

Terugval voorspellen om te voorkomen: Break-out sessie 7

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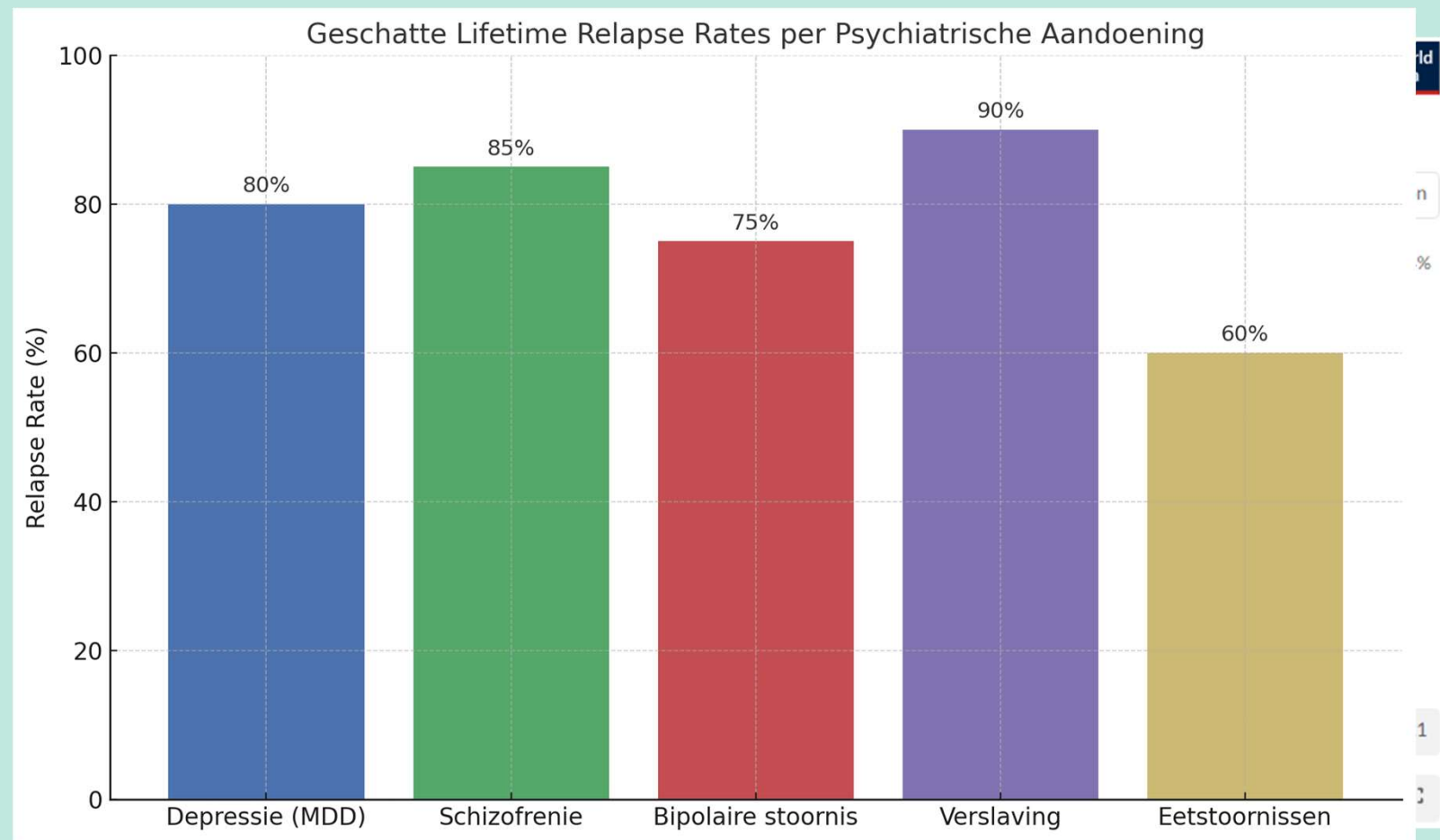
Disclosure slide

(potentiële) belangenverstrengeling	Geen
Voor bijeenkomst mogelijk relevante relaties met bedrijven	n.v.t.
• Sponsoring of onderzoeksgeld • Honorarium of andere (financiële) vergoeding • Aandeelhouder • Andere relatie, namelijk ...	n.v.t.

