



COMPUTATIONAL PSYCHIATRY COURSE 2016

SCHIZOPHRENIA

Katharina Schmack

Department of Psychiatry and Psychotherapy

Charité – Universitätsmedizin Berlin, Germany

OVERVIEW

1. Clinical perspective
2. Etiology
3. Challenges for computational psychiatry
4. Summary

CLINICAL PERSPECTIVE

Example: Hallucinations



The White Sound
directed by Weingartner & Amann, 2001

Example: Delusions



"I then referred to the ministry of internal affairs, because it is very difficult to get in touch with the secret service. I asked them: Hey, what do you want from me? I don't have any money, I'm not an activist, I'm not a terrorist. I don't understand why you are following and observing me, believe me, this is a waste of time and effort... I don't have any idea about technology, but I sought advice, and I found out that the chip that was implanted into my head cannot be a simple RFID chip, because the range would be far too small. Hence, it must be an implantable GPS chip, and machines that are able to detect such GPS sources cost approximately 25000 Euro."

Patient diagnosed with schizophrenia, 23 years

Symptom Dimensions

Positive = Psychotic

Delusions

Hallucinations

Ego disorders

Negative

Blunted Affect

Avolition/Anhedonia

Social withdrawal

Disorganization

Incoherent Thoughts

Incoherent Behavior

BUT: Inconclusive evidence about dimension number and structure

Further reading

Peralta V, Cuesta MJ (2001) How many and which are the psychopathological dimensions in schizophrenia? Issues influencing their ascertainment. Schizophr Res 49:269–285.

Catatonic Symptoms

Mannerism

Stereotypies

Motor immobility

Affective Symptoms

Depression

Mania

Cognitive Deficits

Working Memory

Executive Function

Attention

Neurological „Soft Signs“

Motor coordination

Sensory integration

Eye movements

Further reading

Dazzan P, Murray RM (2002) Neurological soft signs in first-episode psychosis: a systematic review. Br J Psychiatry Suppl 43:s50-57.

- Lifetime prevalence $\sim 0,7\%$
 - $\sigma = \text{♀}$
 - regional variation
- Age of onset in late adolescence/early adulthood
 - σ earlier than ♀
- Mortality and disability
 - suicide lifetime risk $\sim 10\%$
 - persisting disability in $40\% \sigma$ and $25\% \text{♀}$

Further reading

Saha S, Chant D, Welham J, McGrath J (2005) A systematic review of the prevalence of schizophrenia. PLoS Med 2:e141.
WHO Schizophrenia and Public Health. Geneva, World Health Organization.

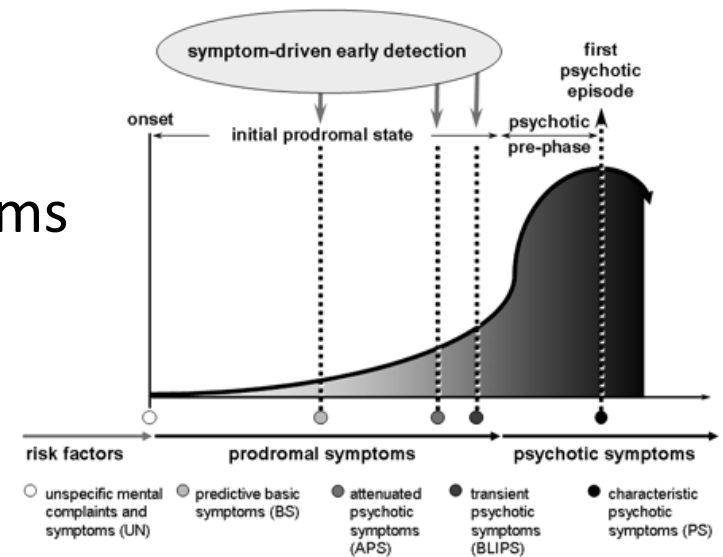
categorical decision based on symptoms

- ICD-10 or DSM-IV



early recognition based on subtle symptoms

- beneficial for treatment response



Further reading

Fusar-Poli P et al. (2013) The psychosis high-risk state: a comprehensive state-of-the-art review. JAMA Psychiatry 70:107–120.



Antipsychotic drugs

D2 receptor blockade
efficient symptom reduction
considerable side effects



Psychosocial interventions

CBT, social skills training, family
interventions, cognitive training
efficient symptom reduction

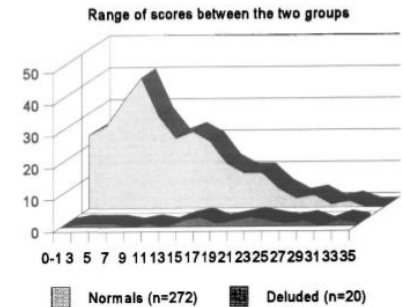
Sources

Leucht S, Cipriani A, Spineli L, Mavridis D, Orey D, Richter F, Samara M, Barbui C, Engel RR, Geddes JR, Kissling W, Stapf MP, Lässig B, Salanti G, Davis JM (2013) Comparative efficacy and tolerability of 15 antipsychotic drugs in schizophrenia: a multiple-treatments meta-analysis. Lancet 382:951–962.

Pfammatter M, Junghan UM, Brenner HD (2006) Efficacy of psychological therapy in schizophrenia: conclusions from meta-analyses. Schizophr Bull 32 Suppl 1:S64-80.

