

# WELKOM!!

Wetenschapsdag 2024



## Digitale analyse van het nierbiопt met kunstmatige intelligentie: wat hebben we geleerd van het DEEPGRAFT project?

- Spreker : Jesper Kers

Aanvang: 13:00 uur



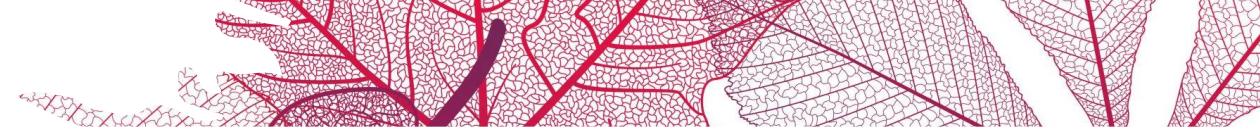
CSL Vifor



# Nierbiopten beoordelen met behulp van AI biedt uitkomst!

Jesper Kers, MD, PhD  
Nierpatholoog Amsterdam UMC, Leiden UMC  
Amsterdam, The Netherlands





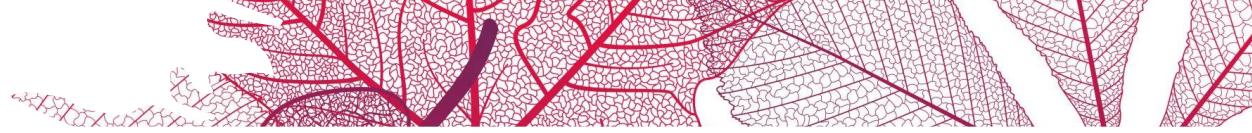
# Programma

Tour door de nierpathologie

Wat is kunstmatige intelligentie (AI) en waarom is dit nuttig?

Resultaten Nierstichting project DEEPGRAFT

Leuk die AI, maar wat nu?



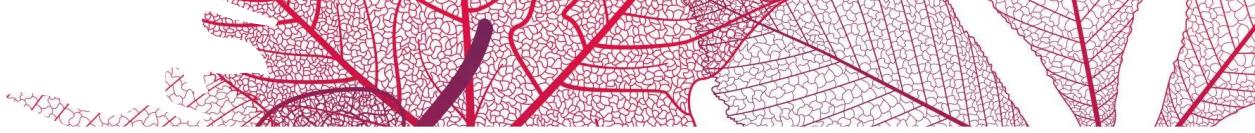
**Opleiding geneeskunde** AMC-UvA

**Promotie onderzoek** AMC, Sorbonne Parijs, Vrije Universiteit Brussel

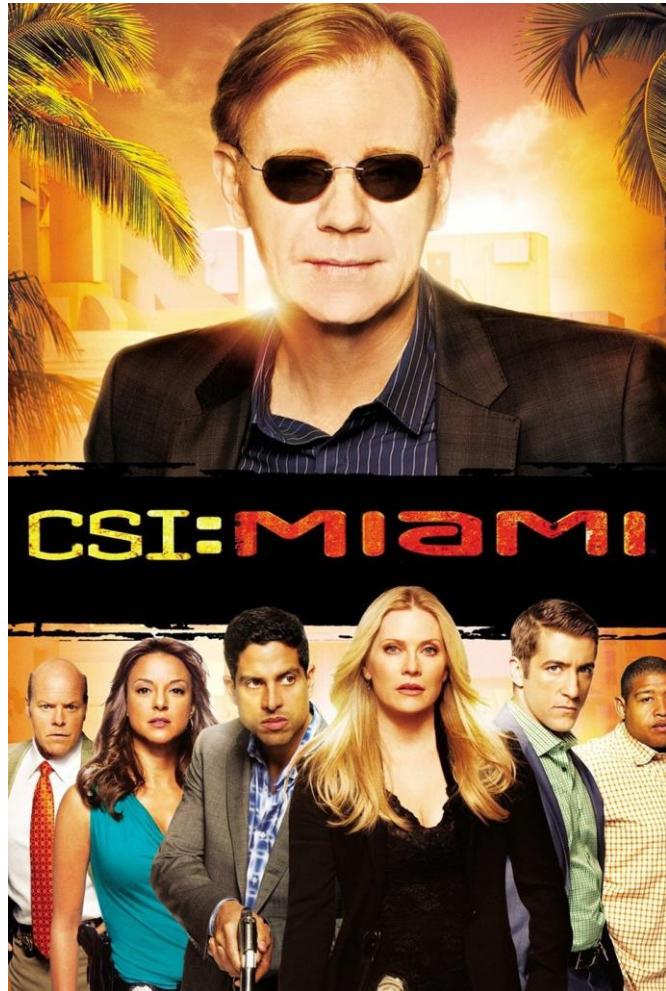
**Opleiding patholoog** Amsterdam UMC, differentiatie immunologie en AI  
Harvard/MIT Boston

