

10 YEARS CPC ❤

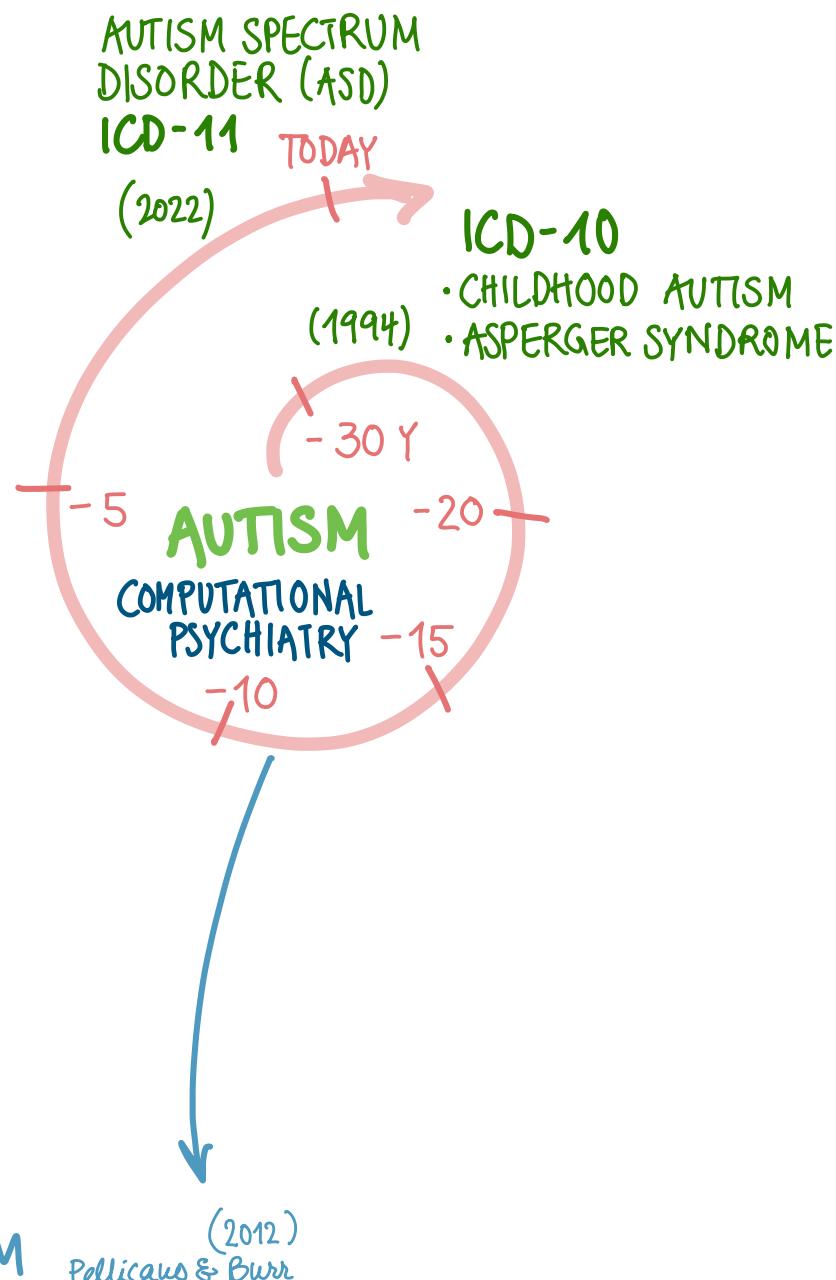
COMPUTATIONAL
PSYCHIATRY
COURSE 2024

AUTISM

THE ROLE OF
COMPUTATIONAL PSYCHIATRY
IN THE DEVELOPMENT
OF A DEVELOPMENTAL DISORDER

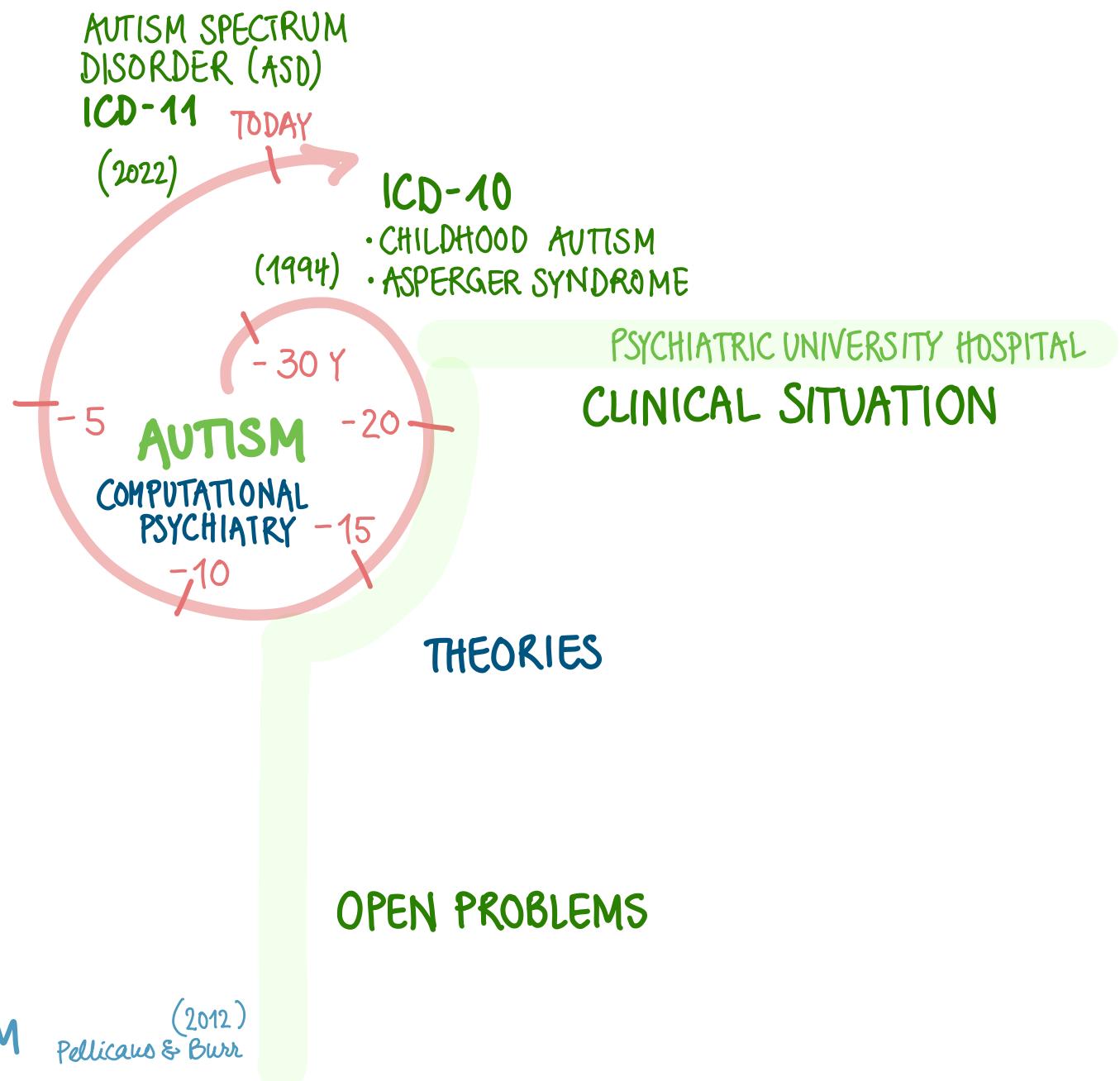
Helene Haker

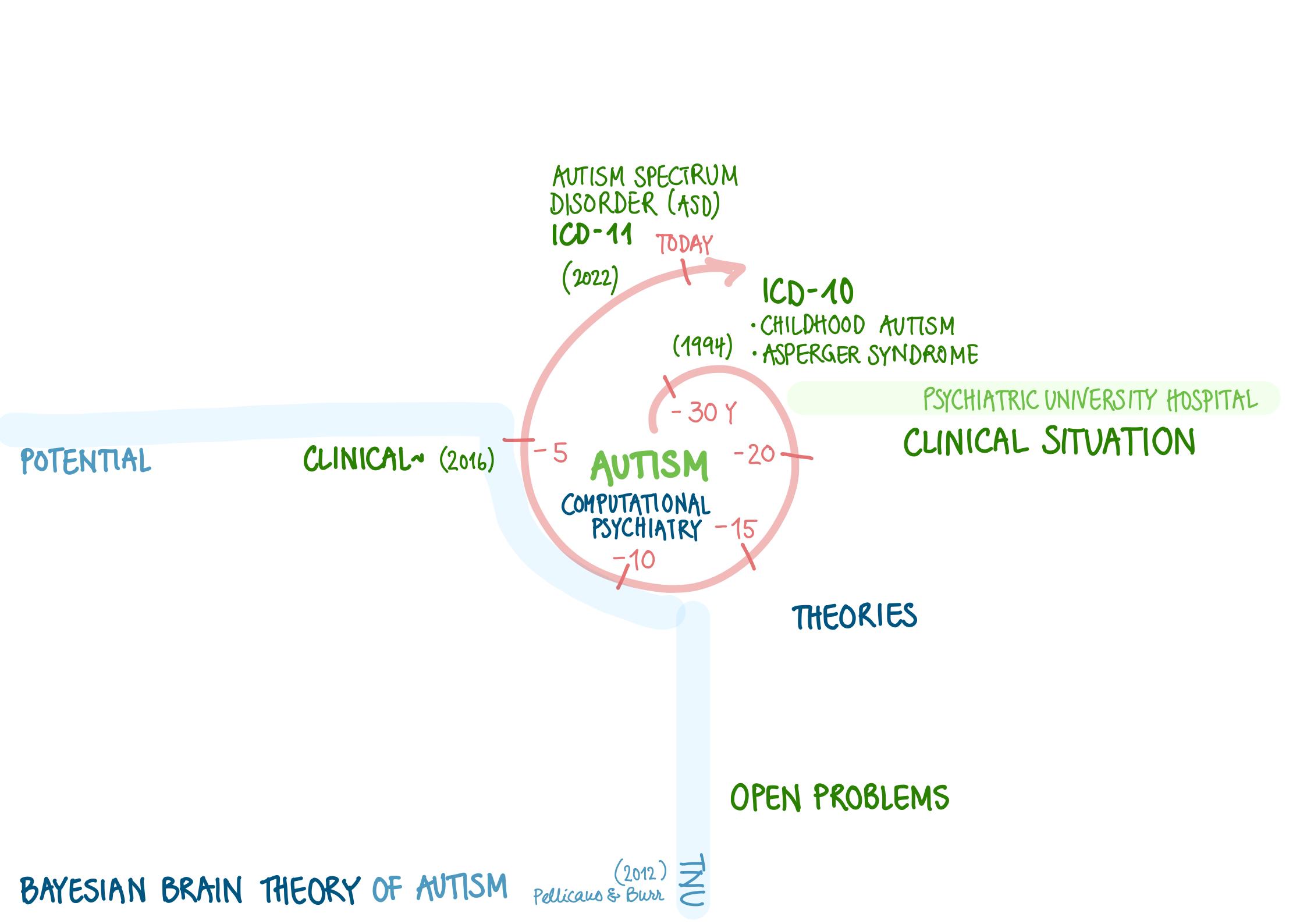
haker@autismusperspektive.ch



BAYESIAN BRAIN THEORY OF AUTISM

Pellicano & Burr
