

Modelos de rede em psicopatologia e comorbidade





Prof. Dr. Wagner de Lara Machado PPG Psicologia wagner.machado@pucrs.br Psicólogo (ULBRA)

Mestre e Doutor em Psicologia (UFRGS)

• Estágio de Pós-doutorado (UFRGS)

• Professor do PPG Psicologia da PUCRS (Nota 6 CAPES)

• Grupo de pesquisa:

Avaliação em Bem-estar e Saúde Mental (ABES)





GRUPO DE PESQUISA

AVALIAÇÃO EM BEM-ESTAR E SAÚDE MENTAL



Construção e validade de medidas



Preditores e correlatos



Métodos inovadores







Carla Adriana da Silva Villwock

- ✓ Doutoranda
- ✓ Áreas de interesse:
 - ✓ Psicologia Clínica
 - ✓ Psicologia da Saúde
 - ✓ Psicopatologia
 - ✓ Comportamento Suicida e Automutilação
 - ✓ Intervenções Psicoterápicas







Marcela Alves Sanseverino

- ✓ Doutoranda
- ✓ Áreas de interesse:
 - ✓ Esquizotipia
 - ✓ Saúde mental
 - ✓ Psicopatologia
 - ✓ Felicidade e bem-estar
 - ✓ Atividade física







Nicolas de Oliveira Cardoso

- ✓ Doutorando
- ✓ Áreas de interesse:
 - ✓ RS e metanálises
 - ✓ Coping
 - ✓ Estigma
 - √ Suicídio
 - ✓ Intervenções Tecnológicas
 - ✓ Jogos Eletrônicos e Reserva Cognitiva
 - ✓ E-health e M-health
 - ✓ Machine e deep learning







Rosário Sunde

- ✓ Doutorando
- ✓ Áreas de interesse:
 - ✓ Psicologia Clínica
 - ✓ Comportamento suicida
 - ✓ Validação de instrumentos







Juliana N. Weide

- ✓ Mestranda
- ✓ Áreas de interesse:
 - ✓ Psicologia da Saúde
 - ✓ Psicologia Hospitalar
 - ✓ Psico-oncologia
 - ✓ Corregulação emocional e comportamental







Rafaela Cassol da Cunha

- ✓ Mestranda
- ✓ Áreas de interesse:
 - ✓ Psicologia da Saúde
 - ✓ Avaliação e intervenção hospitalar
 - ✓ Doenças crônicas (DPOC)
 - ✓ Cuidados paliativos
 - ✓ Bem-estar

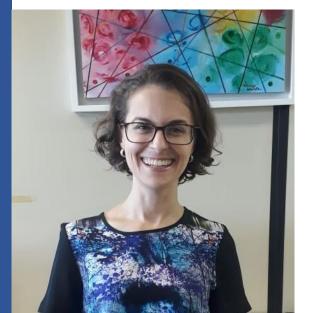






Gustavo Rafael Marchionatti Broch – IC

- ✓ Áreas de interesse:
 - ✓ Suicídio
 - ✓ Desenvolvimento
 - ✓ Inteligência Artificial e M-health



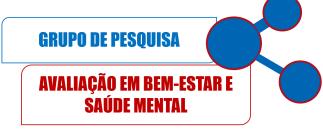


Luciana Villa Verde Castilhos – IC

- ✓ Áreas de interesse:
 - ✓ Psicologia da Saúde e Hospitalar
 - ✓ Psico-oncologia
 - ✓ Cuidados paliativos







Bernard Paz – IC

- ✓ Áreas de interesse:
 - ✓ Suicídio
 - ✓ Correlatos sociais do sofrimento psicológico





Gabriel Paz – IC

- ✓ Áreas de interesse:
 - ✓ Suicídio
 - ✓ Correlatos sociais do sofrimento psicológico







Monique Cristielle S. da Silva – IC

- ✓ Áreas de interesse:
 - ✓ Esquiotipia positiva
 - ✓ Saúde mental

Análise de rede aplicada à psicometria e a avaliação psicológica



Wagner de Lara Machado

Pontificia Universidade Católica de Campinas

Sacha Epskamp
Assistant Professor in Psychological Methods and
Psychometrics at the University of Amsterdam

João Ricardo Nickenig Vissoci

Faculdade Ingá e Duke University

Sacha Epskamp

Universiteit van Amsterdam



João Vissoci

Pesquisador na divisão de Emergency Medicine do departamento de Cirurgia, e na divisão Duke Global Neurosurgery and Neuroscience (DGNN) do departamento de Neurocirurgia, na Duke University

(vii) qgraph(E3,directed=FALSE) qgraph(E3,layout="circle") qgraph(E3) qgraph(E3,directed=FALSE,layout="spring")

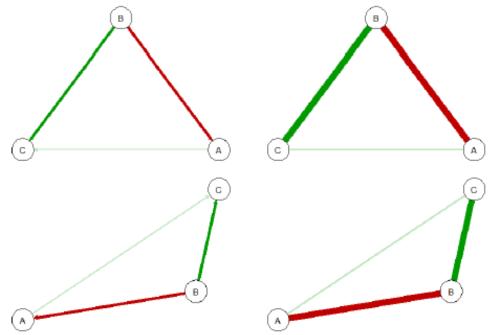


Figura 5. Redes ponderadas, direcionais e não-direcionais, sem (acima) e com (abaixo) o emprego do algoritmo de posicionamento.

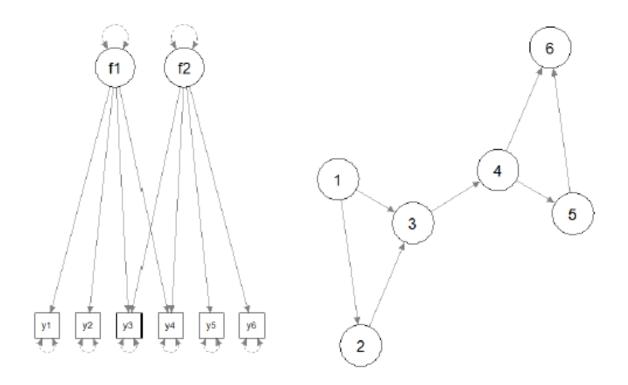


Figura 13. Modelo de traço latente (esquerda) e de rede (direita) da comorbidade.

Positive Mental Health Scale: Validation of the Mental Health Continuum – Short Form

Wagner de Lara Machado – Pontificia Universidade Católica de Campinas, Campinas, São Paulo, Brasil Denise Ruschel Bandeira – Universidade Federal do Rio Grande do Sul, Porto Alegre, Brasil

Table 2

Item Factor Loadings and Reliability Measures of the MHC-SF in the Bifactor Model

The control of the control	Factor loading				
Item (summarized content)	General factor	EWB	SWB	PWB	
1 – Нарру	.70	.65			
2 – Interested	.78	.32			
3 – Satisfied	.78	.36			
4 – Contribute to society	.69		.07		
5 – Belong to community	.67		.23		
6 – Society is becoming a better place	.62		.63		
7 – People are good	.62		.41		
8 – Way society works makes sense	.57		.56		
9 – Likes own personality	.79			.21	
10 – Manages responsibility well	.70			.19	
11 – Relationships with others	.72			.24	
12 – Grow and become a better person	.62			.39	
13 – Confident to express own ideas	.68			.52	
14 – Life has direction or meaning	.83			.12	
Average extracted variance	.49	.22	.19	.10	
Composite reliability	.93	.43	.47	.34	
-					

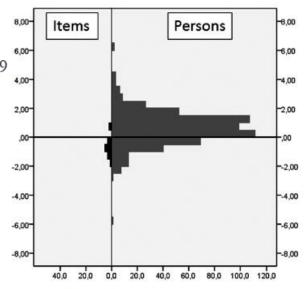


Figure 1. Map of items and persons. The vertical axis indicates the scale in *logits*. The distribution was obtained by fixing the contrary measure so the mean would be equal to zero.