**Nierpatholoog** Amsterdam UMC, Leiden UMC

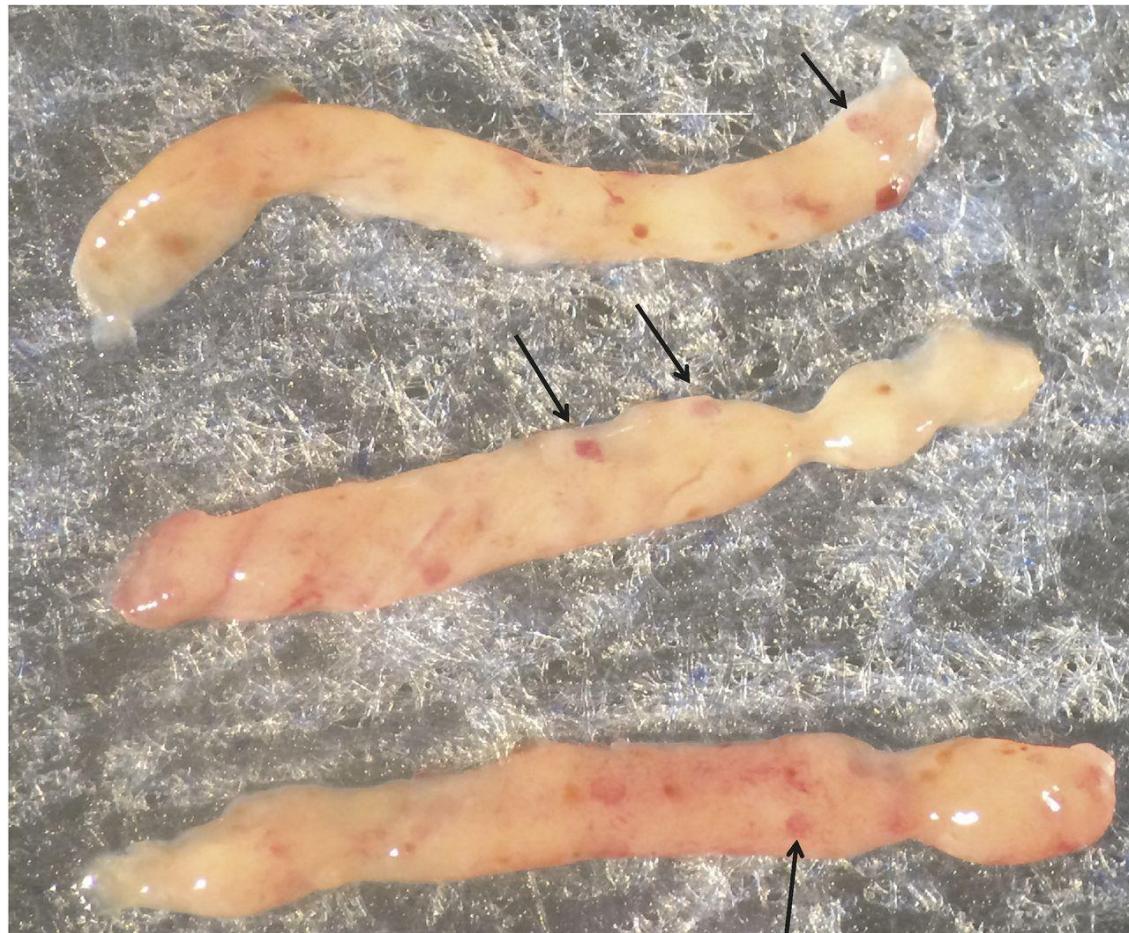
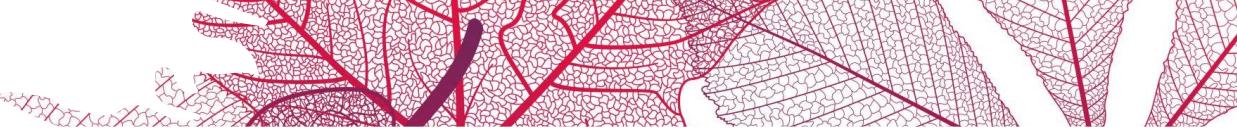
**Groepsleider** AUMC/LUMC 10 PhD studenten