Wie zijn jullie, waar
zijn jullie werkzaam?



Prevalentie



Beloop

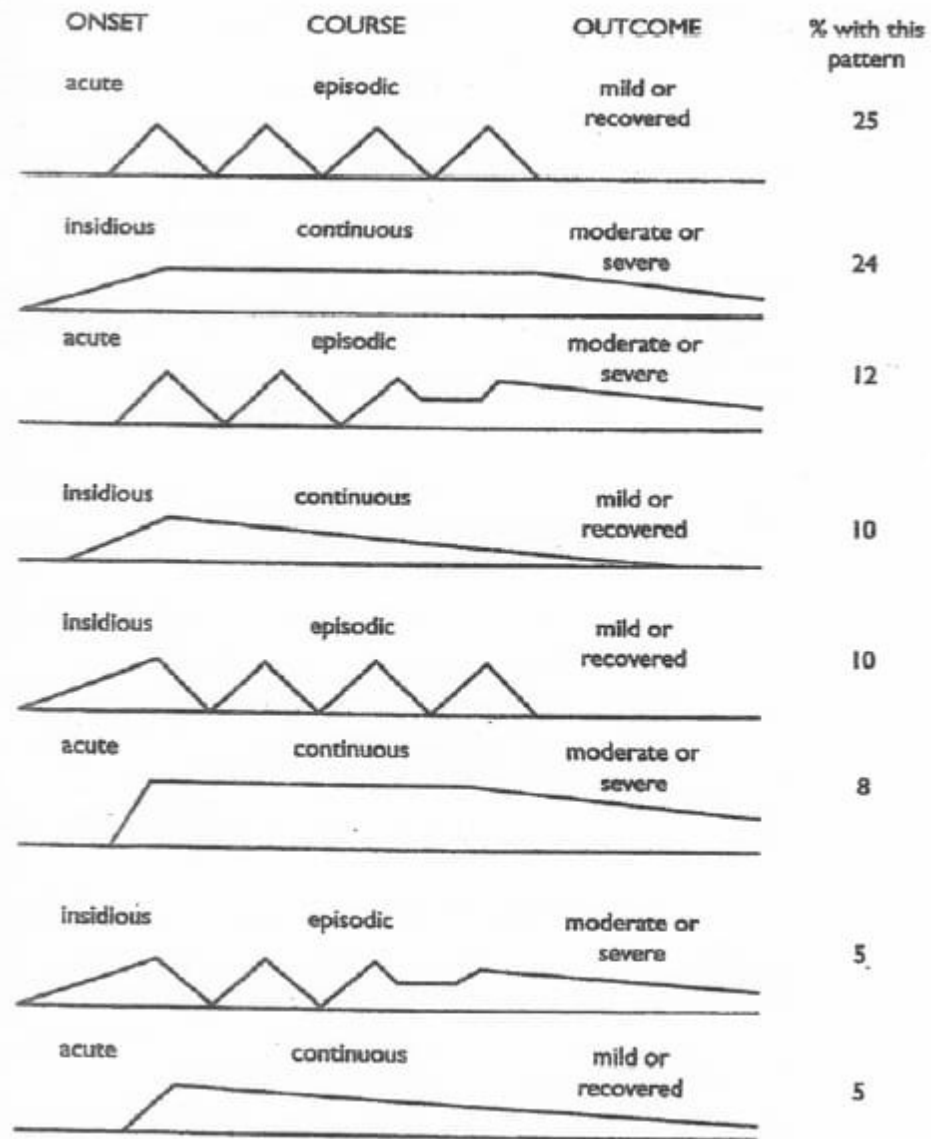
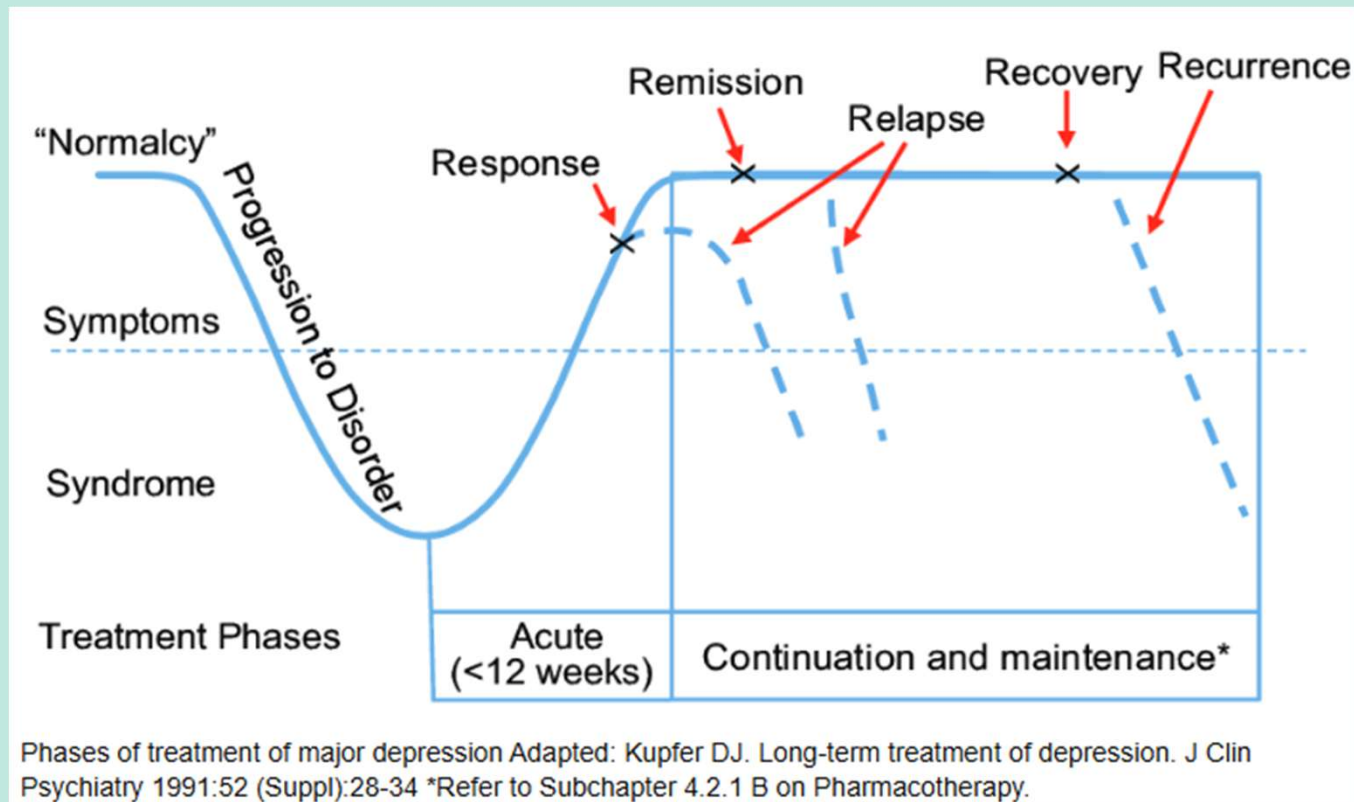