(2012)





NEW CLINICAL PROBLEM ← COMPUTATIONAL PSY?

TX
↓

↑
DX

AUTISM SPECTRUM
DISORDER (ASD)
ICD-11
(2022)

TODAY

WHY IMPORTANT?

ICD-10

- CHILDHOOD AUTISM
- ASPERGER SYNDROME

AUTISM AS A CONGENITAL INFORMATION INTEGRATION DISORDER

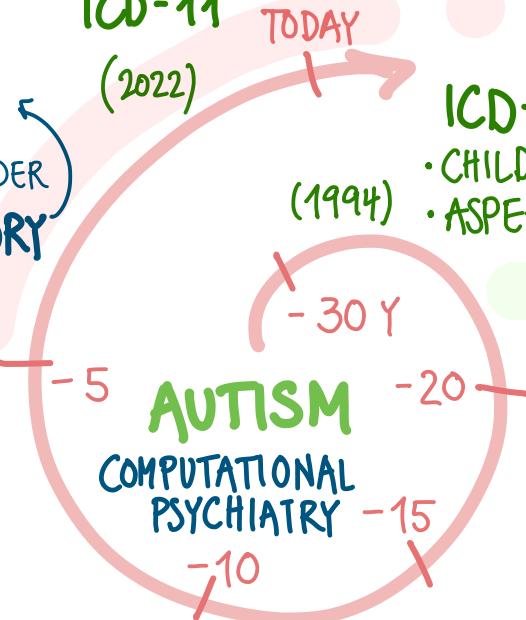
QUALITATIVE APPLICATION OF THE THEORY

PRIVAT PRACTICE

POTENTIAL

CLINICAL~ (2016)