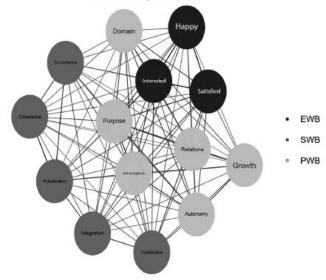
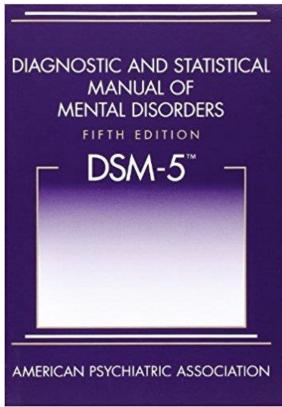


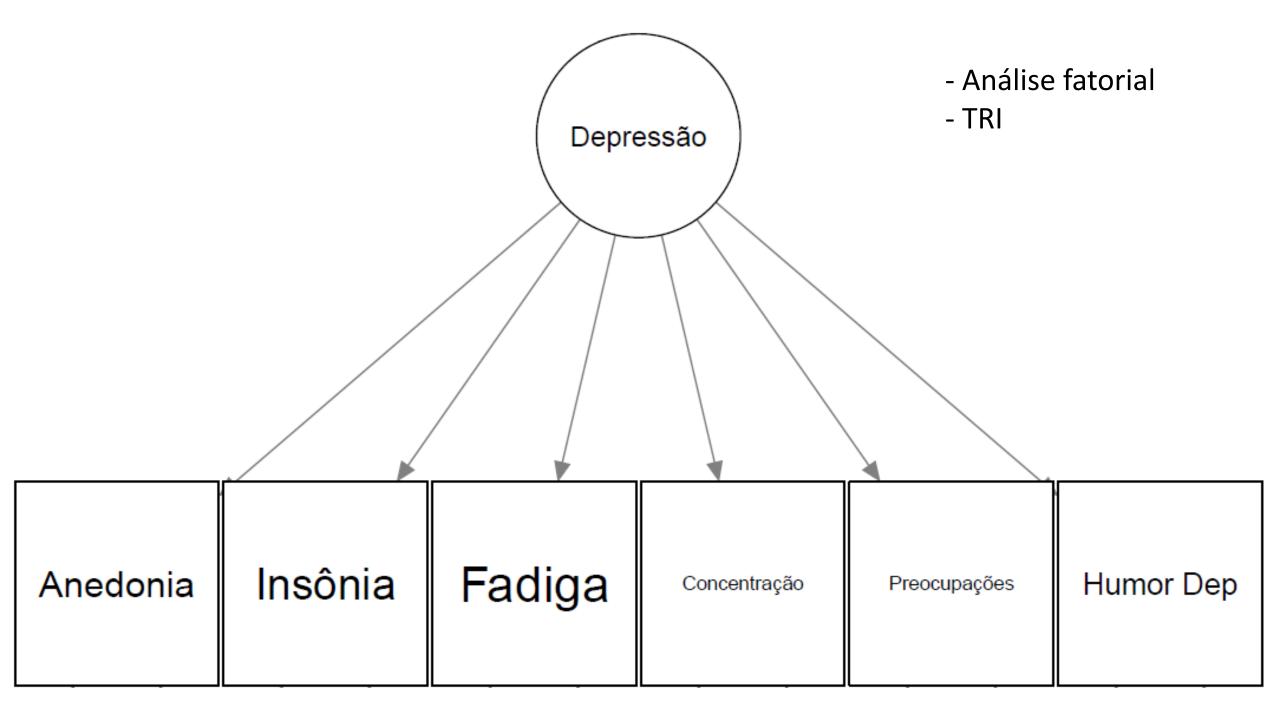
Figure 2. Network of positive mental health indicators. The covariance structure indicates that the MHC-SF items are strongly associated with the others, resulting in a dense component. The items in the emotional (EWB), social (SWB) and psychological (PWB) well-being subscales exhibit moderate to strong crossed associations. Purpose in life and self-acceptance are the central nodes of the system, meaning that they are more strongly associated with the remainder of the items. The stronger line represents the correlation between "happy" and "satisfied" $(r_{p,3} = .78)$; the fainter line represents the correlation between "relations" and "coherence" $(r_{p,1} = .35)$.

Avaliação em saúde mental: traços latentes e redes

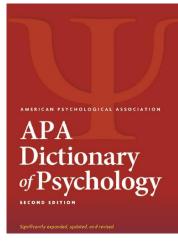
• Transtorno depressivo maior:

- Humor deprimido
- Diminuição do interesse ou prazer
- Perda ou ganho significativo de peso
- Insônia ou hipersonia
- Agitação ou retardo psicomotor
- Fadiga ou perda de energia
- Sentimentos de inutilidade ou culpa
- Capacidade diminuída para pensar ou se concentrar
- Pensamentos recorrentes de morte





Depressão: variável latente



• latent variable: a theoretical entity or construct that is used to explain one or more manifest variables. Latent variables cannot be directly observed or measured but rather are approximated through various measures presumed to assess part of the given construct. [...] Participants' responses could then be analyzed to identify patterns of interrelationships from which the values of the latent variable of [...] are inferred. Also called latent construct; latent factor. See also factor analysis; structural equation modeling.

Measuring Depression Over Time . . . or not? Lack of Unidimensionality and Longitudinal Measurement Invariance in Four Common Rating Scales of Depression

Eiko I. Fried University of Leuven

Claudia D. van Borkulo University of Groningen and University of Amsterdam

Sacha Epskamp University of Amsterdam Robert A. Schoevers University of Groningen

Francis Tuerlinckx University of Leuven

Denny Borsboom University of Amsterdam



Contents lists available at ScienceDirect

New Ideas in Psychology

journal homepage: www.elsevier.com/locate/newideapsych



Deconstructing the construct: A network perspective on psychological phenomena

Verena D. Schmittmann, Angélique O.J. Cramer, Lourens J. Waldorp, Sacha Epskamp, Rogier A. Kievit, Denny Borsboom*

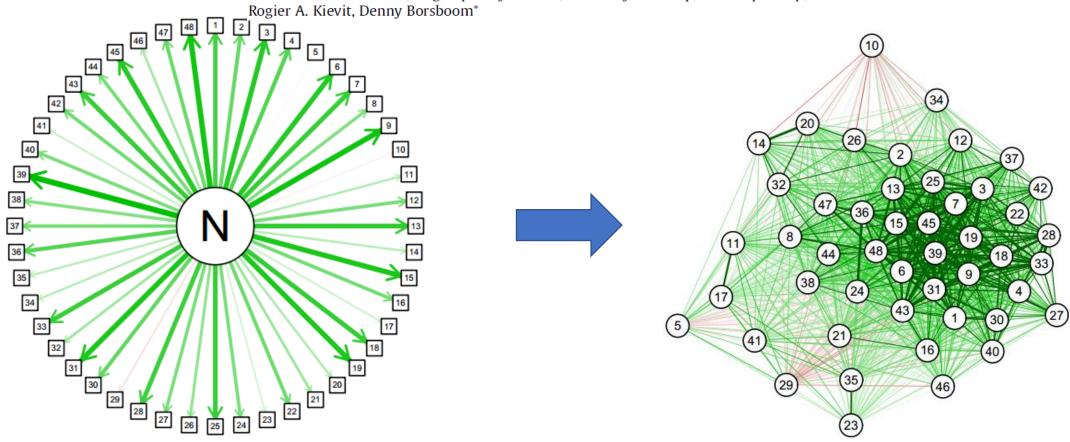


New Ideas in Psychology

journal homepage: www.elsevier.com/locate/newideapsych

Deconstructing the construct: A network perspective on psychological phenomena

Verena D. Schmittmann, Angélique O.J. Cramer, Lourens J. Waldorp, Sacha Epskamp,





New Ideas in Psychology



journal homepage: www.elsevier.com/locate/newideapsych

Deconstructing the construct: A network perspective on psychological phenomena

Verena D. Schmittmann, Angélique O.J. Cramer, Lourens J. Waldorp, Sacha Epskamp, Rogier A. Kievit, Denny Borsboom*



Fig. 6. The best fitting confirmative time series model of the following five constituents of depression: tiredness; concentration difficulties (*concentration*); self-content; sad mood; pleasure in current activity (*activity*).

JOURNAL OF CLINICAL PSYCHOLOGY, Vol. 64(9), 1089-1108 (2008)

© 2008 Wiley Periodicals, Inc.

Published online in Wiley InterScience (www.interscience.wiley.com). DOI: 10.1002/jclp.20503