Figure 1.2 The long-term course of schizophrenia in 228 patients
Source: Ciompi (1980)

Relapse versus recurrence



Psychose

Hallucinaties

Wanen

Gedesorganiseerd spraak & gedrag



Eerste psychose

Prevalentie $\pm$ 34 per 100.000 persoonsjaren

Gemiddelde leeftijd: ♂30 ♀33

Schizofrenie

Positieve symptomen

Hallucinaties, wanen, gedesorganiseerde spraak

Negatieve symptomen

Spraakarmoede, motivatieproblemen, weinig initiatief en gevoelens

Cognitieve symptomen

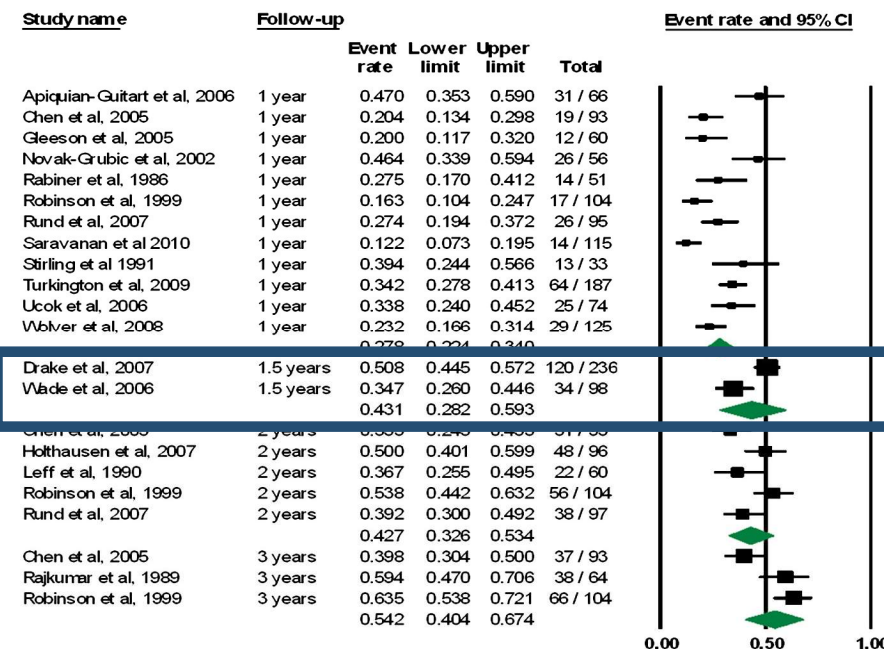
Problemen met concentratie en planning

Psychotische terugval

43% ervaart een terugval binnen 1.5 jaar na remissie van eerste psychose

Psychotische terugval is gelinkt aan

- verslechterde cognitie
- verminderd sociaal functioneren
- slechtere klinische prognose



Gepoolde prevalentie van terugval van positieve symptomen na eerste psychotische episode

Alvarez-Jimenez et al. 2012

Vooruit zien

Predictiemodellen:

- Data
- Analyses/algoritmes
- Klinische kennis

Data bronnen:

- Klinische gegevens
- Spraak
- EPD
- Bloed / medische beeldvorming
- Smartphone/wearables



Hoe kijken jullie
aan tegen
voorspellen als
vorm van
preventie?



Vooruit zien

Predictiemodellen:

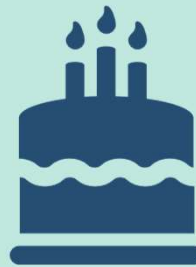
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Data bronnen:

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Klinische predictiemodellen



Spraak en psychiatrie?

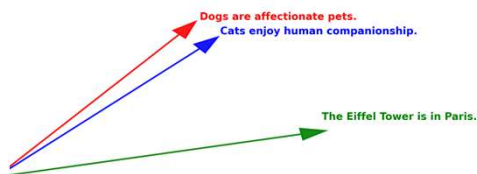
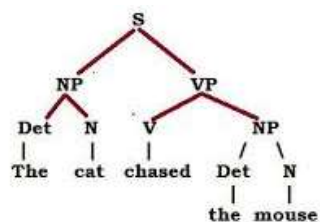
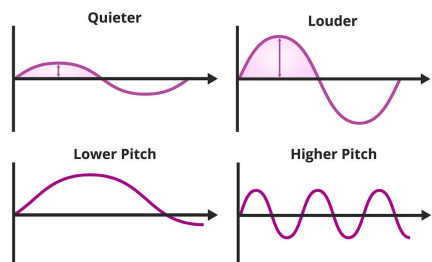
DSM-5 Criteria for Schizophrenia

- Two or more of these symptoms must be present for at least one month (can be less if being successfully treated)
And at least one symptom must be either (1), (2), or (3)
 - (1) Hallucinations
 - (2) Delusions (can be either bizarre or nonbizarre)
 - • (3) Disorganized speech (e.g., frequent derailment or incoherence)
 - (4) Grossly disorganized or catatonic behavior
 - • (5) Negative symptoms (e.g., affective flattening, alogia or avolition).
- Continuous disturbance for 6 months (attenuated symptoms, residual symptoms)
- Social or occupational dysfunction (or both) for significant portion of the time
- Notes: Catatonia can also be used as a specifier for any other diagnosis

Clinici bepalen symptomen mede middels taal!