Psychosis-like experiences

- found in general population
- measurable by questionnaires (e.g. PDI-40, CAPS)
- similar underlying mechanisms as schizophrenia
 - relatives of schizophrenia patients
 - similar epidemiological factors as schizophrenia
 - increased schizophrenia risk
- study of schizophrenia without illness-related confounders



Sources

Peters ER, Joseph SA, Garety PA (1999) Measurement of delusional ideation in the normal population: introducing the PDI (Peters et al. Delusions Inventory). Schizophr Bull 25:553–576.

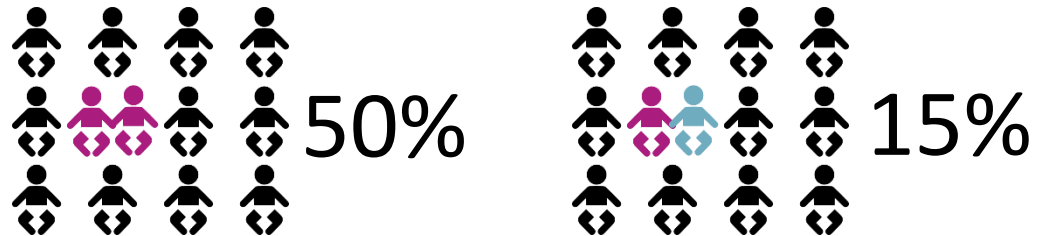
Bell V, Halligan PW, Ellis HD (2006) The Cardiff Anomalous Perceptions Scale (CAPS): a new validated measure of anomalous perceptual experience. Schizophr Bull 32:366–377.

Further reading

Linscott RJ, van Os J (2013) An updated and conservative systematic review and meta-analysis of epidemiological evidence on psychotic experiences in children and adults. Psychol Med 43:1133–1149.

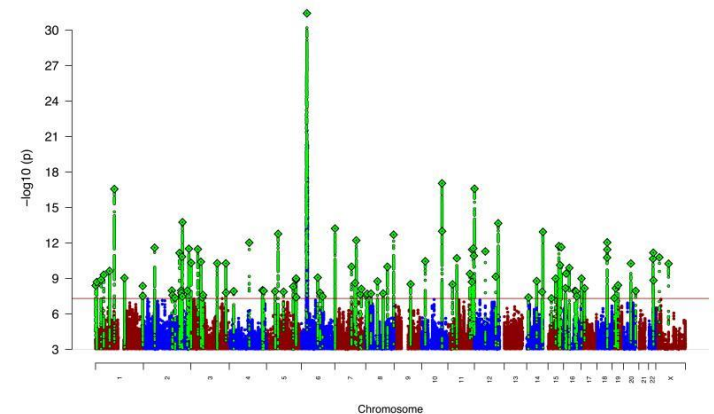
ETIOLOGY

Twin concordance rates



Genetic heterogeneity

- Rare variations with large effects (CNVs)
- Frequent variations with small effects (SNPs)

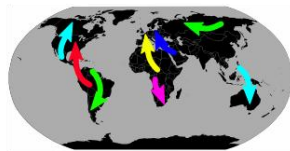


Overlap with bipolar and schizoaffective disorder

Further reading

Rees E et al. (2014) Analysis of copy number variations at 15 schizophrenia-associated loci. *Br J Psychiatry* 204:108–114.

Schizophrenia Working Group of the Psychiatric Genomics Consortium (2014) Biological insights from 108 schizophrenia-associated genetic loci. *Nature* 511:421–427.



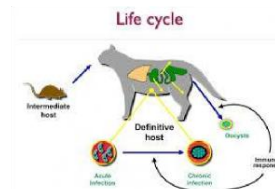
migration status

OR 4.6



older fathers

OR 3.8



Toxoplasmosis gondii

antibodies

OR 2.7



winter/spring birth

OR 1.1



lifetime cannabis use

OR 2.1



obstetrical complications

OR 1.8



prenatal famine

OR 2.3



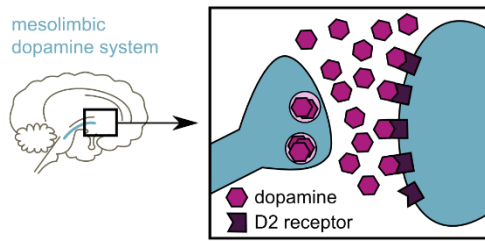
urban rearing

OR 1.7

Sources

- McGrath J et al. (2004) *BMC Med* 2:13.
- Zammit S et al. (2003) *Br J Psychiatry* 183:405-8.
- Torrey EF et al. (2007) *Schizophr Bull* 33(3):729-36.
- Henquet C et al. (2005) *Schizophr Bull* 31(3):608-12.
- Krabbendam L, van Os J (2005) *Schizophr Bull* 31(4):795-9.
- Davies G et al. (2003) *Schizophr Bull* 29(3):587-93.
- St Clair D et al (2005) *JAMA* 294(5):557-62.

Dopamine hypothesis



1. D2 antagonists reduce symptoms of schizophrenia
immediate effect? similar effects on positive and negative symptoms?
2. Dopamine agonists lead to symptoms similar to schizophrenia
BUT rather after chronic use or after previous schizophrenia episodes
3. Increased F-DOPA uptake in schizophrenia in PET studies
and related conditions
4. Association of D2 receptor gene to schizophrenia in GWAS

➤ Sensitized dopamine system is the „final common pathway“.