PSYCHIATRIC UNIVERSITY HOSPITAL
CLINICAL SITUATION

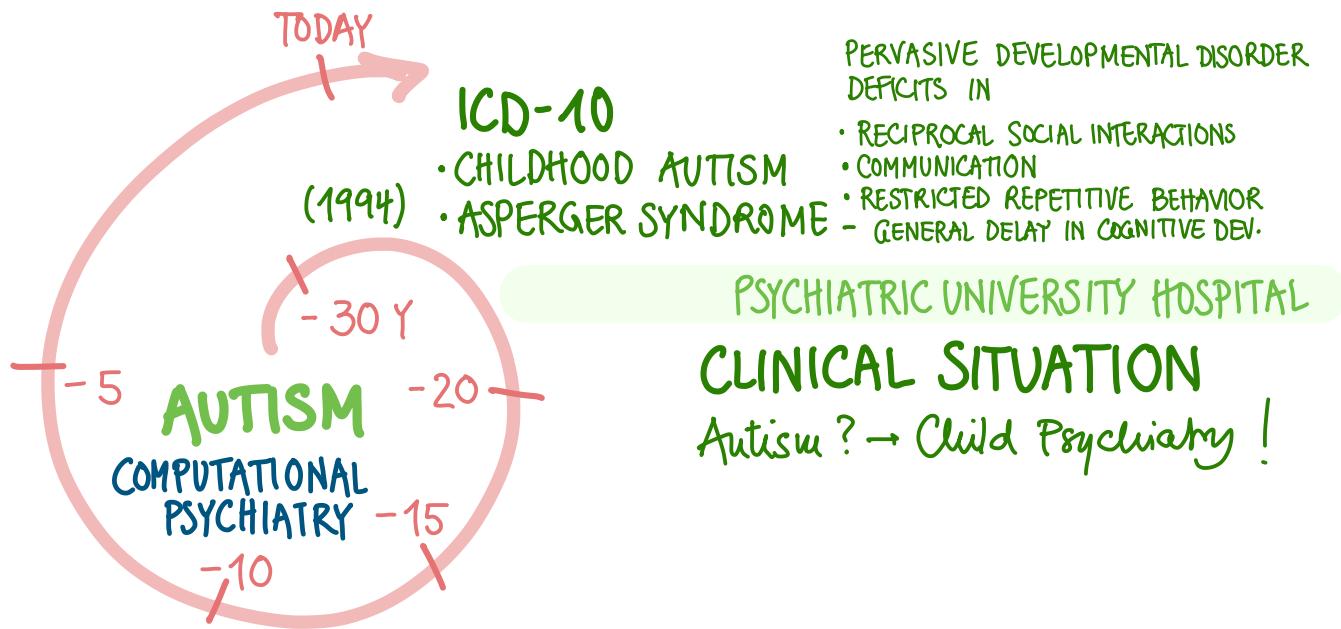


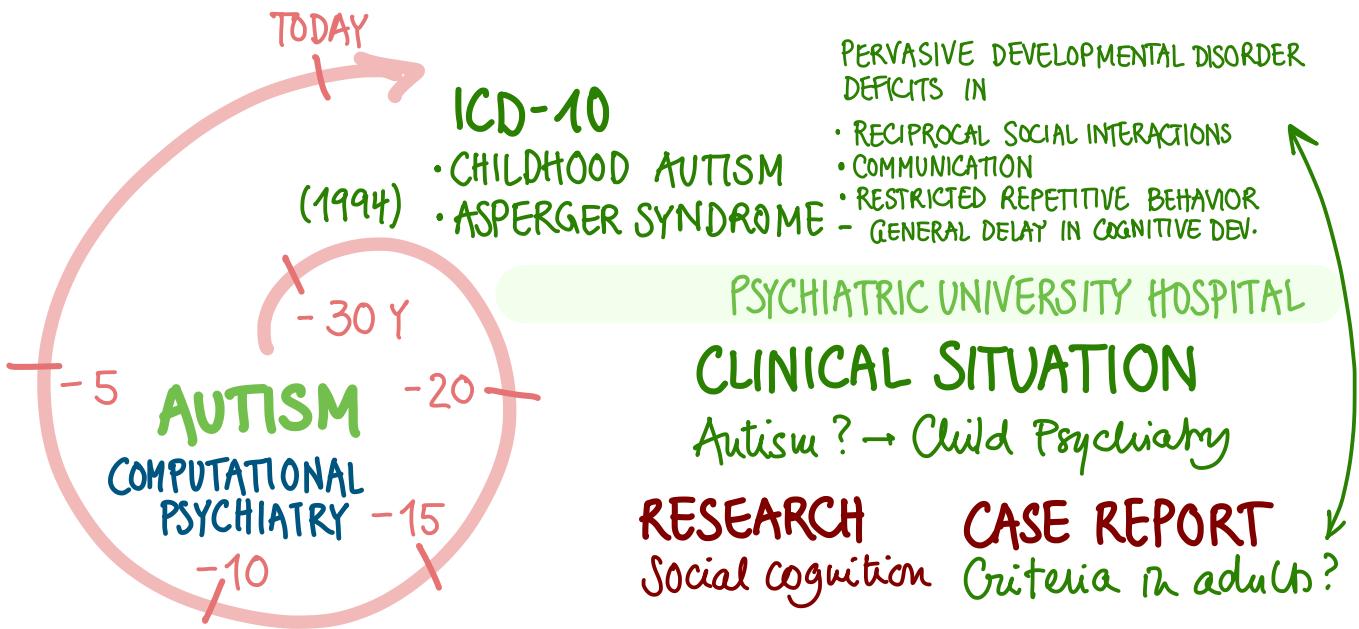
THEORIES

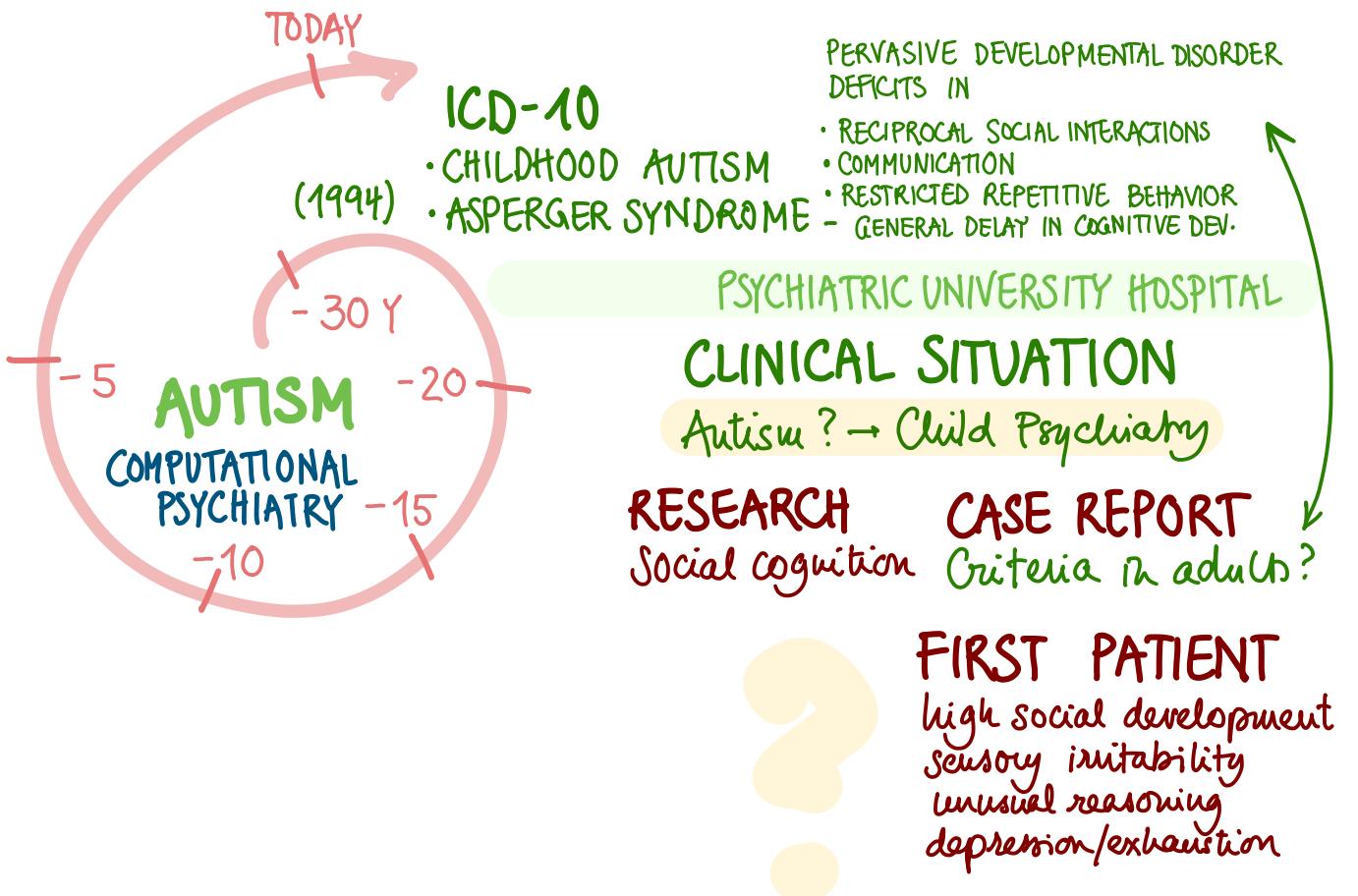
OPEN PROBLEMS
How to explain