Psychometric Perspectives on Diagnostic Systems

1102

Journal of Clinical Psychology, September 2008

Denny Borsboom

University of Amsterdam

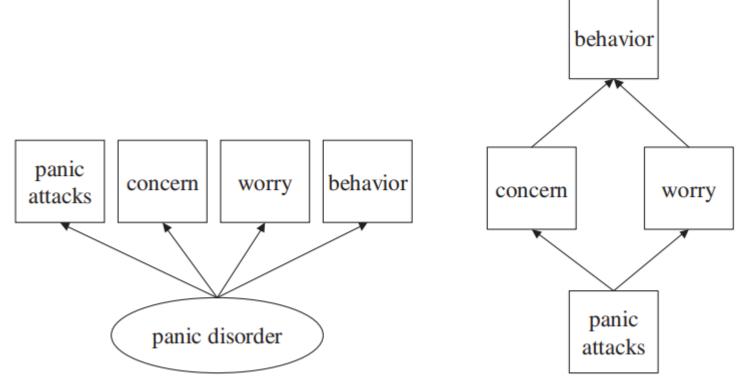
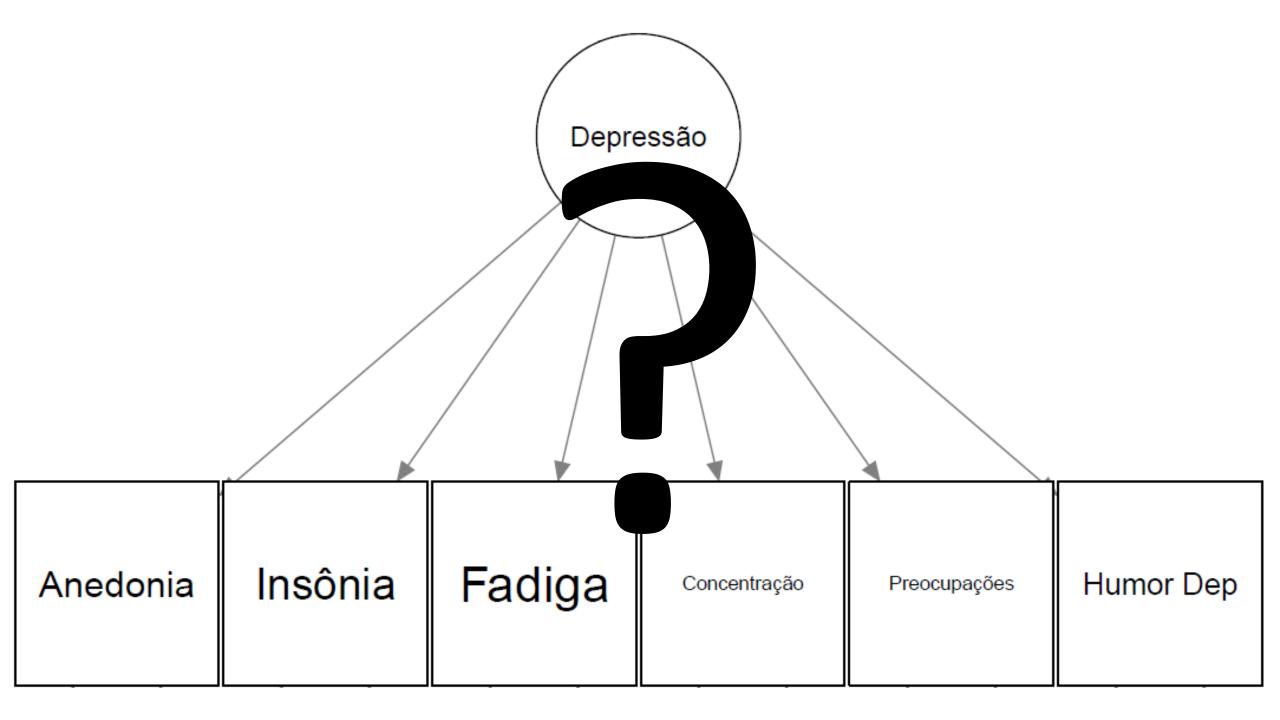


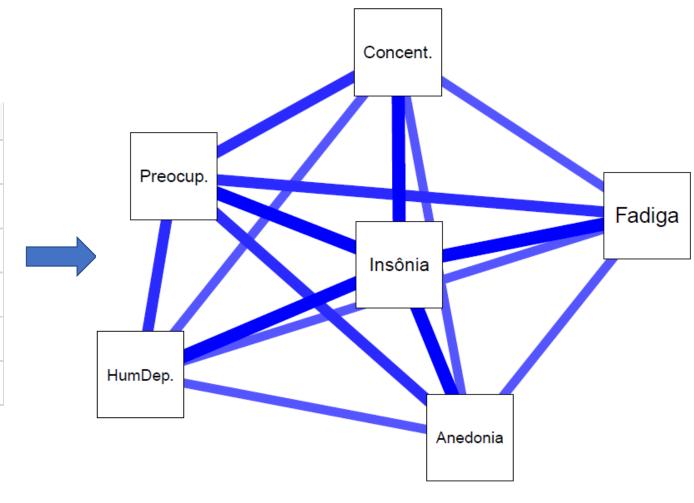
Figure 1. The left panel shows the relation between panic disorder and its symptoms from a latent variable modeling point of view. The right panel shows a representation of these symptoms as a causal system.



Insônia Fadiga Anedonia Humor Dep Concentração Preocupações

Depressão: estrutura e dinâmica de um sistema

*	Insônia ‡	Fadiga ‡	Concent. ‡	Preocup.	HumDep. ‡	Anedonia †
Insônia	1.0	0.6	0.6	0.6	0.6	0.6
Fadiga	0.6	1.0	0.4	0.5	0.4	0.4
Concent.	0.6	0.4	1.0	0.5	0.4	0.4
Preocup.	0.6	0.5	0.5	1.0	0.5	0.5
HumDep.	0,6	0.4	0.4	0.5	1.0	0.4
Anedonia	0.6	0.4	0.4	0.5	0.4	1.0



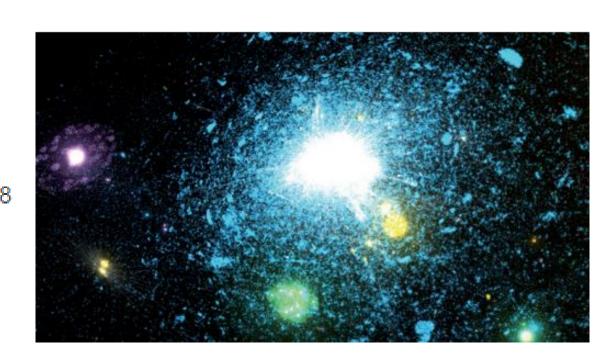
"Reductionism, as a paradigm, is expired, and complexity, as a field, is tired. Data-based mathematical models of complex systems are offering a fresh perspective, rapidly developing into a new discipline: network science."

NATURE PHYSICS | COMMENTARY

The network takeover

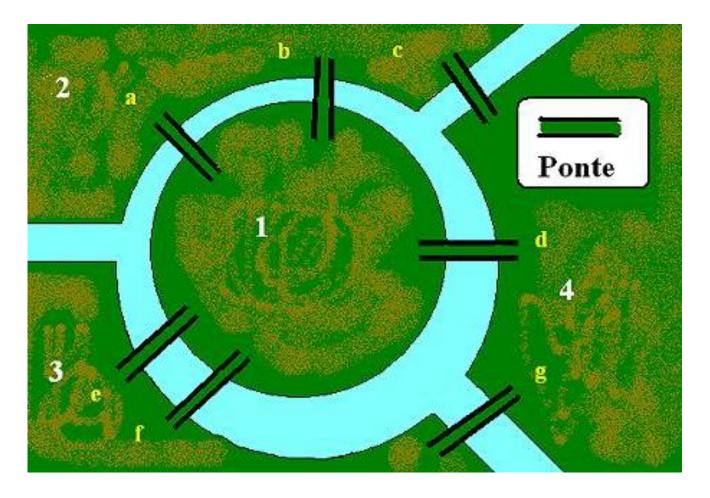
Albert-László Barabási

Nature Physics 8, 14–16 (2012) | doi:10.1038/nphys2188 Published online 22 December 2011



Teoria dos grafos

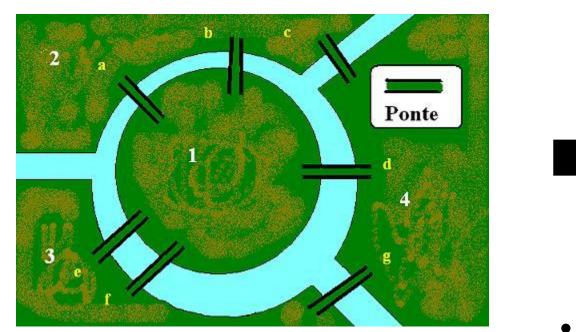
- O problema das pontes de Königsberg
- Discutia-se nas ruas da cidade a possibilidade de atravessar todas as pontes sem repetir nenhuma

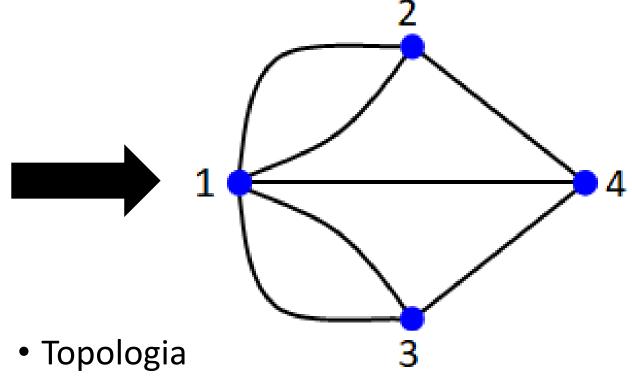


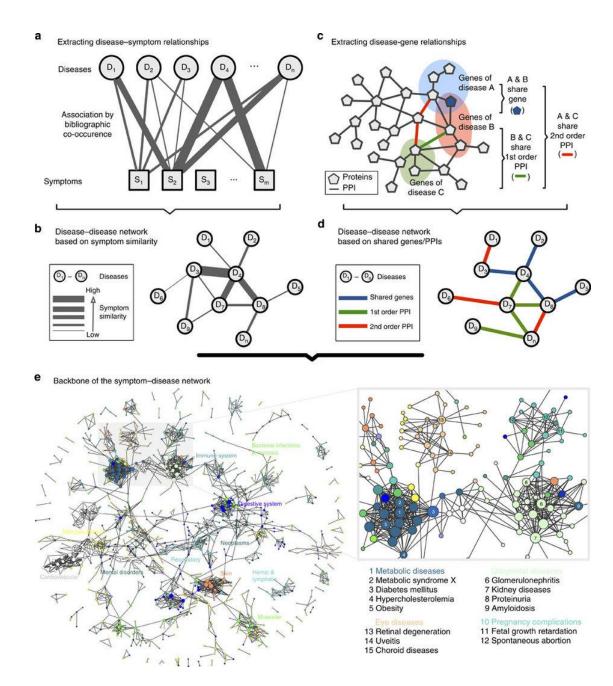
https://pt.wikipedia.org/wiki/Sete_pontes_de_K%C3%B6nigsberg

Teoria dos grafos

 Havia uma lenda popular sobre a possibilidade de resolução, quando Leonhard Euler, em 1736, provou que não existia caminho que possibilitasse tais restrições.