Spraak en taal-metingen

Sound Waves



Acoustic-Prosodic Analysis: Intonation, Pauses, Loudness

Syntactic Analysis: Sentence structure and complexity

Semantic Similarity Analysis: Conceptual organization, often referred to as 'coherence'

Sentiment Analysis: Emotional Valence (positive, negative, neutral)



Toepassing van spraak en taal-analyses

- Predicting **symptom severity**
(Holmlund et al., 2020, Liebenthal et al., 2023)
- Identifying **transition** to psychosis in high-risk individuals
(Morgan et al., 2021, Spencer et al., 2021)
- Supporting (differential) **diagnosis**
(Mota et al., 2014, Olah et al., 2024)
- Assessing substance use and relapse risk
(Ahuia, 2025, Zaher et al., 2024)





The Trusting project has received funding from the European Union's Horizon Europe research and innovation programme under grant agreement No 101080251.



TRUSTING

Develop a user-friendly, trustworthy speech-based tool for the prediction of relapse in psychosis

www.trusting-project.eu

Relapse prediction: speech models can predict relapse based on primarily acoustic information with **73% accuracy**, up to 3 months in advance (TRUSTING, preliminary findings).

**Wat is jullie
ervaring met
predictie(modellen)
in de zorg?**



Calculation Tool

Please answer the questions below to calculate the ten-year probability of fracture with or without BMD.

Continent

Europe



Country

Netherlands



Name/ID

Identification (optional)

[About the risk factors ?](#)

Individuals with fracture risk assessed since 1st June 2011: 125,585

Questionnaire

1. Age (between 40 and 90 years)

45

2. Sex

☐ Female ☒ Male

3. Weight

kg 80

kg/cm



4. Height

cm 180

5. Previous Fracture



6. Parent Fractured Hip



7. Current Smoking



8. Glucocorticoids



9. Rheumatoid arthritis



10. Secondary osteoporosis



11. Alcohol 3 or more units/day



12. Femoral neck BMD

Select BMD

g/cm²

Calculate

Clear

Age : 45.00

BMI : 24.69

without BMD

THE TEN-YEAR PROBABILITY OF FRACTURE

Major osteoporotic

4.6 %

Hip Fracture

0.6 %

Adjust your results, try FRAX plus®

[What does FRAX plus® do? Click here](#)

Welcome to the QRISK®3-2018 risk calculator <https://qrisk.org>

This calculator is only valid if you do not already have a diagnosis of coronary heart disease (including angina or heart attack) or stroke/transient ischaemic attack, and not on statins.

About you

Age (25-84):
 Sex: ☒ Male ☐ Female
 Ethnicity:
 UK postcode: leave blank if unknown
 Postcode:

Clinical information

Smoking status:
 Diabetes status:
 Angina or heart attack in a 1st degree relative < 60? ☐
 Chronic kidney disease (stage 3, 4 or 5)? ☐
 Atrial fibrillation? ☐
 On blood pressure treatment? ☐
 Do you have migraines? ☐
 Rheumatoid arthritis? ☐
 Systemic lupus erythematosus (SLE)? ☐
 Severe mental illness?
 (this includes schizophrenia, bipolar disorder and moderate/severe depression)
 On atypical antipsychotic medication? ☐
 Are you on regular steroid tablets? ☐
 A diagnosis of or treatment for erectile dysfunction? ☐
 Leave blank if unknown
 Cholesterol/HDL ratio:
 Systolic blood pressure (mmHg):
 Standard deviation of at least two most recent systolic blood pressure readings (mmHg):
 Body mass index
 Height (cm):
 Weight (kg):

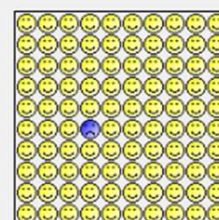
Your results

Your risk of having a heart attack or stroke within the next 10 years is:

1.3%

Note. The score is based on a cohort of patients without pre-existing cardiovascular disease and not on statins at the start. The cohort includes patients who subsequently started statins (or other lifestyle modifications). Consequently the actual risk of a patient may be more than this score implies if they do not take preventative actions. If they do take preventative actions the risk would be reduced.