"exceptions"
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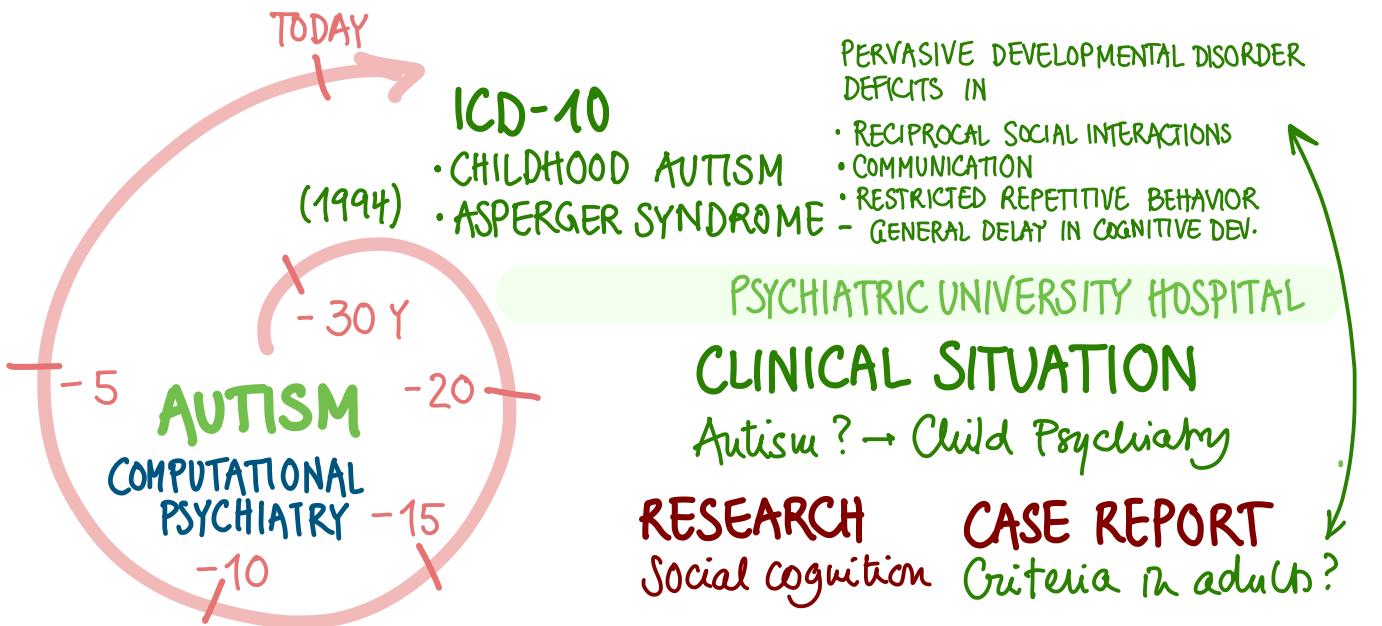
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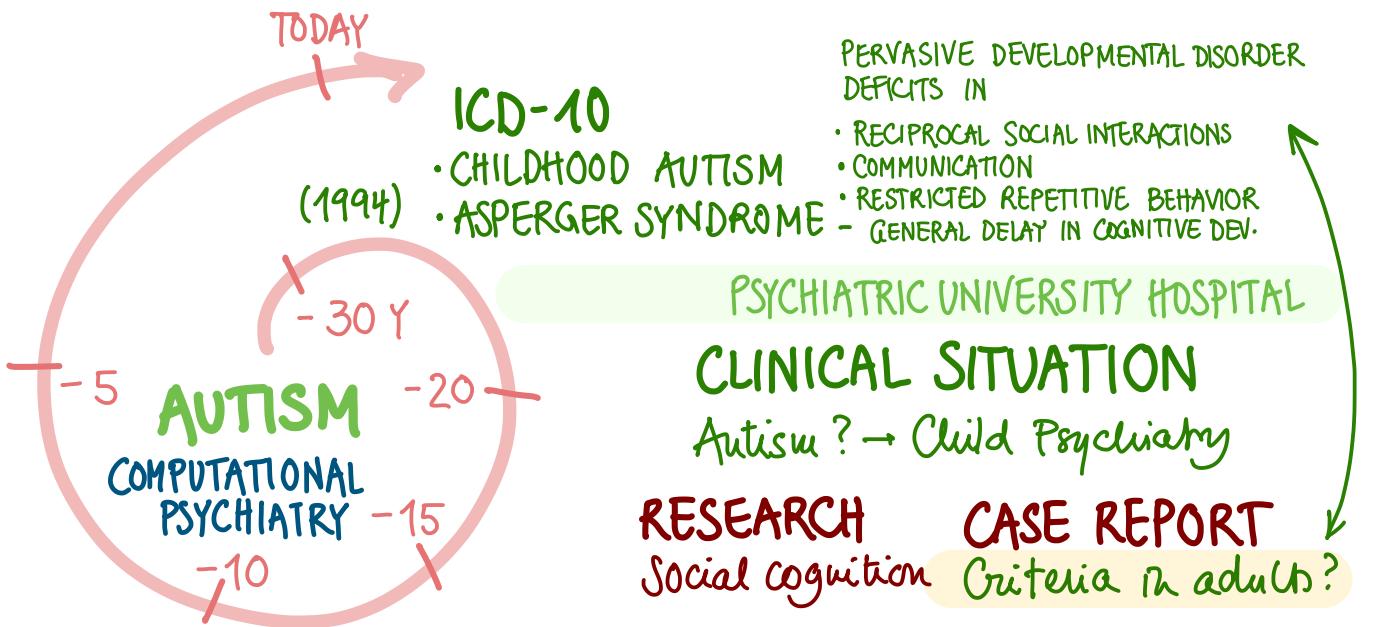