Article

Human symptoms-disease network

XueZhong Zhou [™], Jörg Menche, Albert-László Barabási & Amitabh Sharma [™]

Nature Communications 5, Article number: 4212 (2014)

doi:10.1038/ncomms5212

Received: 07 November 2013

Accepted: 27 May 2014

Published online: 26 June 2014

We extracted <u>7,109,429</u> (about 35.5% in over twenty million records) PubMed bibliographic records with one or more disease/symptom terms in the MeSH metadata field (see Methods), yielding a total of 4,442 disease terms and 322 symptom terms

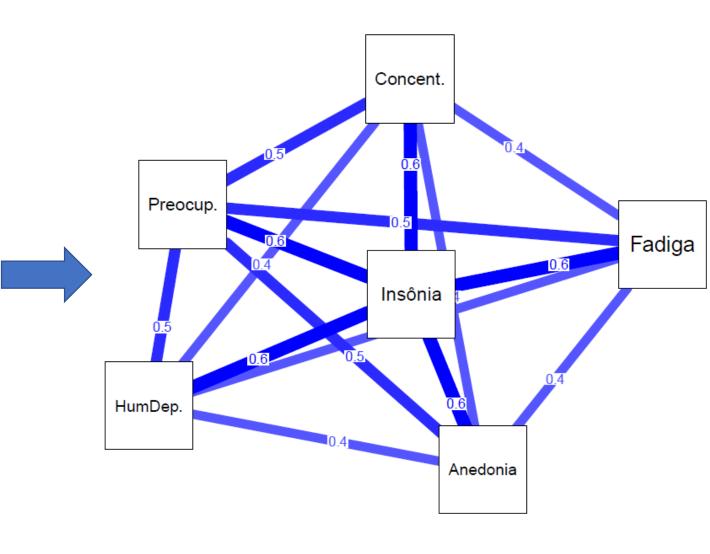
O que é uma rede?

- Vértices (nodos) e arestas (linhas)
- Nodos representam variáveis
- As linhas representam a relação entre os nodos



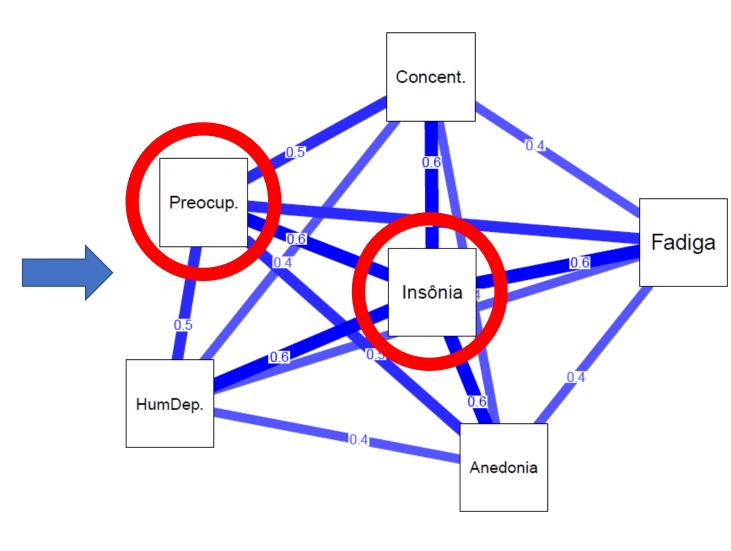
Depressão: estrutura e dinâmica de um sistema

A	Insônia [‡]	Fadiga Ů	Concent.	Preocup.	HumDep. ÷	Anedonia [†]
Insônia	1.0	0.6	0.6	0.6	0.6	0.6
Fadiga	0.6	1.0	0.4	0.5	0.4	0.4
Concent.	0.6	0.4	1.0	0.5	0.4	0.4
Preocup.	0.6	0.5	0.5	1.0	0.5	0.5
HumDep.	0.6	0.4	0.4	0.5	1.0	0.4
Anedonia	0.6	0.4	0.4	0.5	0.4	1.0



Depressão: estrutura e dinâmica de um sistema

A	Insônia [‡]	Fadiga [‡]	Concent.	Preocup.	HumDep.	Anedonia [†]
Insônia	1.0	0.6	0.6	0.6	0.6	0.6
Fadiga	0.6	1.0	0.4	0.5	0.4	0.4
Concent.	0.6	0.4	1.0	0.5	0.4	0.4
Preocup.	0.6	0.5	0.5	1.0	0.5	0.5
HumDep.	0.6	0.4	0.4	0.5	1.0	0.4
Anedonia	0.6	0.4	0.4	0.5	0.4	1.0



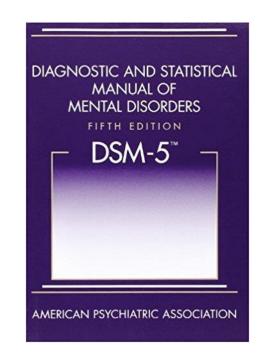
Depressão: estrutura e dinâmica de um

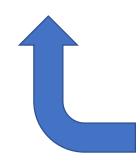
sistema Concent. Preocup. Fadiga Insônia HumDep. Anedonia

Depressão: estrutura e dinâmica de um

ema Concent. Preocup. Fadiga Insônia HumDep. Anedonia

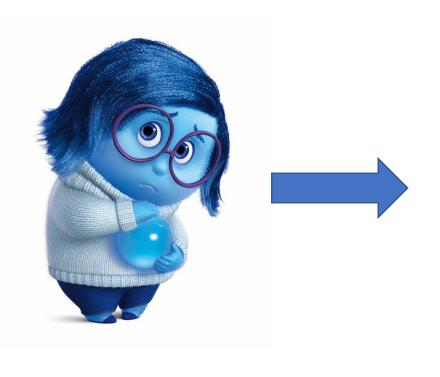


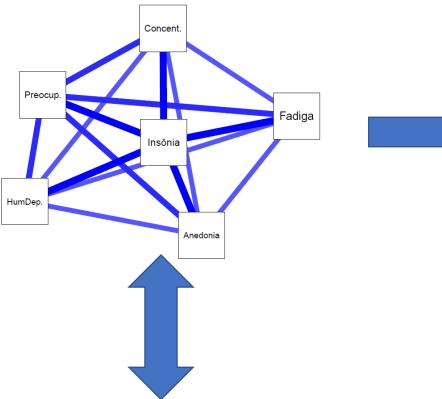


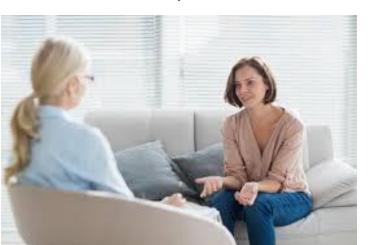


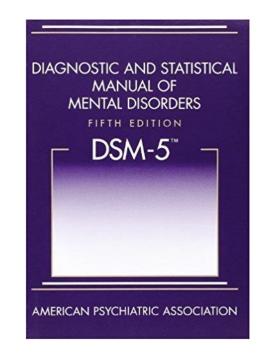










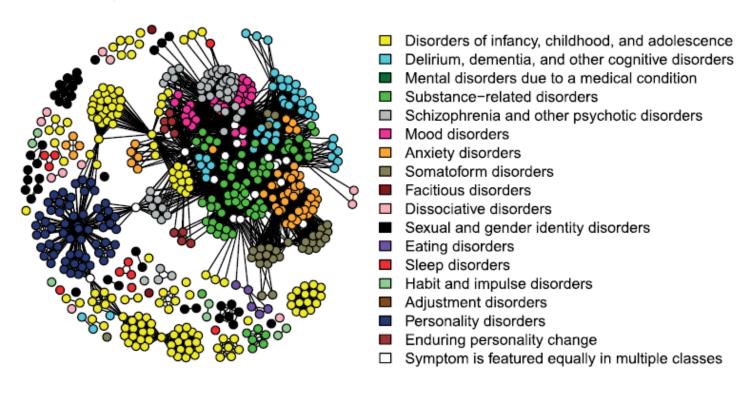




International Journal of Methods in Psychiatric Research *Int. J. Methods Psychiatr. Res.* (2016)
Published online in Wiley Online Library
(wileyonlinelibrary.com) **DOI:** 10.1002/mpr.1503

Mapping the manuals of madness: Comparing the ICD-10 and DSM-IV-TR using a network approach

