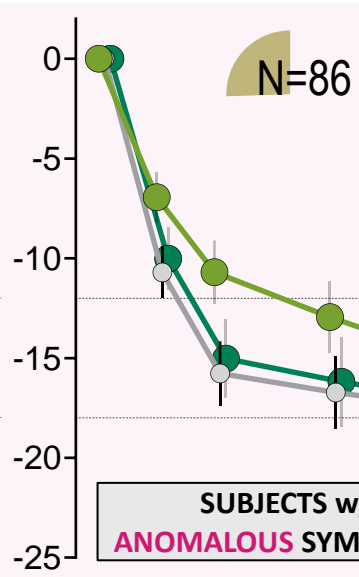


1 trial  
N=337 ITT

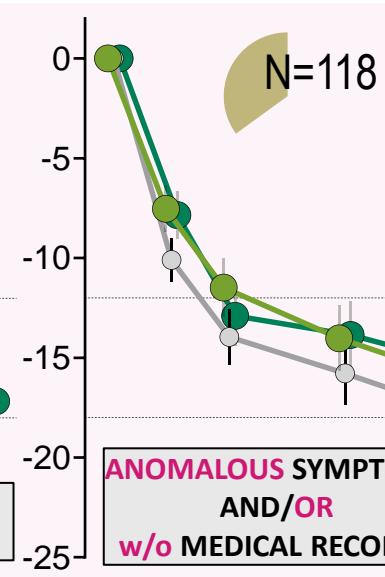
SUBJECTS w/o  
MEDICAL RECORDS



SUBJECTS w/  
ANOMALOUS SYMPTOMS



ANOMALOUS SYMPTOMS  
AND/OR  
w/o MEDICAL RECORDS



Loebel A, Koblan KS, Tsai J, Deng L, Fava M, Kent J, Hopkins SC. A Randomized, Double-blind, Placebo-controlled Proof-of-Concept Trial to Evaluate the Efficacy and Safety of Non-racemic Amisulpride (SEP-4199) for the Treatment of Bipolar I Depression. J Affect Disord. 2022 Jan 1;296:549-558.

# Let's use structure to measure severity better

## The Positive and Negative Syndrome Scale (PANSS) for Schizophrenia

by Stanley R. Kay, Abraham Fiszbein, and Lewis A. Opler

### Abstract

The variable results of positive-negative research with schizophrenics underscore the importance of well-characterized, standardized measurement techniques. We report on the development and initial standardization of the Positive and Negative Syndrome Scale (PANSS) for **typological** and **dimensional** assessment. Based on two established psychiatric rating systems, the 30-item PANSS was conceived as an operationalized, drug-sensitive instrument that provides balanced representation of positive and negative symptoms and gauges their relationship to one another and to global psychopathology. It thus constitutes four scales measuring positive and negative syndromes, their differential, and general severity of illness. Study of 101 schizophrenics found the four scales to be normally distributed and supported their reliability and stability. Positive and negative scores were inversely correlated once their common association with general psychopathology was extracted, suggesting that they represent mutually exclusive constructs. Review of five studies involving the PANSS provided evidence of its criterion-related validity with antecedent, genealogical, and concurrent measures, its predictive validity, its drug sensitivity, and its utility for both typological and dimensional assessment.



Emil Kraepelin

Typological

classify  
DSM, SCID

Structure  
pattern recognition

Variance-Covariance Matrix



Eugen Bleuler

Dimensional

measure  
PANSS, MADRS

Severity  
common symptoms

Total Score