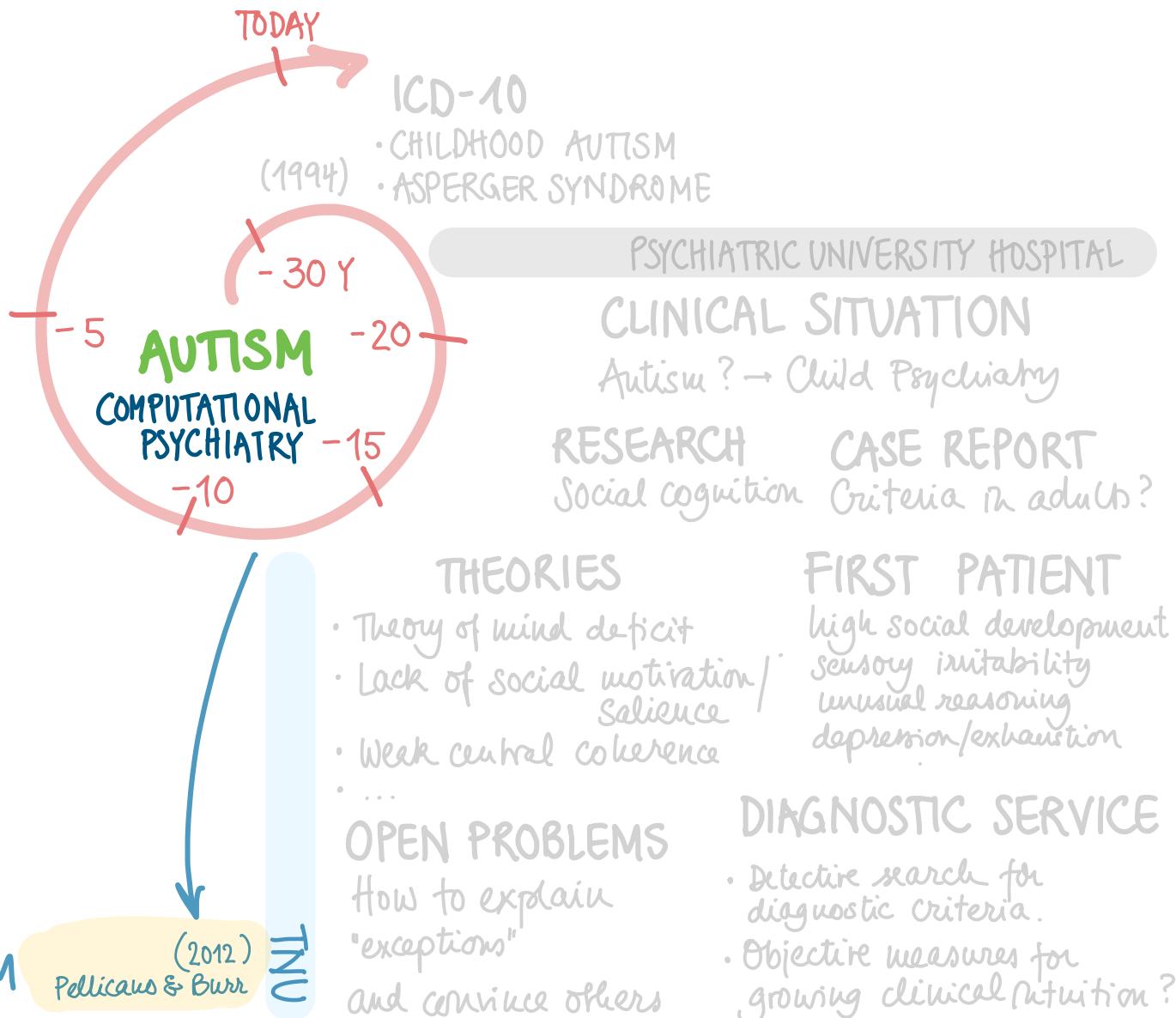
DIAGNOSTIC SERVICE

- Detective search for diagnostic criteria.
- Objective measures for growing clinical intuition?



How to explain
"exceptions"
and convince others

BAYESIAN BRAIN THEORY OF AUTISM



TICS, 2012

When the world becomes 'too real': a Bayesian explanation of autistic perception

Elizabeth Pellicano^{1,3} and David Burr^{2,3}

¹ Centre for Research in Autism and Education (CRAE), Institute of Education, University of London, London, UK

² Department of Psychology, University of Florence, Florence, Italy

³ School of Psychology, University of Western Australia, Perth, Australia

Perceptual experience is influenced both by incoming sensory information and prior knowledge about the world, a concept recently formalised within Bayesian decision theory. We propose that Bayesian models can be applied to autism – a neurodevelopmental condition with atypicalities in sensation and perception – to pinpoint fundamental differences in perceptual mechanisms. We suggest specifically that attenuated Bayesian priors – 'hypo-priors' – may be responsible for the unique perceptual experience of autistic people, leading to a tendency to perceive the world more accurately rather than modulated by prior experience. In this account, we consider how hypo-priors might explain key features of autism – the broad range of sensory and other non-social atypicalities – in addition to the phenomenological differences in autistic perception.

Introduction

Autism is a heritable, lifelong neurodevelopmental condition that has its most striking effects on social communication – the so-called social symptoms (see Glossary). Yet, the condition is also defined by a less well-researched range of non-social symptoms. These symptoms present throughout development, are prevalent in autistic individuals regardless of intellectual ability, and vary widely from an intense desire for sameness (such as following rigid routines) and sensory atypicalities (such as extreme sensitivity to fluorescent lighting or to the sound of the school bell) to remarkable talents (such as an excellent eye for detail).

These symptoms feature prominently in the draft changes to the forthcoming diagnostic guidelines for autism in the Diagnostic and Statistical Manual of Mental Disorders 5 (<http://www.dsm5.org/proposedrevisions/pages/proposedrevision.aspx?rid=94>), but the range and idiosyncrasy of sensory atypicalities, in particular, still represent some of the most puzzling features of autism. They include not only hypersensitivity to incoming stimuli, but also hyposensitivity to stimuli and sensory seeking behaviours, such as attraction to light, intense looking at objects, and fascination with brightly coloured objects [1,2]. Indeed, they often oscillate between these states within the same individual. They can also have catastrophic effects on the lives of autistic people. As Donna Williams reports first hand: 'the

sensory overload caused by bright lights, fluorescent lights, colours, and patterns makes the body react as if being attacked or bombarded, resulting in such physical symptoms as headaches, anxiety, panic attacks or aggression' [3], p. 43.

There has been renewed research interest in these sensory symptoms, prompted in part by the possibility that the non-social symptoms of autism might be attributable to fundamental differences in sensation and perception [4–9]. In this article, we propose a new account of the sensory and other non-social symptoms of autism, which we believe provides a parsimonious explanation for such atypicalities. We argue that people with autism see the world more accurately – as it really is – as a consequence of being less biased by prior experiences.

We start with the suggestion that it is not sensory processing itself that is different in autism, but the interpretation of sensory input to yield percepts. We further propose that Bayesian decision theory, a principled description of the processes that enable observers to derive the most probable interpretations of their environment (Box 1), provides a powerful tool to study the mechanisms underlying the diverse range of non-social features in autism. Such computational methods should formalise the process of generating experimentally testable hypotheses about the underlying functional atypicalities in autistic perception. Specifically we suggest that atypicalities

Glossary

Adaptation: a dynamic process in which neural sensitivity is continuously recalibrated to 'match' the characteristics of the current environment.