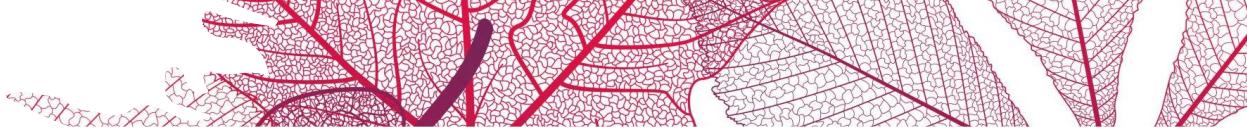


# De patholoog





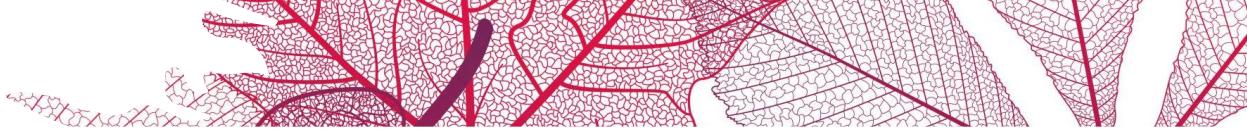


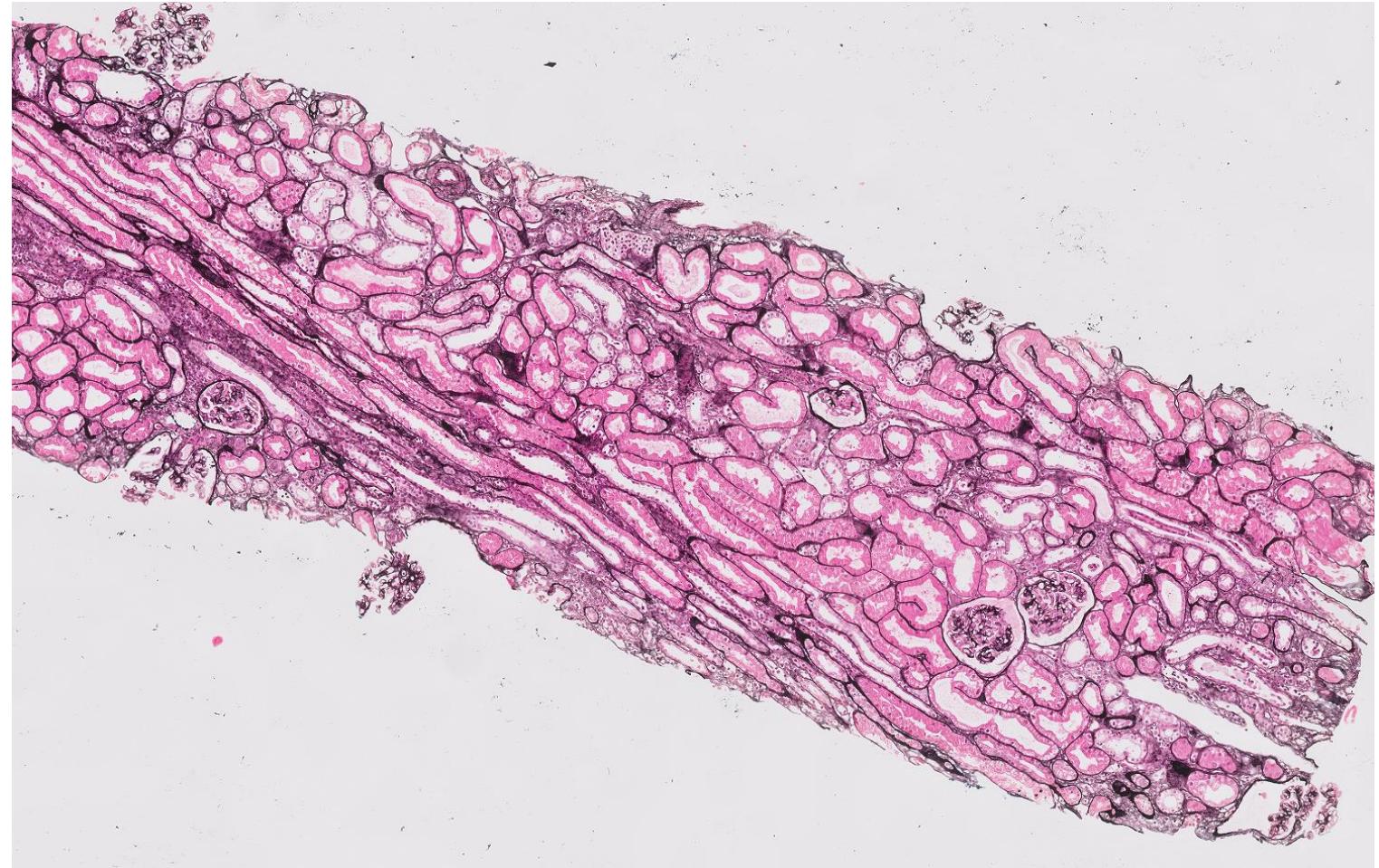
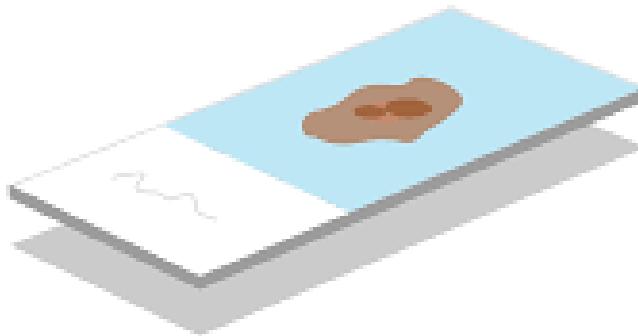
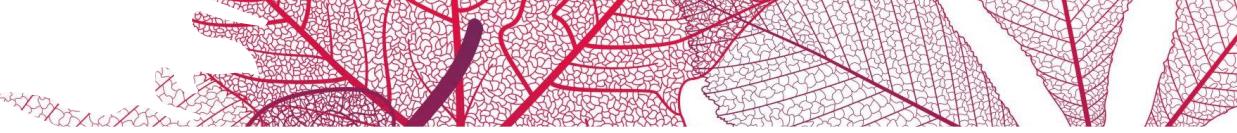


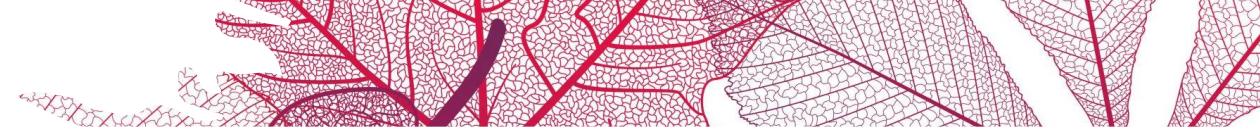
Formaline + paraffine (kaarsvet)



Vloeibare stikstof (-180 gr C)