In other words, in a crowd of 100 people with the same risk factors as you, 1 are likely to have a heart attack or stroke within the next 10 years.



Risk of
a heart attack or stroke

☒ Your score has been calculated using estimated data, as some information was left blank.

Your body mass index was calculated as 30.86 kg/m².

How does your 10-year score compare?

Your score

Your 10-year QRISK®3 score	1.3%
The score of a healthy person with the same age, sex, and ethnicity*	0.4%
Relative risk**	3.6
Your QRISK®3 Healthy Heart Age***	38

* This is the score of a healthy person of your age, sex and ethnic group, i.e. with no adverse clinical indicators and a cholesterol ratio of 4.0, a stable systolic blood pressure of 125, and BMI of 25.

** Your relative risk is your risk divided by the healthy person's risk.

*** Your QRISK®3 Healthy Heart Age is the age at which a healthy person of your sex and ethnicity has your 10-year QRISK®3 score.

Your entry was;

Age: **30**

Gender: **Male**

Ethnicity: **Asian**

Diagnosis Category: **Acute and transient psychotic disorders**

Diagnosis Name: **Acute and transient psychotic disorders**

Calculation is:

Prognostic Index (PI): **2.054**

Risk of psychosis at 1 year: **20.2% (1:5)**

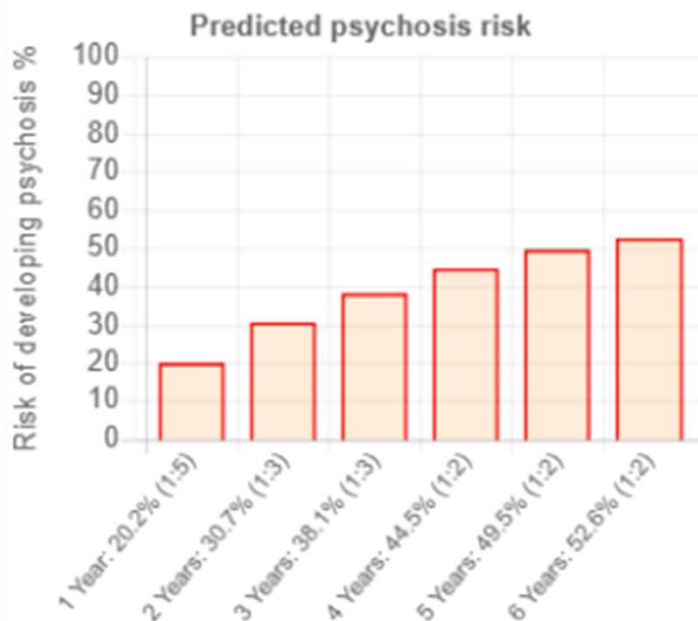
Risk of psychosis at 2 years: **30.7% (1:3)**

Risk of psychosis at 3 years: **38.1% (1:3)**

Risk of psychosis at 4 years: **44.5% (1:2)**

Risk of psychosis at 5 years: **49.5% (1:2)**

Risk of psychosis at 6 years: **52.6% (1:2)**



The risk calculator was validated in individuals accessing secondary mental health care and diagnosed by mental health professionals according to the ICD-10 or the CAARMS 12/2006. Therefore, the tool is not usable under other circumstances.

www.psychosis-risk.net

Hoe vinden jullie
deze sites eruit
zien?

Your entry was;

Age: **30**
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Ethnicity: **Asian**
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Praktijkvoorbeeld:
Hoe groot is de kans
dat iemand
psychose-vrij blijft?