Further reading

Howes OD, Murray RM (2014) Schizophrenia: an integrated sociodevelopmental-cognitive model. *Lancet* 383:1677–1687.



1. glutamate (NMDA) antagonists induce symptoms similar to schizophrenia immediate effect and both positive and negative symptoms
2. BUT controversial whether glutamate agonists (mGluR and NMDA) reduce schizophrenia symptoms
3. Decreased glutamate signals in schizophrenia in ^1H -MRS studies
4. Association of glutamatergic genes to schizophrenia in GWAS

➤ **Glutamate/NMDA hypofunction is involved in schizophrenia.**

Further reading

Aleman A, Lincoln TM, Bruggeman R, Melle I, Arends J, Arango C, Knegt H (2016) Treatment of negative symptoms: Where do we stand, and where do we go? Schizophr Res.

Marsman A, van den Heuvel MP, Klomp DWJ, Kahn RS, Luijten PR, Hulshoff Pol HE (2013) Glutamate in schizophrenia: a focused review and meta-analysis of ^1H -MRS studies. Schizophr Bull 39:120–129.



1. Increased inflammatory cytokines in schizophrenia
cause or consequence? confounders?
2. Activation of brain immune cells in schizophrenia in PET studies
valid methodology? only 2 studies
3. Anti-inflammatory treatment reduces symptoms of schizophrenia
4. Association of immune-related genes to schizophrenia in GWAS
role in inflammation or in pruning?

➤ Immune processes play a role in schizophrenia (at least in some cases).

Further reading

Khandaker GM, Cousins L, Deakin J, Lennox BR, Yolken R, Jones PB (2015) Inflammation and immunity in schizophrenia: implications for pathophysiology and treatment. *Lancet Psychiatry* 2:258–270.

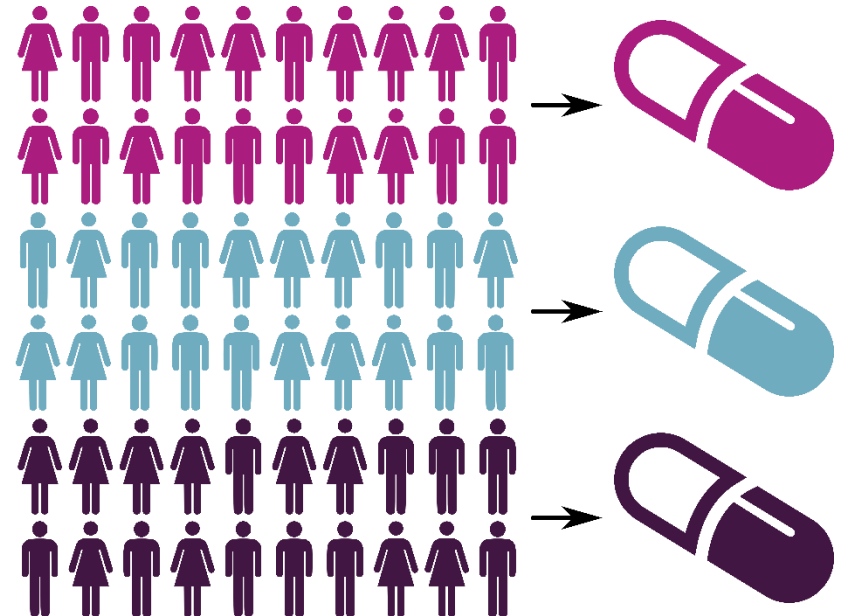
Sekar A, Bialas AR, de Rivera H, Davis A, Hammond TR, Kamitaki N, Tooley K, Presumey J, Baum M, Van Doren V, Genovese G, Rose SA, Handsaker RE, Schizophrenia Working Group of the Psychiatric Genomics Consortium, Daly MJ, Carroll MC, Stevens B, McCarroll SA (2016) Schizophrenia risk from complex variation of complement component 4. *Nature* 530:177–183.