PIA TIO, 1 SACHA EPSKAMP, 1 ARJEN NOORDHOF2 & DENNY BORSBOOM1



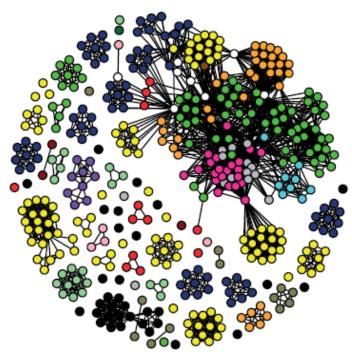


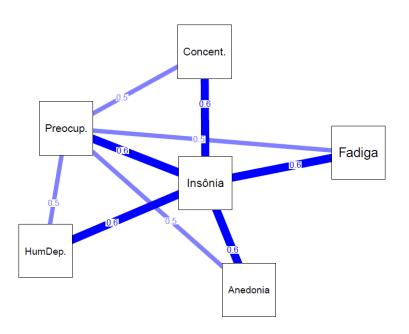
Table 2. Top 10 criteria with the highest degree for ICD-10 and DSM-IV-TR network

	ICD-10	DSM-IV-TR
1	Insomnia ¹	Insomnia ¹
2	Irritability ¹	Psychomotor agitation
3	Apathy	Psychomotor retardation ¹
4	Difficulty in concentrating ¹	Depressed
5	Nausea	Accelerated heart rate
6	Emotional liability	Distractibility
7	Sweating ¹	Irritability ¹
8	Chest pain	Anxiety and Hypersomnia
9	Restless sleep	Sweating ¹ and Weight loss
40	Davida mastau vataudati au 1	Difficulty in concentrating ¹
10	Psychomotor retardation ¹	and Hallucinations/illusions

¹Criteria that occur in the top 10 of both networks. Places 8 through 10 in the DSM-IV-TR hold multiple symptoms.

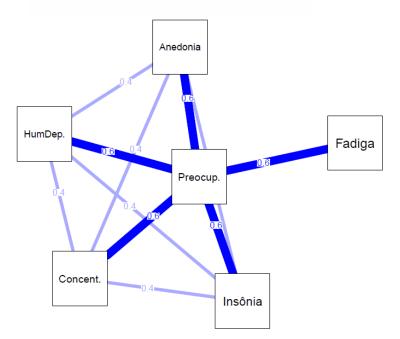
Paciente A





Paciente B

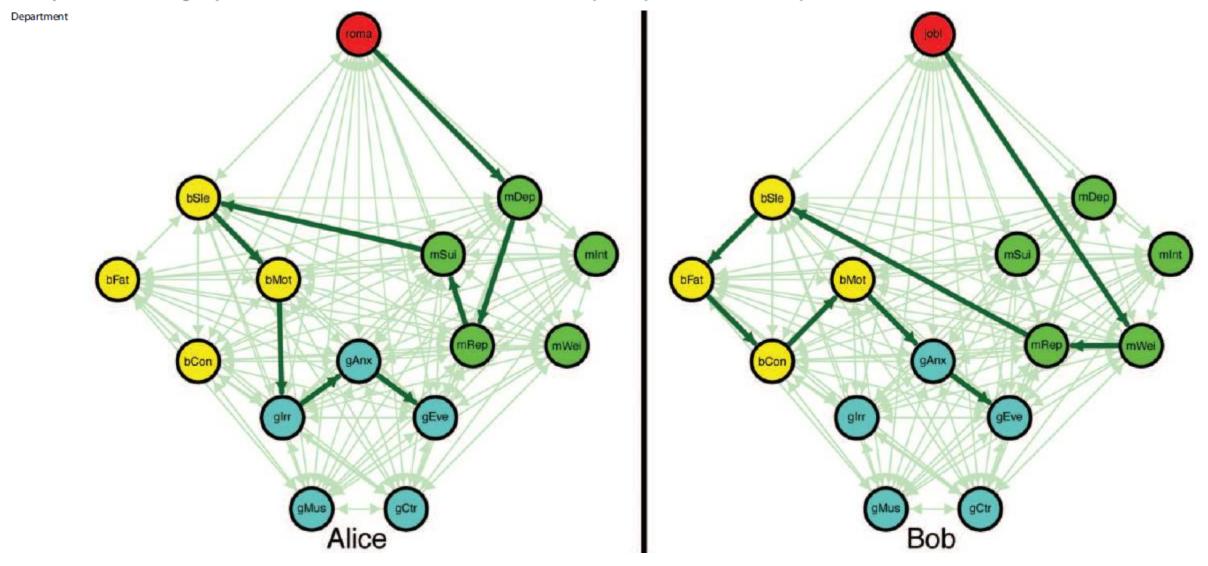






The Small World of Psychopathology

Denny Borsboom*, Angélique O. J. Cramer, Verena D. Schmittmann, Sacha Epskamp, Lourens J. Waldorp



SPECIAL ARTICLE

A network theory of mental disorders

Denny Borsboom

Department of Psychology, University of Amsterdam, Amsterdam 1018 XA, The Netherlands

Complexity, Chaos and Catastrophe:

Modeling Psychopathology as a Dynamic System

Jolanda J. Kossakowski

Angélique O. J. Cramer

Network Analysis: An
Integrative Approach to the
Structure of Psychopathology

Denny Borsboom and Angélique O.J. Cramer

y of Amsterdam, Amsterdam 1018 XA, The Netherlands;

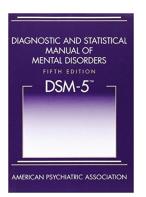
Clinical Neuropsychiatry (2016) 13, 4/5, 68-76

MENTAL DISORDERS AS COMPLEX NETWORKS: AN INTRODUCTION AND OVERVIEW OF A NETWORK APPROACH TO PSYCHOPATHOLOGY*

Michèle B. Nuijten, Marie K. Deserno, Angélique O. J. Cramer, Denny Borsboom

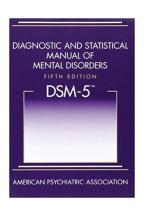
Comorbidade: uma perspectiva de rede

ANSIEDADE	DEPRESSÃO
ANSIEDADE PREOCUPAÇÃO	HUMOR DEPRIMIDO
IRRITABILIDADE	ANEDONIA
TENSÃO MUSCULAR	ALTERAÇÕES DE PESO
ALTERAÇÕES NO SONO	ALTERAÇÕES NO SONO
PROBLEMAS DE CONCENTRAÇÃO	PROBLEMAS CONCENTRAÇÃO
AGITAÇÃO	AGITAÇÃO
FADIGA	FADIGA



Comorbidade: uma perspectiva de rede

ANSIEDADE	DEPRESSÃO
ANSIEDADE PREOCUPAÇÃO	HUMOR DEPRIMIDO
IRRITABILIDADE	ANEDONIA
TENSÃO MUSCULAR	ALTERAÇÕES DE PESO
ALTERAÇÕES NO SONO	ALTERAÇÕES NO SONO
PROBLEMAS DE CONCENTRAÇÃO	PROBLEMAS CONCENTRAÇÃO
AGITAÇÃO	AGITAÇÃO
FADIGA	FADIGA



Comorbidity: A network perspective

Angélique O. J. Cramer

Department of Psychology, University of Amsterdam, 1018 WB Amsterdam, The Netherlands

A.O.J.Cramer@uva.nl www.aojcramer.com

Lourens J. Waldorp

Department of Psychology, University of Amsterdam, 1018 WB Amsterdam, The Netherlands

L.J.Waldorp@uva.nl

http://users.fmg.uva.nl/lwaldorp

Han L. J. van der Maas

Department of Psychology, University of Amsterdam, 1018 WB Amsterdam, The Netherlands

H.L.J.vanderMaas@uva.nl

http://users.fmg.uva.nl/hvandermaas/

Denny Borsboom

Department of Psychology, University of Amsterdam, 1018 WB Amsterdam, The Netherlands