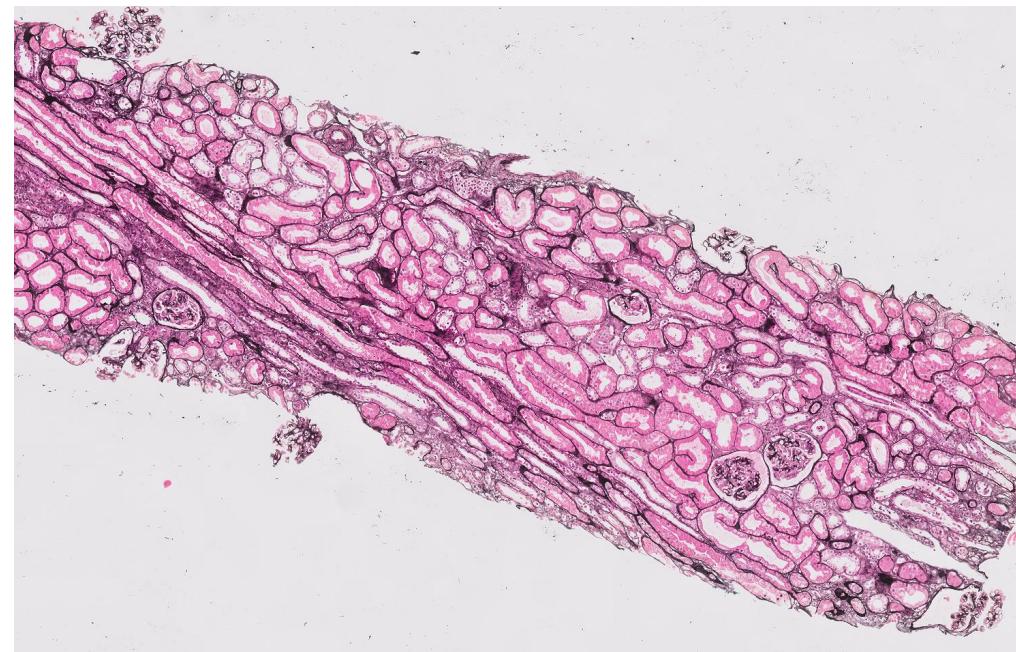
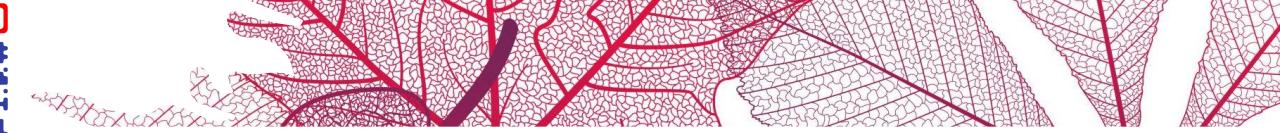