CHALLENGES & COMPUTATIONAL PSYCHIATRY

heterogenous
pathogenesis

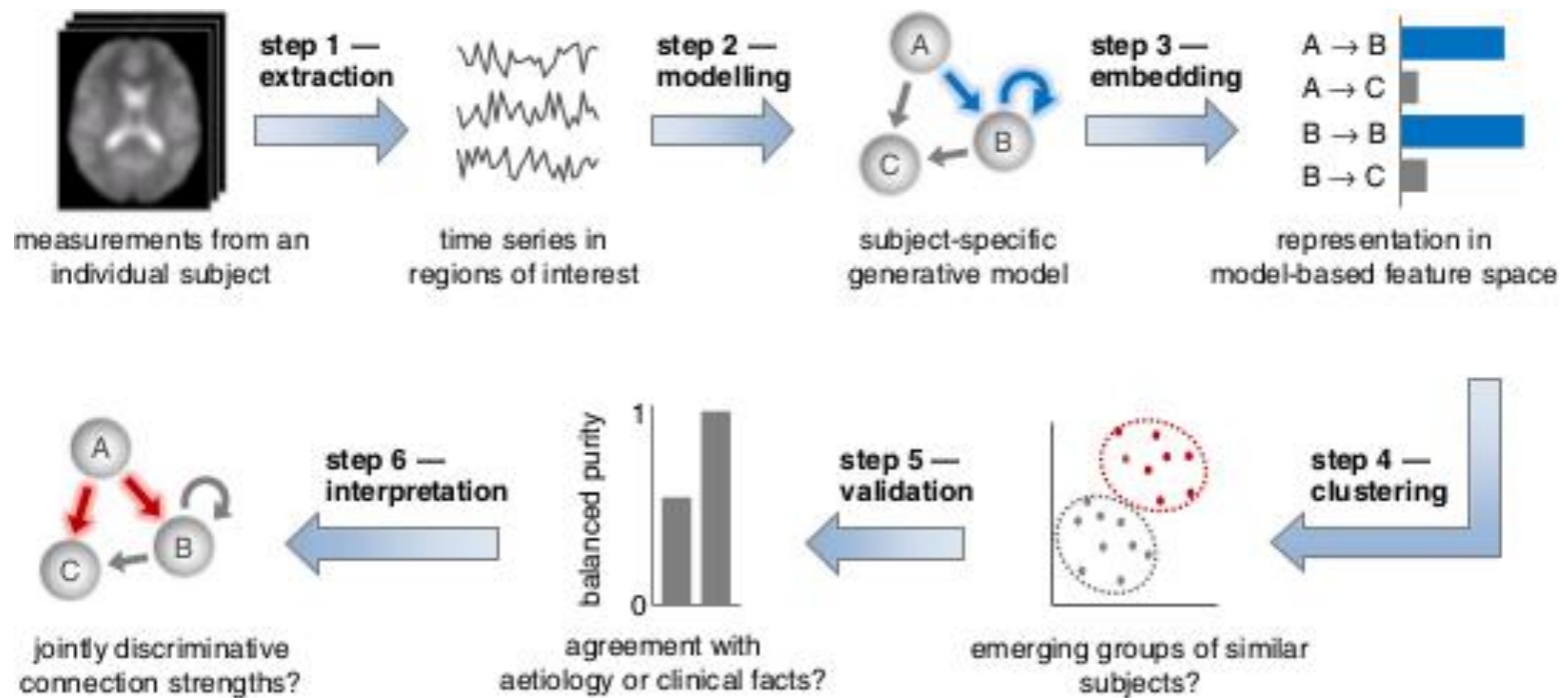


targeted
treatment



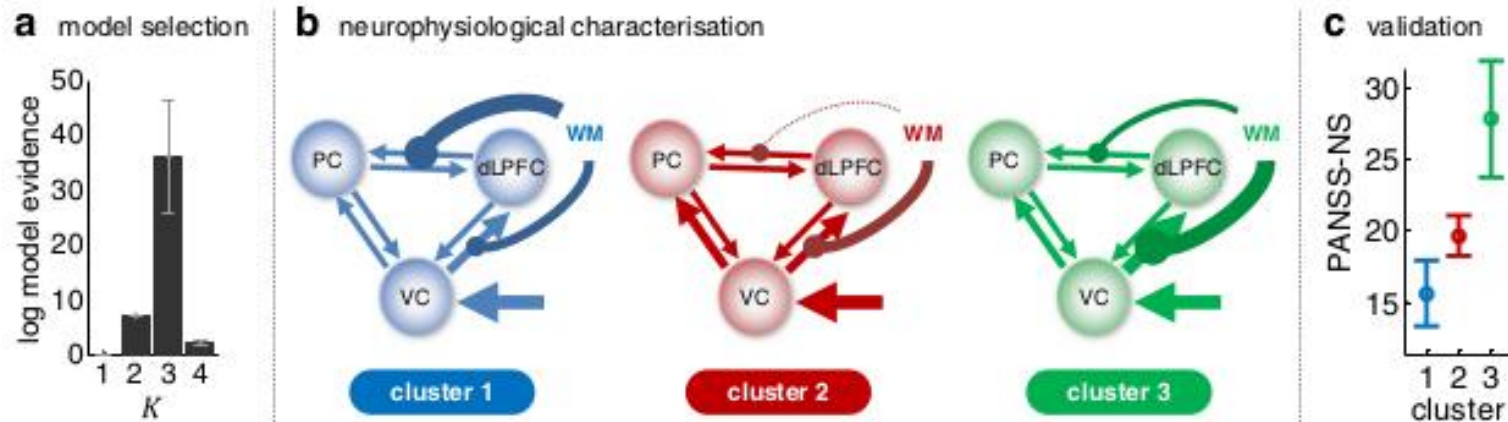
- computational algorithms for sorting individuals into neurophysiologically interpretable clusters