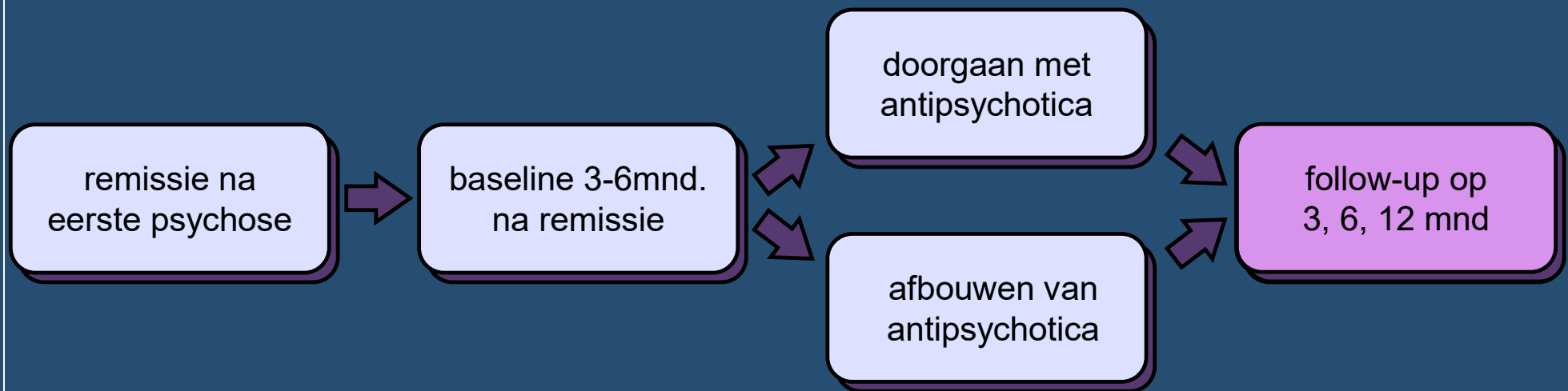




Voorspellen van
psychotische terugval
binnen 1.5 jaar na remissie
van eerste psychose

HAMLETT

Antipsychotica doorgaan vs. afbouwen
in eerste psychose patiënten na remissie



Terugval



Hospitalisatie



Klinisch oordeel



Toename ≥ 12 punten op
PANSS totaalscore



Scientific optimal model

Develop prognostic models with all available predictors to assess optimal performance



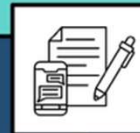
Discussions with psychiatrists

Identify with psychiatrists which measures could be obtained in a single consult



Models with predictors that can be obtained in 1 consult

Develop prognostic models with predictors that may be obtained in a single consult



Clinically applicable models with only 10 predictors

Clinically feasible models with only 10 predictors would take max. ±30 minutes to complete