D.Borsboom@uva.nl

http://sites.google.com/site/borsboomdenny/dennyborsboom

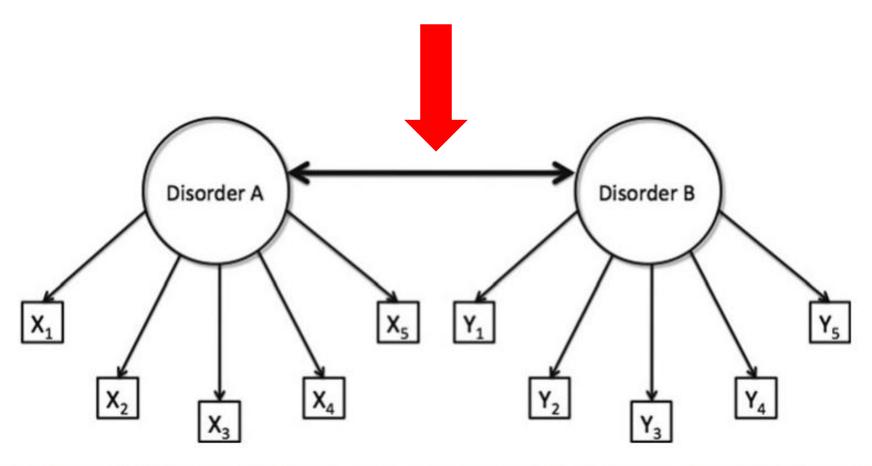
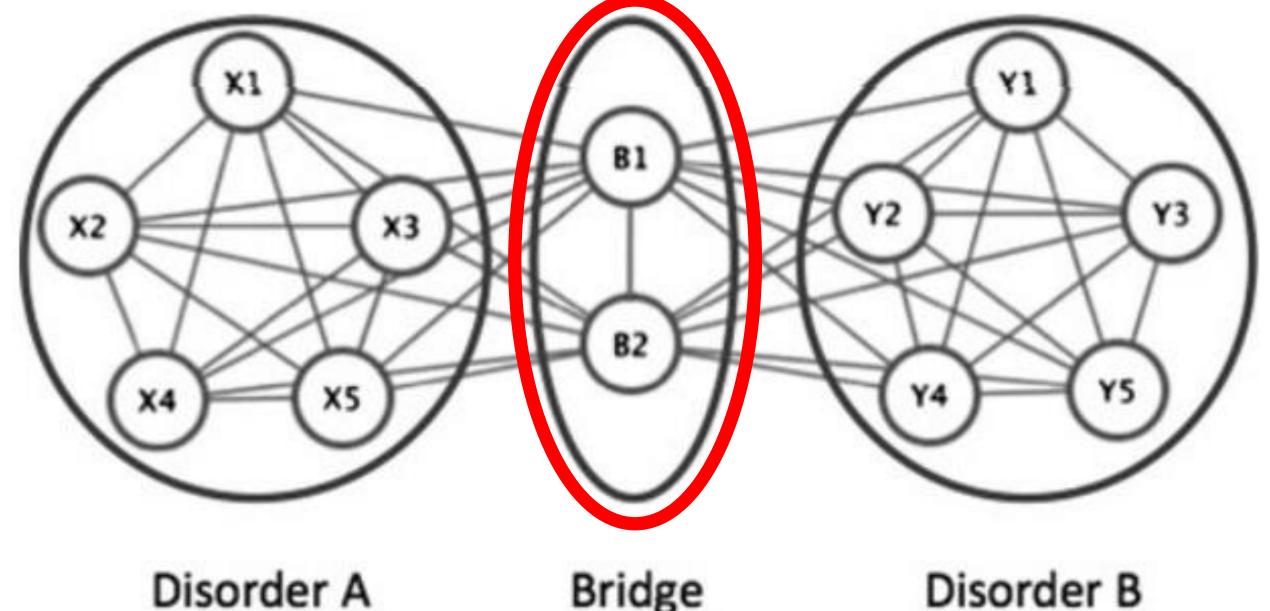
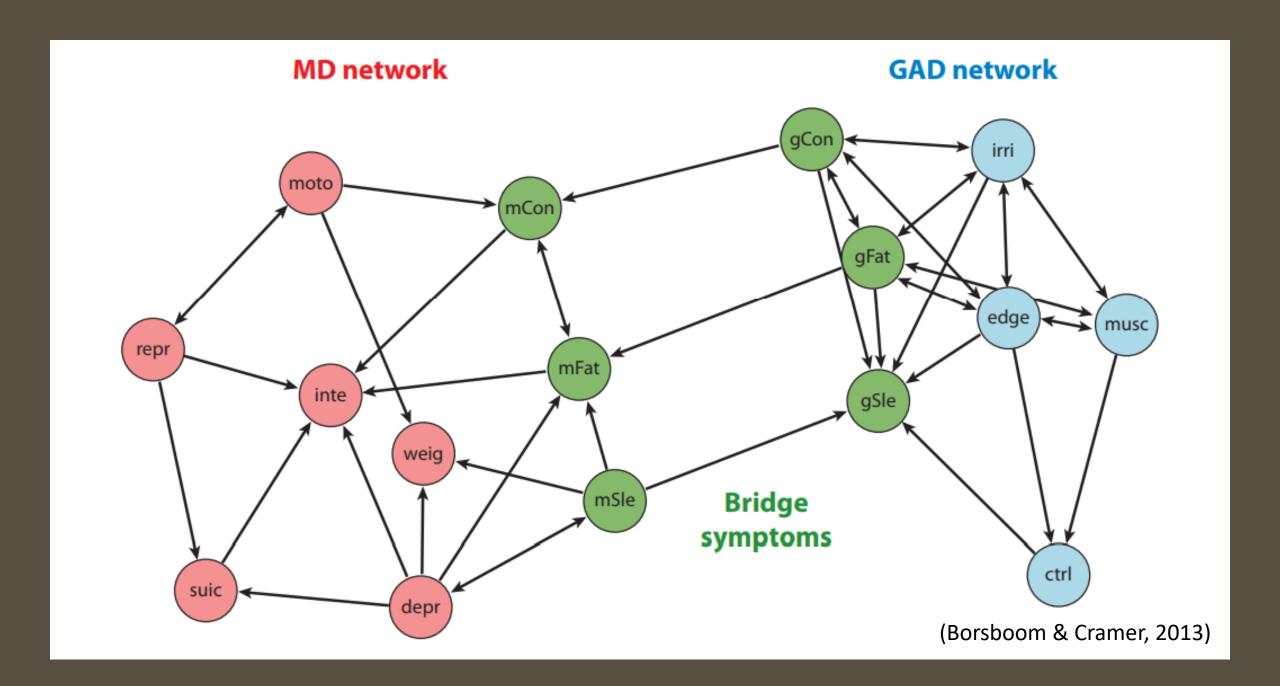
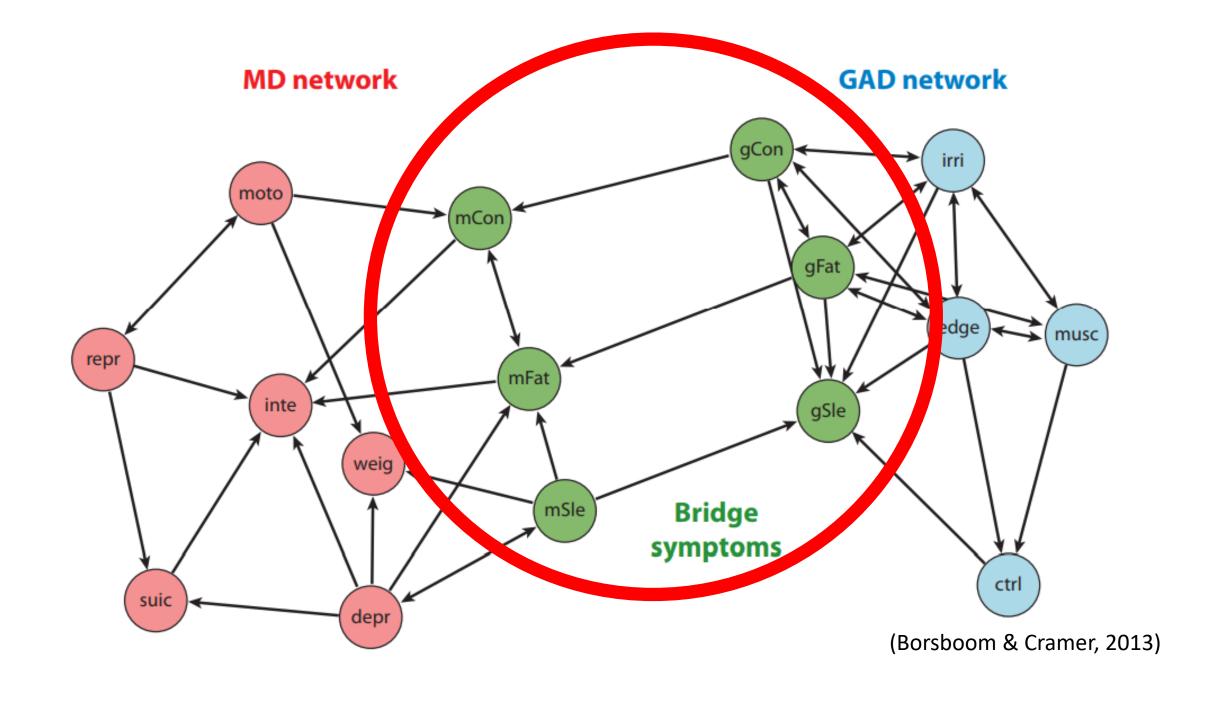


Figure 1. A model of comorbidity between disorders A and B, under the standard assumptions of latent variable modeling. The circles represent the disorders (i.e., latent variables) and the rectangles represent the observable core symptoms of those disorders (i.e., $X_1 - X_5$ for disorder A, and $Y_1 - Y_5$ for disorder B). In this model, comorbidity is viewed as a correlation between the latent variables, visualized by the thick bidirectional edge between disorders A and B.