Example: Generative embedding



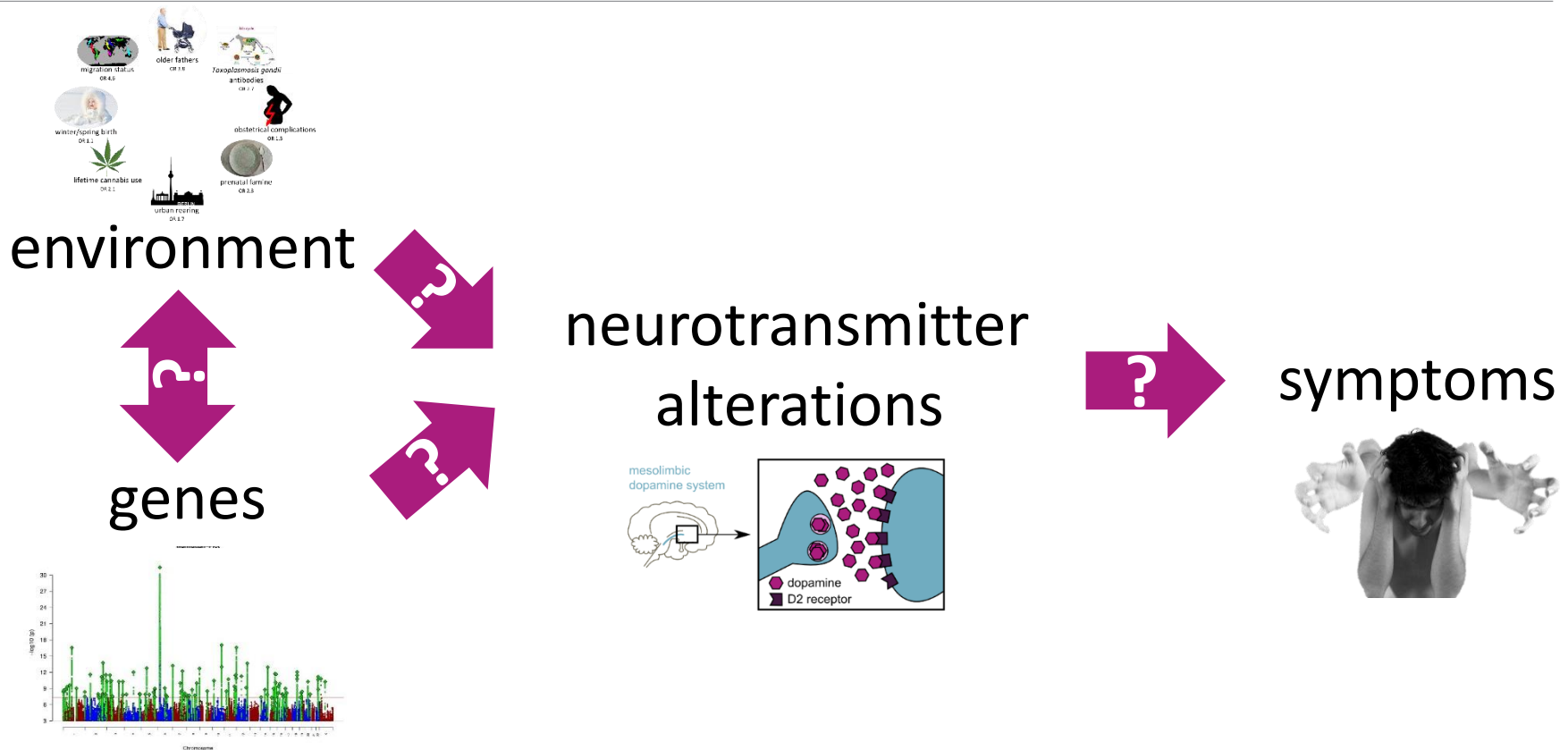
Brodersen KH, Deserno L, Schlagenhauf F, Lin Z, Penny WD, Buhmann JM, Stephan KE (2014) Dissecting psychiatric spectrum disorders by generative embedding. *Neuroimage Clin* 4:98–111.

Example: Generative embedding



- clustering of schizophrenia patients that differ in neural circuit architecture
- mapping onto differences in clinical presentation

Brodersen KH, Deserno L, Schlagenhauf F, Lin Z, Penny WD, Buhmann JM, Stephan KE (2014) Dissecting psychiatric spectrum disorders by generative embedding. *Neuroimage Clin* 4:98–111.