HAMLETT

Antipsychotica doorgaan vs. afbouwen
in eerste psychose patiënten na remissie



medicatie



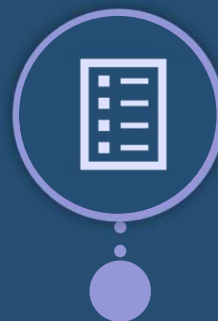
cognitie



psychotische
symptomen



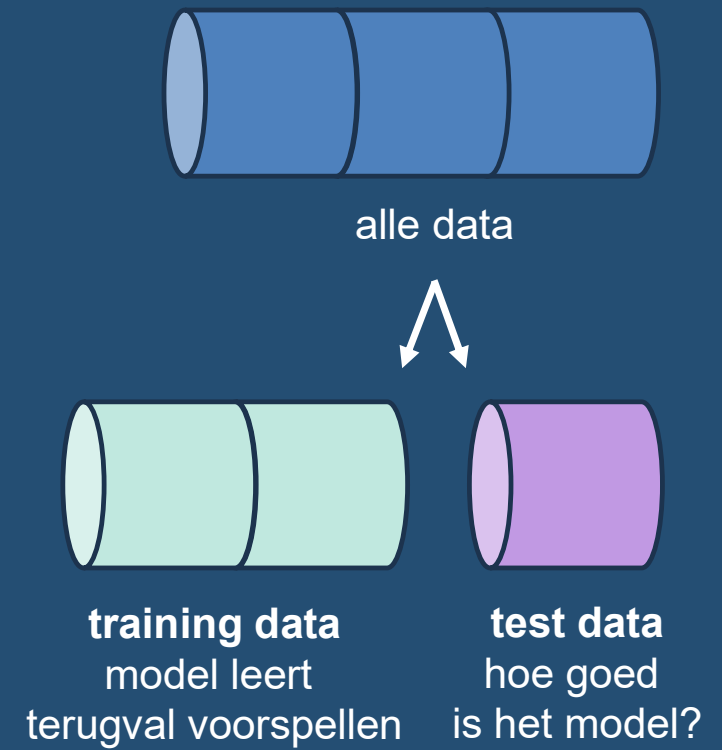
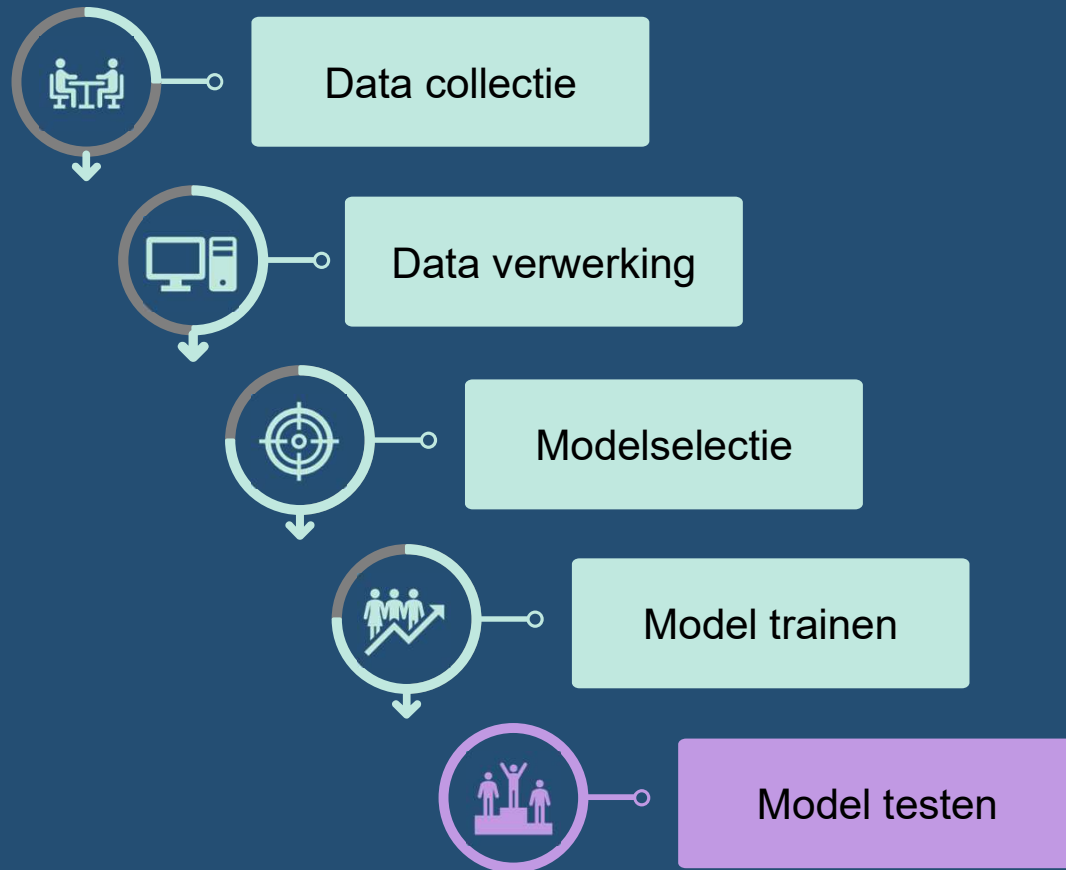
functioneren
sociaal & werk



bijwerkingen



lichamelijke
gezondheid



Modellen vergelijken



LASSO



XGB 



**Wat zijn jullie
eerste gedachten
bij dit
predictiemodel
voor psychotische
terugval?**



Hoe zou jij dit predictiemodel gebruiken?

- Voor wie?
- Wanneer?
- Hoe veel tijd heb je ervoor?
- (Hoe) bespreek je het risico?
- Hoe handel je naar het risico?



Uitdagingen



Wat is nodig om predictie echt werkbaar te maken in de praktijk?

- Welke barrières?
- Ethische vraagstukken?



Met dank aan



Vragen?

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- Illustration by Vladyslav Bobuskyi (conclusion slide)