Bridge symptoms





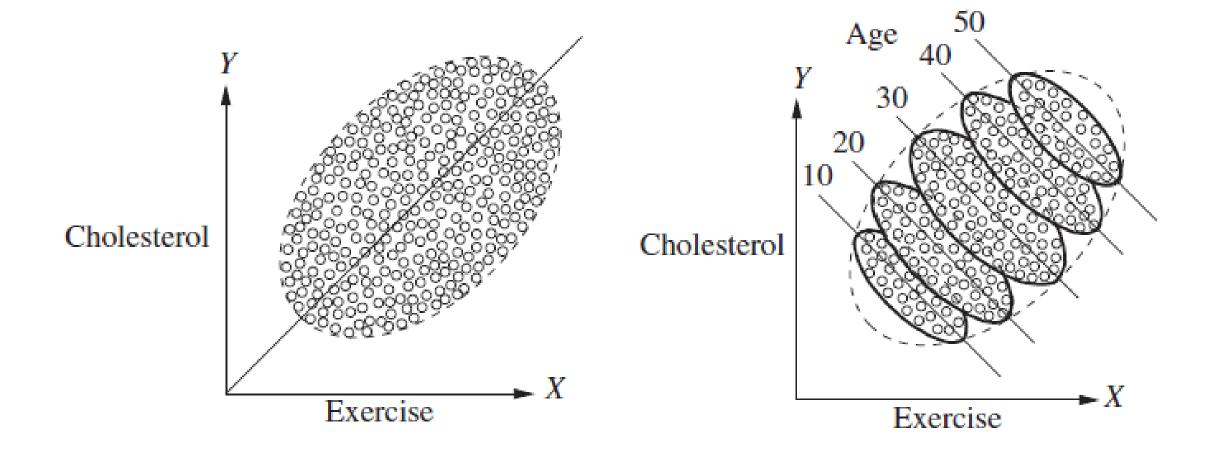
Perguntas:

• Como aplicar o conhecimento de um sistema estimado a partir de um grupo em *um indivíduo*?

Como determinar qual sintoma <u>causa</u> outro?

Modelos e indivíduos

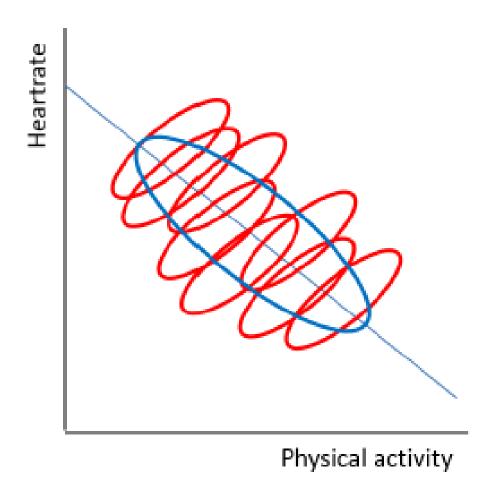
- Algumas inferências sobre indivíduos são incorretamente deduzidas a partir de informações sobre grupos (grandes amostras)
- Falácia ecológica (https://en.wikipedia.org/wiki/Ecological fallacy)

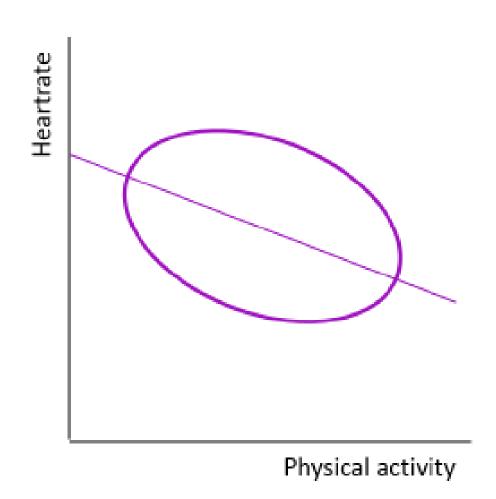


Paradoxo de Simpson (Pearl, Glymour & Jewell, 2016)

Within-person and between-person

Cross-sectional





Modelos e indivíduos

MEASUREMENT, 2(4), 201–218 Copyright © 2004, Lawrence Erlbaum Associates, Inc.

FOCUS ARTICLE

Ergodicidade

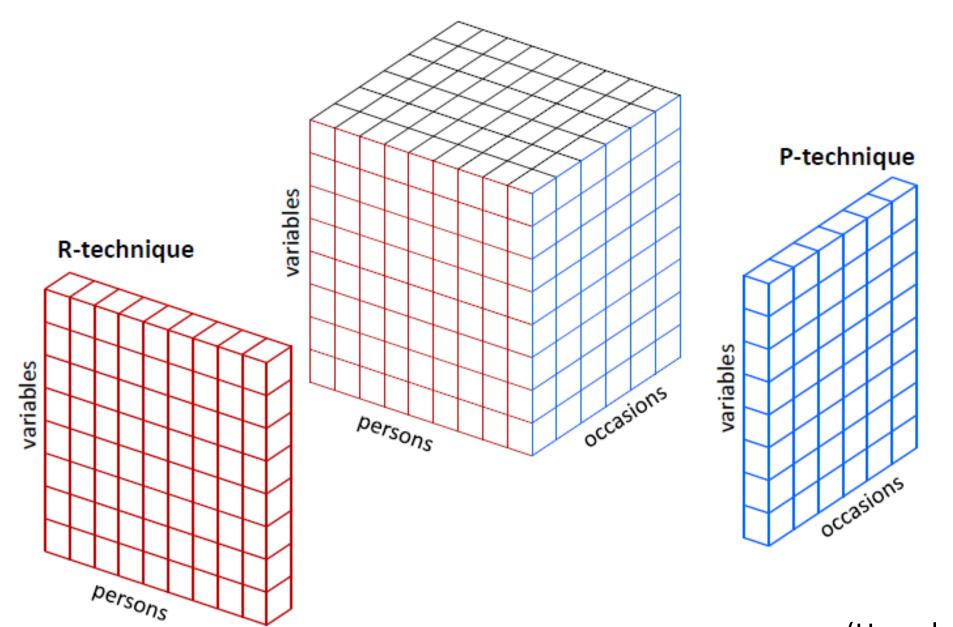
(https://pt.wikipedia.org/wiki/Teoria erg%C3%B3dica)

- Variações na estrutura de medida
- Big-Five: estrutura diferente quando observada variabilidade intraindividual

A Manifesto on Psychology as Idiographic Science: Bringing the Person Back Into Scientific Psychology, This Time Forever

Peter C. M. Molenaar

Cattell's databox

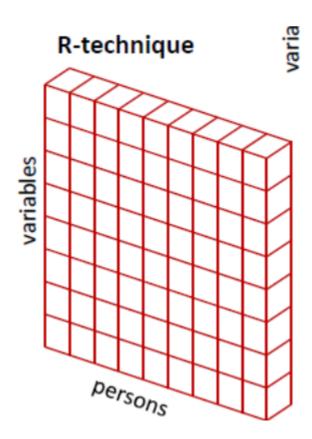


(Hamaker, 2017)

Spearman and the origin and development of factor analysis

D. J. Bartholomew†

London School of Economics and Political Science, Houghton Street, London WC2A 2AE, UK



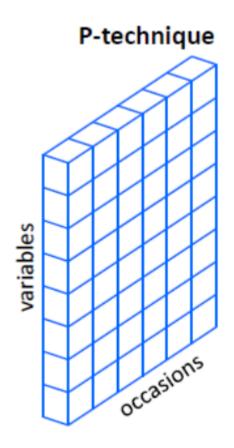
DECEMBER, 1947 PSYCHOMETRIKA—VOL. 12, No. 4

P-TECHNIQUE DEMONSTRATED IN DETERMINING PSYCHO-PHYSIOLOGICAL SOURCE TRAITS IN A NORMAL INDIVIDUAL

R. B. CATTELL, A. K. S. CATTELL, AND R. M. RHYMER UNIVERSITY OF ILLINOIS

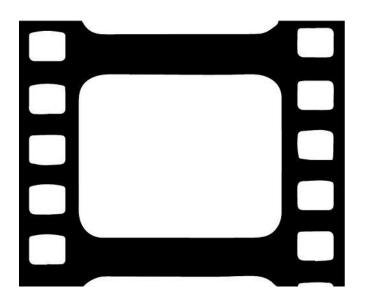


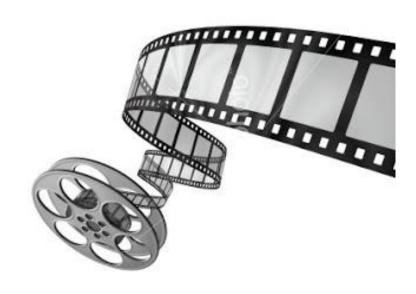
- Wundt
- N = 1
- Introspecção e replicações