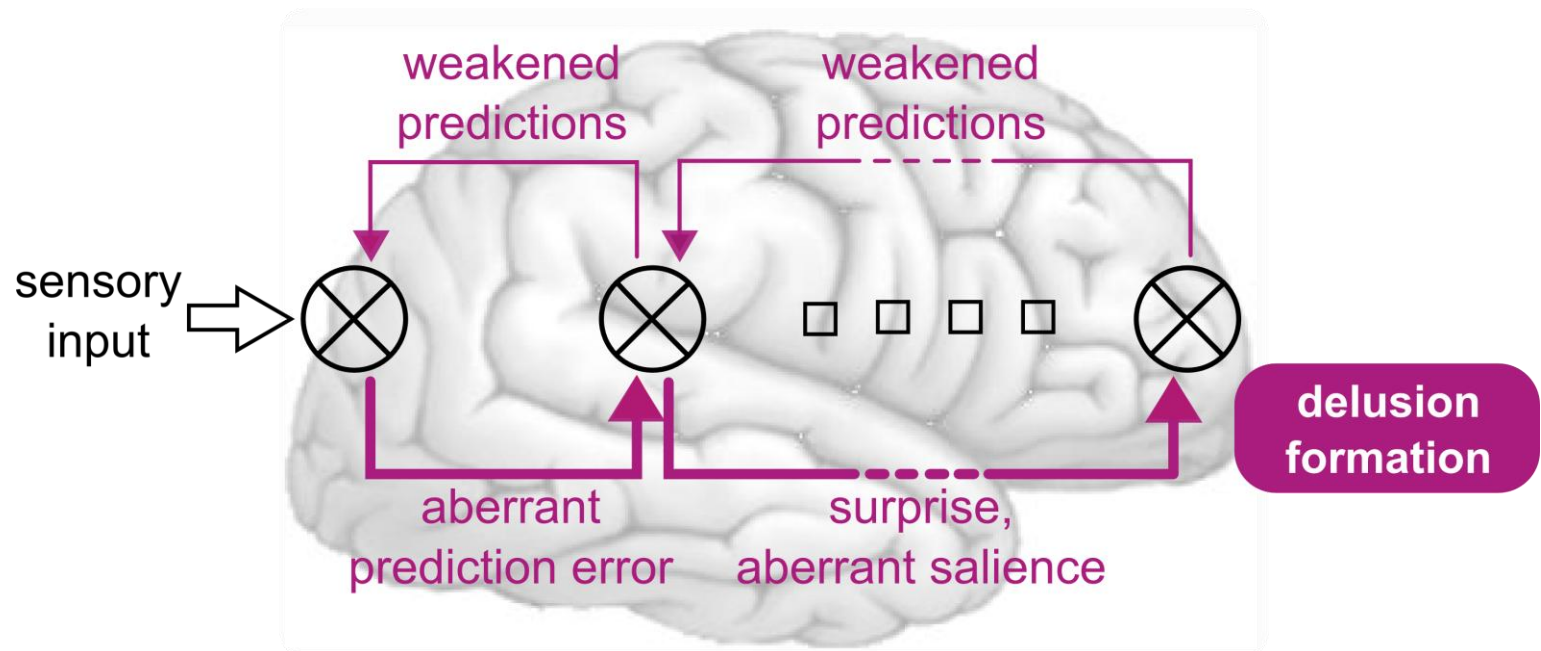


- computational models for linking clinical symptoms with neurophysiologically plausible models of neural circuitry

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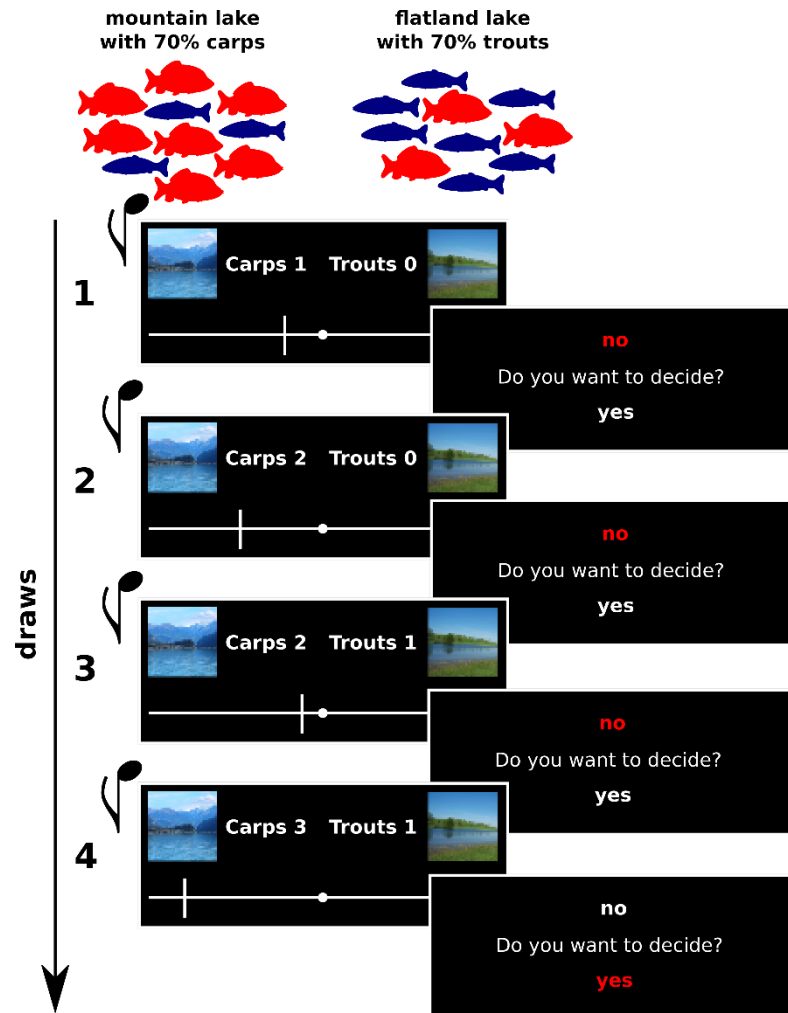
Example: Non-linear learning

Predictive coding and psychosis



Heinz 2002, *Eur Psychiatry*
Kapur 2005, *Am J Psychiatry*
Fletcher & Frith 2008, *Nat Rev Neurosci*

Example: Non-linear learning



8/28/2016

Schizophrenia

„Jumping-to-conclusions“
Correlation draws to decisions and
psychotic experiences