Aftereffect: the perceptual distortions that arise following lengthy exposure or 'adaptation' to a stimulus.

Autism: autism spectrum disorders are a set of common, lifelong neurodevelopmental conditions defined in terms of the presence of difficulties in social communication and social interaction, and a range of restricted, repetitive patterns of behaviour, interests, or activities, including sensory sensitivities.

Hypo-priors: a term we use to describe attenuated prior knowledge in autism, which would be represented as a broad prior probability distribution.

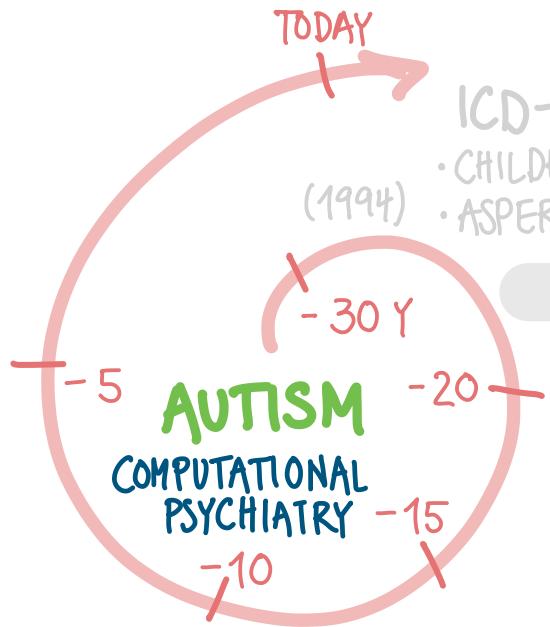
Likelihood: the function specifying the probability $p(x|y)$ of observing a particular stimulus x for each possible state of the environment y .

Non-social symptoms: the range of autistic symptoms including restricted, repetitive patterns of behaviour, interests, or activities, and sensory sensitivities, which are relatively non-social in nature and content.

Posterior: the probability distribution $p(y|x)$ produced by probabilistic inference according to a particular probabilistic model of the environment.

Prior: the probability distribution $p(y)$ defining the expectation about the environment being in any of its possible states, y , before any observation is available.

Corresponding author: Pellicano, E. (l.pellicano@ioe.ac.uk)



CLINICAL SITUATION
Autism? → Child Psychiatry

RESEARCH Social cognition **CASE REPORT** Criteria in adults?

- THEORIES**
- Theory of mind deficit
 - Lack of social motivation / Salience
 - Weak central coherence
 - ...
- FIRST PATIENT**
- high social development
 - sensory irritability
 - unusual reasoning
 - depression/exhaustion
- DIAGNOSTIC SERVICE**
- Detective search for diagnostic criteria.
 - Objective measures for growing clinical intuition?
- OPEN PROBLEMS**
- How to explain "exceptions" and convince others

INFERENCE MACHINE

Maintain integrity
GOAL: HOMEOSTASIS

MIND
BODY

BAYESIAN BRAIN THEORY OF AUTISM

(2012)
Pellicano & Burr

TNU

matures through implicit learning

HIERARCHICAL MENTAL MODEL

Represents most likely causes behind observations

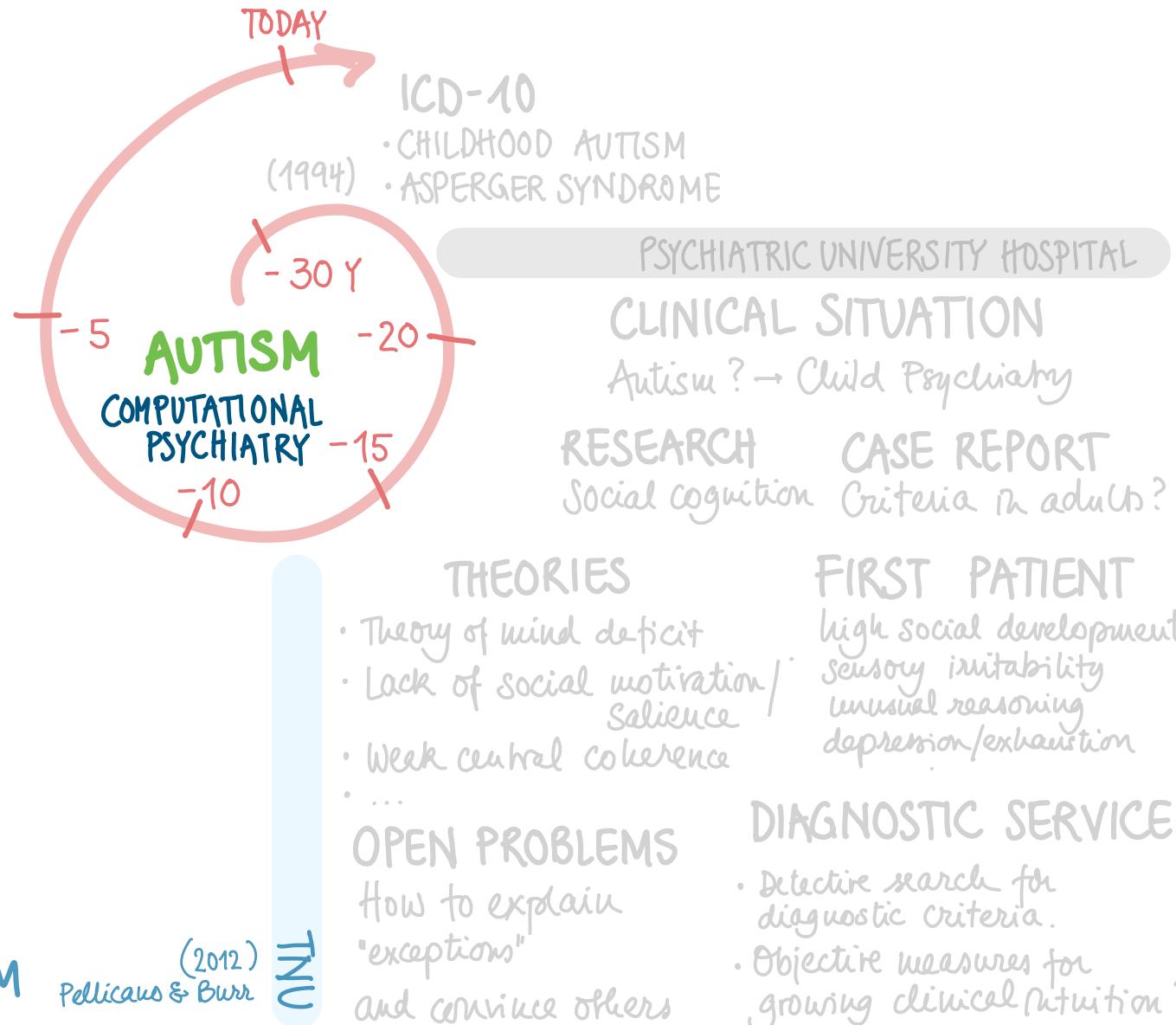
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expectations about sensory inputs
minimize surprise

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DYS-

expectations about sensory inputs

minimize surprise

Constant

→ STRESS!