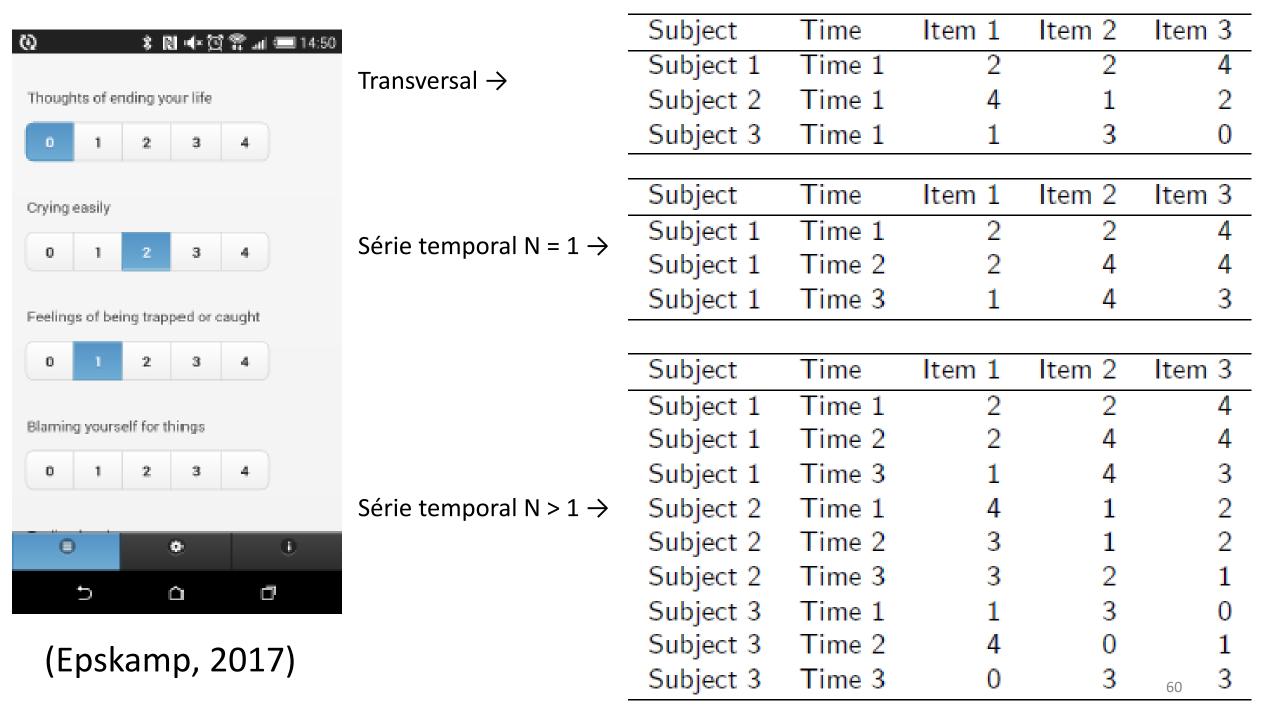


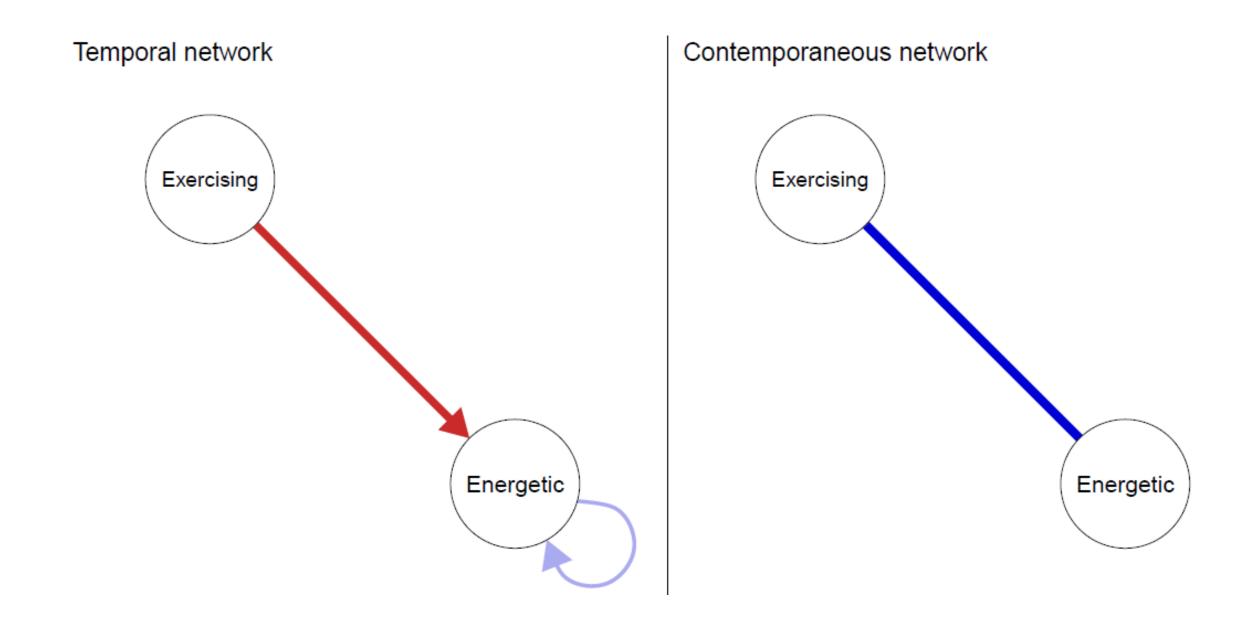
Estudos transversais

Séries temporais





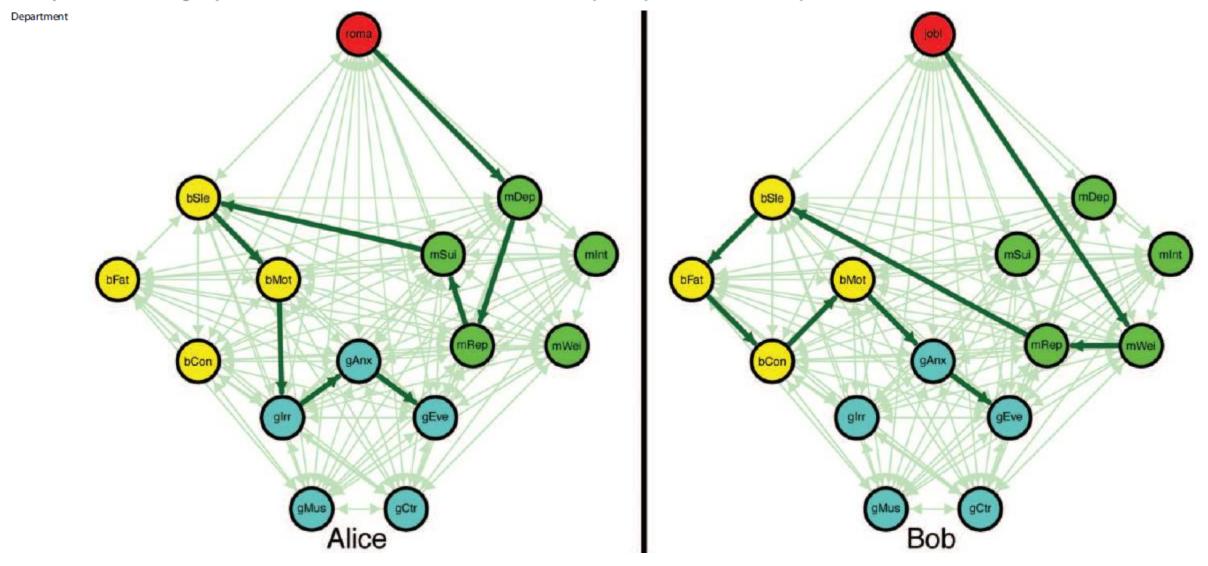






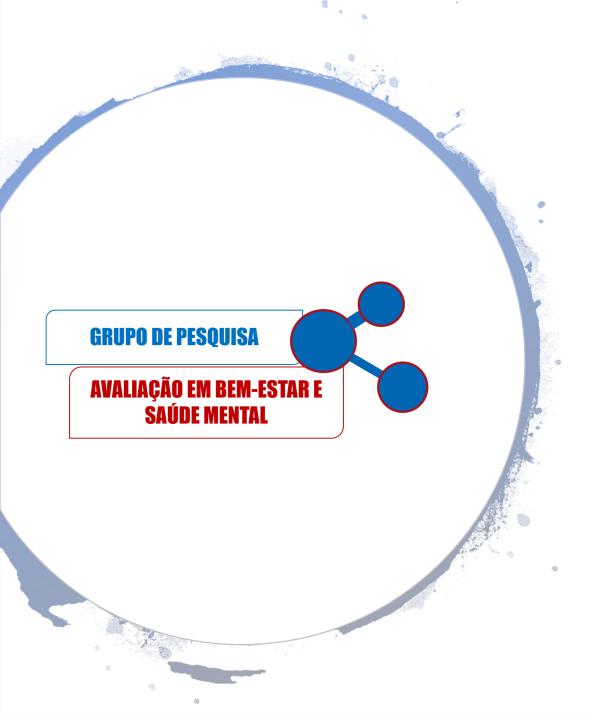
The Small World of Psychopathology

Denny Borsboom*, Angélique O. J. Cramer, Verena D. Schmittmann, Sacha Epskamp, Lourens J. Waldorp



Considerações finais:

- Os modelos de redes representam ferramentas <u>úteis</u> para a compreensão da psicopatologia e da <u>comorbidade</u>
- A avaliação dinâmica pode tornar intervenções mais efetivas e personalizadas
- Permite a transição entre os níveis <u>nomotético e idiográfico</u> na prática clínica e de pesquisa



Muito obrigado!!!

Modelos de rede em psicopatologia e comorbidade

Prof. Dr. Wagner de Lara Machado wagner.machado@pucrs.br