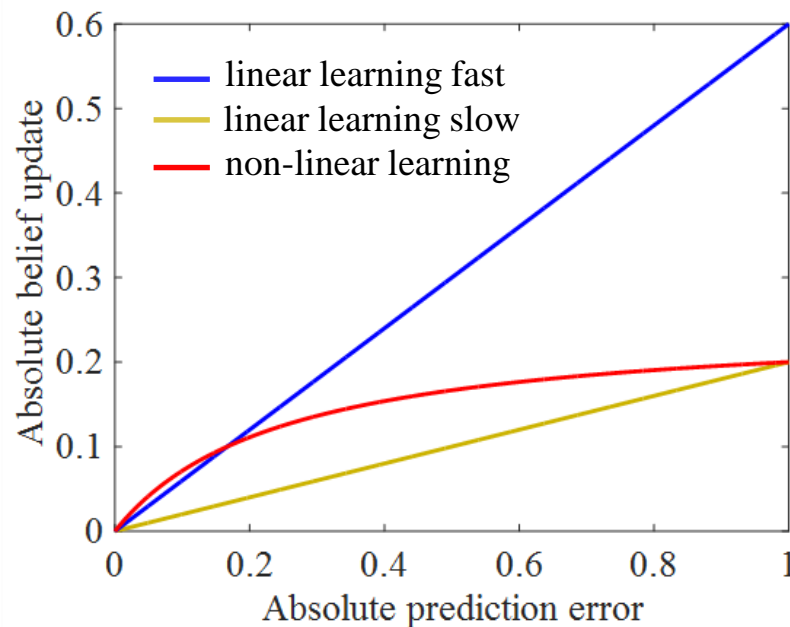
delusions: $r=-0.18, p=0.04^*$

hallucinations: $r=-0.15, p=0.06$

n=94 healthy individuals

Stuke H, Stuke H, Weilhhammer V, Schmack K (under review) Psychotic experiences and overhasty inferences are related to maladaptive learning.

Example: Non-linear learning



non-linear learning model

$$b_i = b_{i-1} \pm \alpha * \frac{1}{\zeta + \frac{1}{|b_{i-1} - o_i|}}$$

resilience against irrelevant information

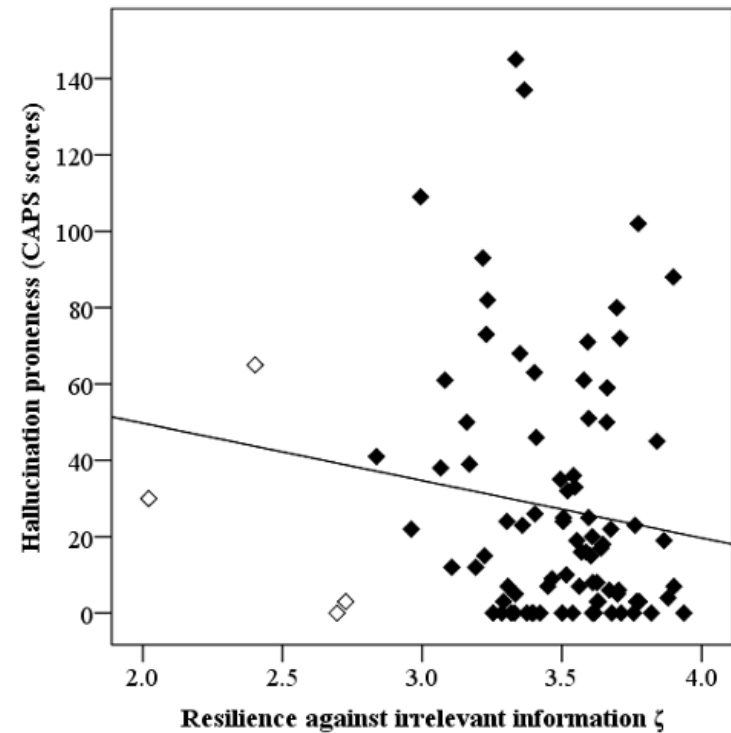
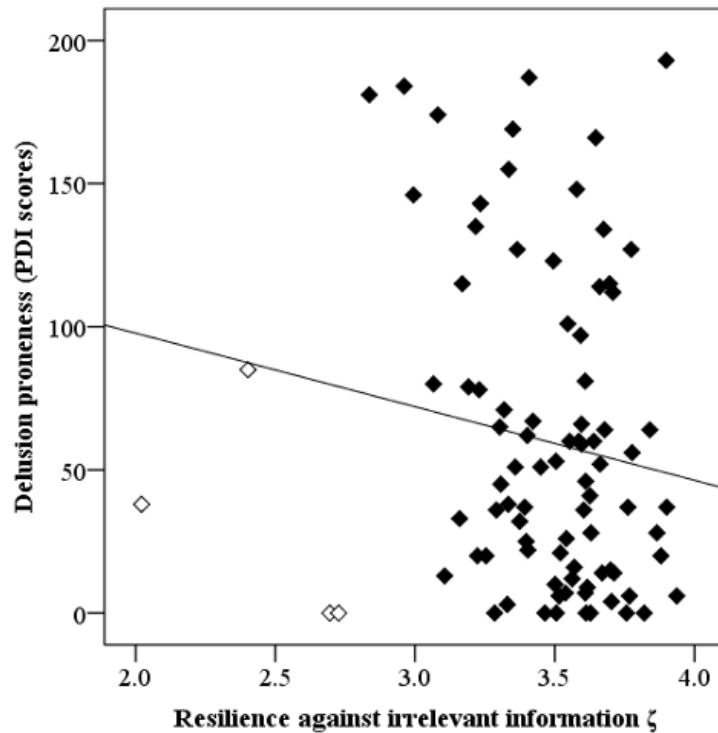
exceedance probability 100%