SIGNAL/NOISE

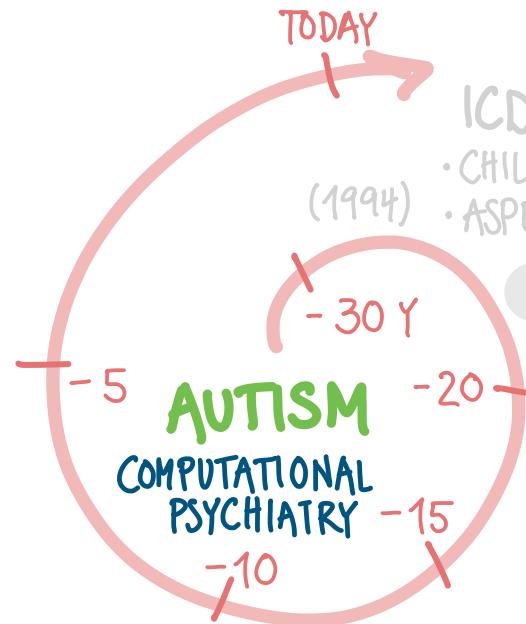
SUBOPTIMAL FINE TUNING

{ MIND
BODY }

overweighting sensory input vs. prior belief

(2012)
Pellicano & Burr

BAYESIAN BRAIN THEORY OF AUTISM



ICD-10
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• ASPERGER SYNDROME

PSYCHIATRIC UNIVERSITY HOSPITAL

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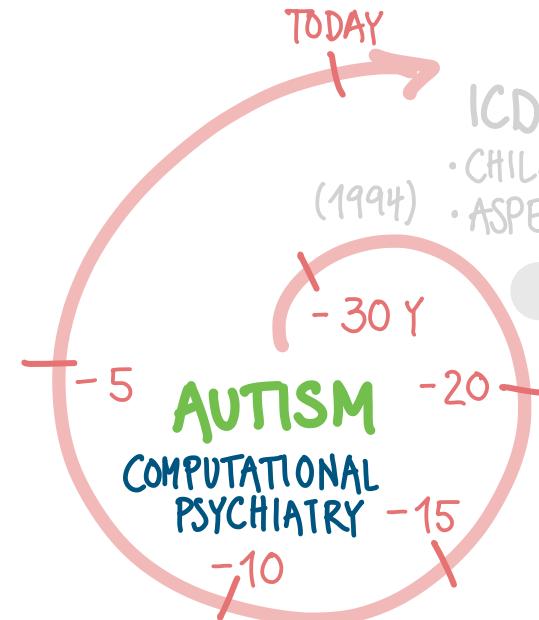
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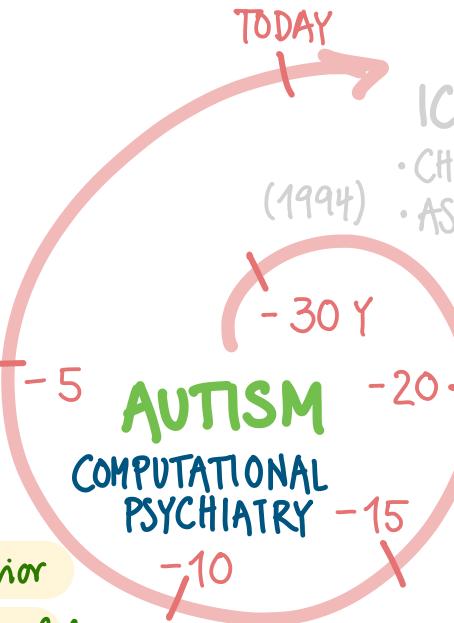
- repetitive behavior
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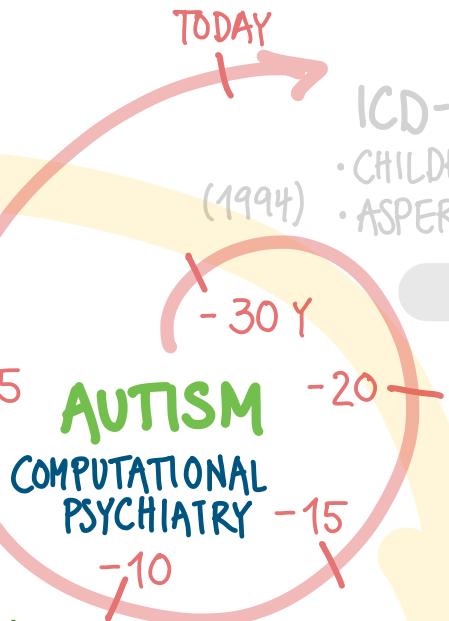
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(2012)
Pellicano & Burr

TNU



2016

Can Bayesian Theories of Autism Spectrum Disorder Help Improve Clinical Practice?

Helene Haker^{1*}, Maya Schneebeli¹ and Klaas Enno Stephan^{1,2,3}

¹ Translational Neuromodeling Unit (TNU), Institute for Biomedical Engineering, University of Zurich and ETH Zurich, Zurich, Switzerland, ² Wellcome Trust Centre for Neuroimaging, University College London, London, UK, ³ Max Planck Institute for Metabolism Research, Cologne, Germany

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Improve Clinical Practice?
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doi: 10.3389/fpsy.2016.00107

Diagnosis and individualized treatment of autism spectrum disorder (ASD) represent major problems for contemporary psychiatry. Tackling these problems requires guidance by a pathophysiological theory. In this paper, we consider recent theories that re-conceptualize ASD from a "Bayesian brain" perspective, which posit that the core abnormality of ASD resides in perceptual aberrations due to a disbalance in the precision of prediction errors (sensory noise) relative to the precision of predictions (prior beliefs). This results in percepts that are dominated by sensory inputs and less guided by top-down regularization and shifts the perceptual focus to detailed aspects of the environment with difficulties in extracting meaning. While these Bayesian theories have inspired ongoing empirical studies, their clinical implications have not yet been carved out. Here, we consider how this Bayesian perspective on disease mechanisms in ASD might contribute to improving clinical care for affected individuals. Specifically, we describe a computational strategy, based on generative (e.g., hierarchical Bayesian) models of behavioral and functional neuroimaging data, for establishing diagnostic tests. These tests could provide estimates of specific cognitive processes underlying ASD and delineate pathophysiological mechanisms with concrete treatment targets. Written with a clinical audience in mind, this article outlines how the development of computational diagnostics applicable to behavioral and functional neuroimaging data in routine clinical practice could not only fundamentally alter our concept of ASD but eventually also transform the clinical management of this disorder.

Keywords: autism spectrum disorder, Asperger syndrome, translational research, diagnostic tests, generative modeling, Bayesian inference, Bayesian models, neuroimaging

INTRODUCTION

An important precondition for successful translation of basic scientific theories into clinical applications is the knowledge of the most pressing unresolved problems in clinical practice. The care for affected individuals can only be improved effectively if these priority problems are identified and used to guide the design of scientific studies. In heterogeneous disorders, such as autism spectrum disorder (ASD), cross-sectional comparisons of patients vs. controls may provide coarse contours of some characteristics of the spectrum, but are usually not sufficient to inform changes in clinical practice (1).

develop an individual mental model
of another (autistic) mind

AUTISM AS A CONGENITAL INFORMATION INTEGRATION DISORDER

QUALITATIVE APPLICATION OF THE THEORY

PRIVAT PRACTICE

POTENTIAL

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- development of quantitative models + objective tests

matures through
implicit learning

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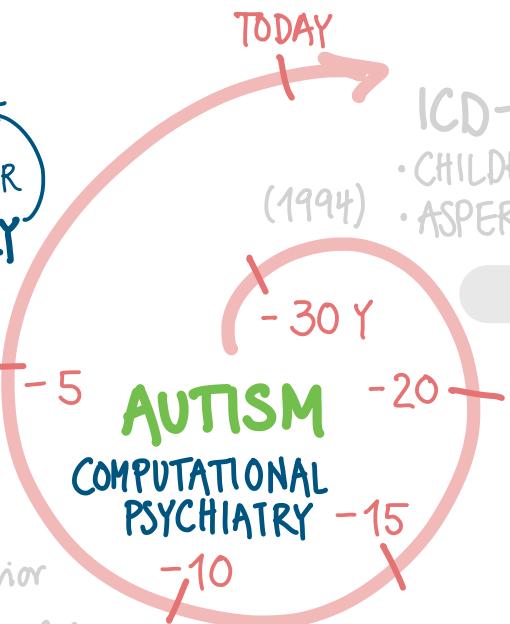
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MIND BODY ↑

BAYESIAN BRAIN THEORY OF AUTISM



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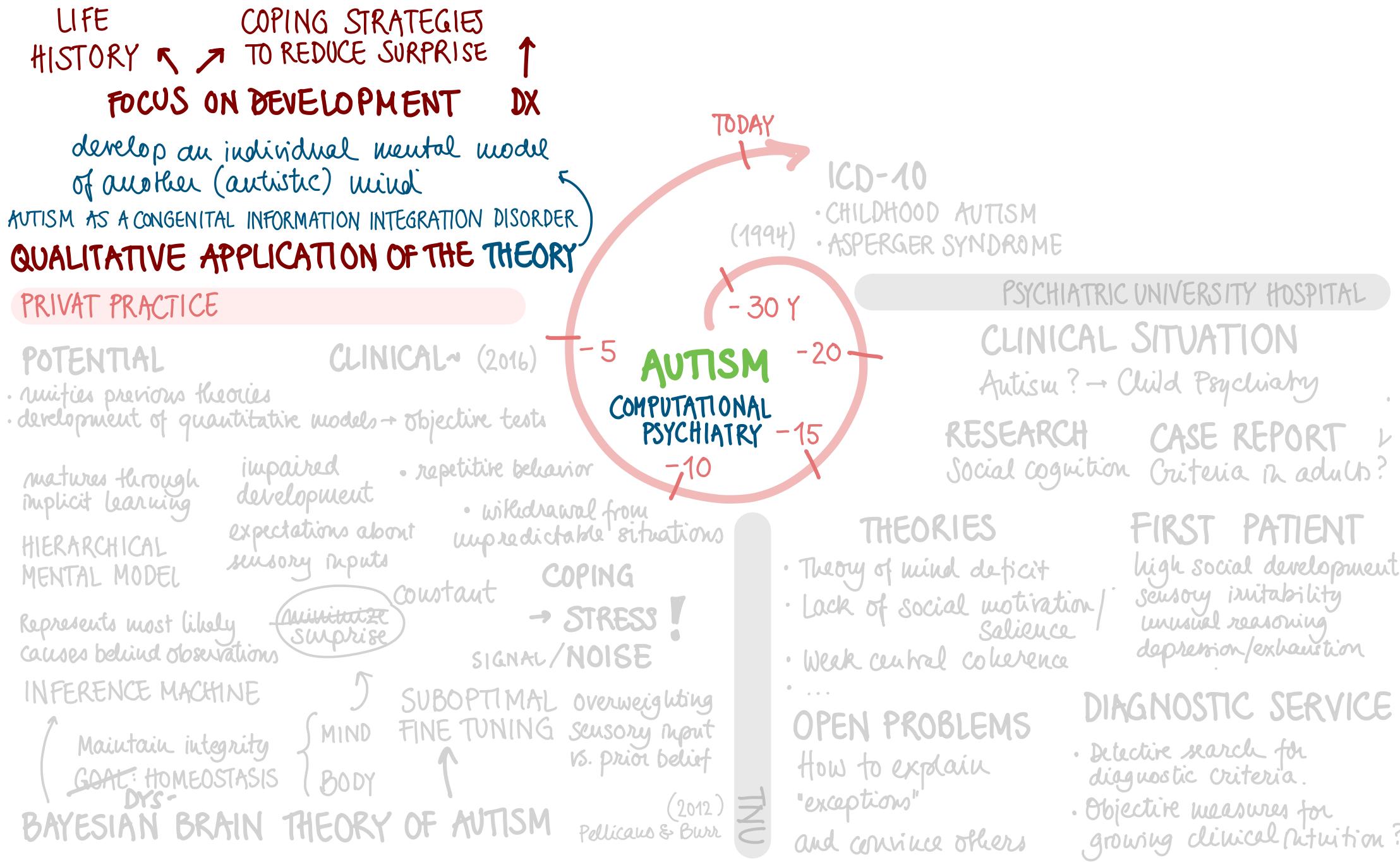
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REPETITION

increase stability
in the exterior
(behaviorally)

REFLECTION

increase order
in the interior
(mentally)

TX



LIFE HISTORY ↘ ↗ COPING STRATEGIES TO REDUCE SURPRISE
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TODAY

(1994)

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PSYCHIATRIC UNIVERSITY HOSPITAL

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PERVERSIVE DEVELOPMENTAL DISORDER
DEFICITS IN

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6A02 Autism spectrum disorder

Foundation URL: <http://id.who.int/icd/entity/437815624>

Code: 6A02

Description

*previous
characteristics*

Autism spectrum disorder is characterised by persistent deficits in the ability to initiate and to sustain reciprocal social interaction and social communication, and by a range of restricted, repetitive, and inflexible patterns of behaviour, interests or activities that are clearly atypical or excessive for the individual's age and sociocultural context. The onset of the disorder occurs during the developmental period, typically in early childhood, but symptoms may not become fully manifest until later, when social demands exceed limited capacities. Deficits are sufficiently severe to cause impairment in personal, family, social, educational, occupational or other important areas of functioning and are usually a pervasive feature of the individual's functioning observable in all settings, although they may vary according to social, educational, or other context. Individuals along the spectrum exhibit a full range of intellectual functioning and language abilities.

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BAYESIAN BRAIN THEORY OF AUTISM

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NEW CLINICAL PROBLEM

"autism" as ↘ congenital disorder
acquired state ?

highly individual mental model
with little connections to others

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-30 Y -5 0 +5 +20 +15 +10 -5 -10 -15 -20
AUTISM COMPUTATIONAL PSYCHIATRY

- impaired development
 - repetitive behavior
 - withdrawal from unpredictable situations
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→ STRESS !
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(2012)
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