explained variance $R^2=0.70$

ζ * draws to decision: $r=-0.77$, $p<0.001$

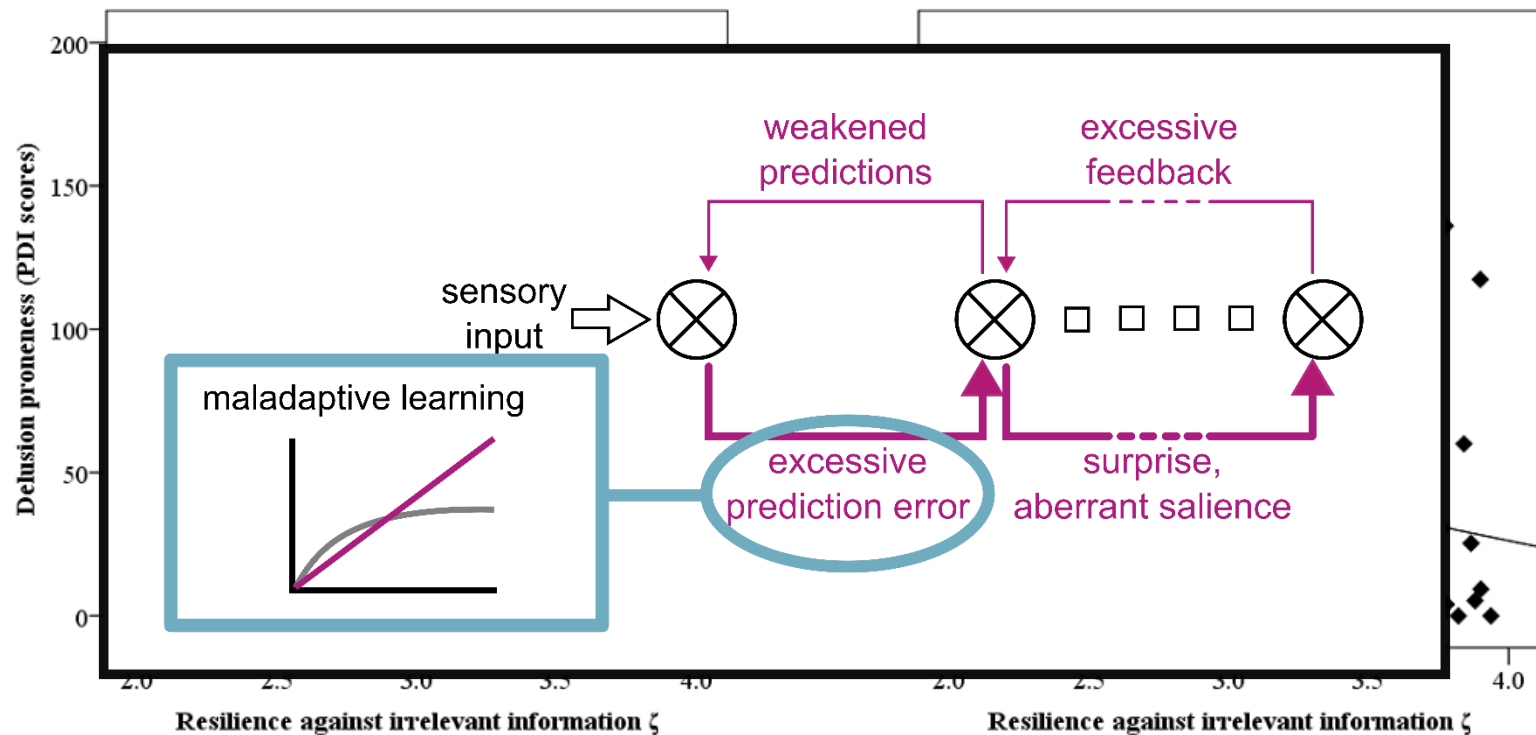
Stuke H, Stuke H, Weilhhammer V, Schmack K (under review) Psychotic experiences and overhasty inferences are related to maladaptive learning.

Example: Non-linear learning



Stuke H, Stuke H, Weilhhammer V, Schmack K (under review) Psychotic experiences and overhasty inferences are related to maladaptive learning.

Example: Non-linear learning



- neurophysiologically plausible description of ‚psychotic‘ cognition/perception
- mapping onto neurophysiological alterations

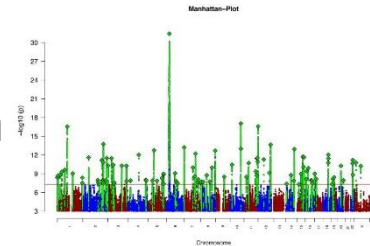
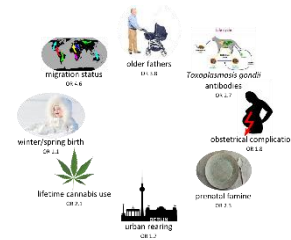
SUMMARY

- positive, negative and disorganization symptoms
- purely ,phenomenological‘ diagnosis
- increased mortality and often persistent disability
- pharmacological (D2 antagonists) and psychosocial treatment

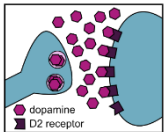
FACTS

genetic risk with polygenic and/or monogenic pattern

variety of environmental risk factors



HYPOTHESES



excessive mesolimbic dopamine signaling



deficient NMDA signaling



inflammation

1. HETEROGENEITY

- computational algorithms for sorting individuals into neurophysiologically interpretable clusters

2. EXPLANATORY GAPS

- computational models for linking clinical symptoms with neurophysiologically plausible models of neural circuitry

QUESTIONS?

THANK YOU!

Psychiatry – Charité

Berlin

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Stockholm

Predrag Petrovic

ETH/Universität Zürich

Zurich

Klaas Enno Stephan

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University Toronto

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CONTACT

Katharina Schmack

Clinician Scientist

Berlin Institute of Health

Department of Psychiatry

Campus Charité Mitte

katharina.schmack@charite.de

www.bihealth.org



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