**Patholoog** = patronen van ziekte herkennen

Combinatie patronen + klinische interpretatie = diagnose



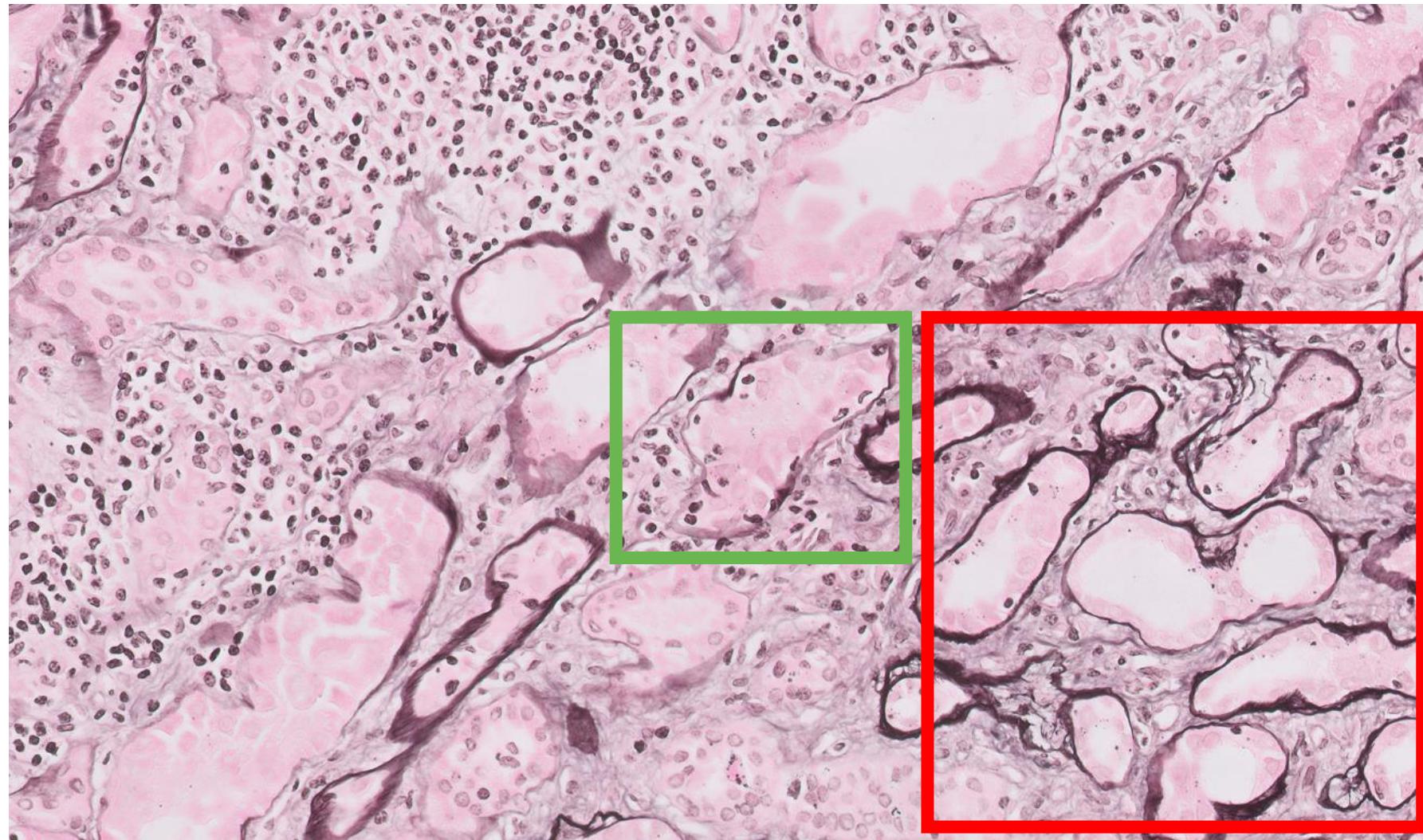
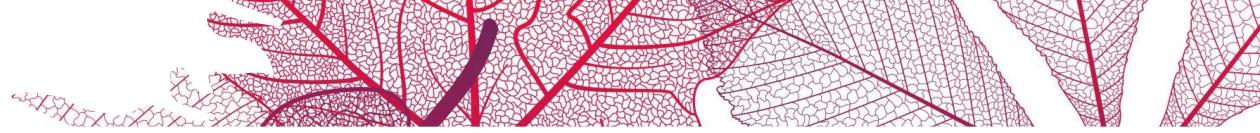
Patronen van ziekte herkennen

Ontsteking

Litteken of schade

Infecties

Toxiciteit



Ontsteking

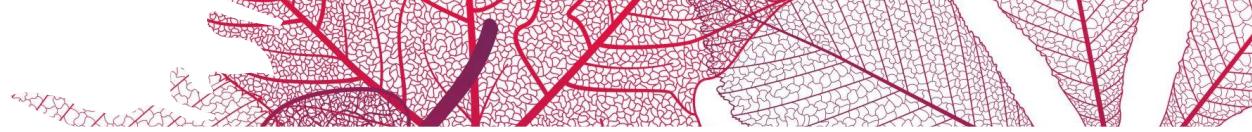
Litteken of schade

Infecties

Toxiciteit

Ernst afwijking?

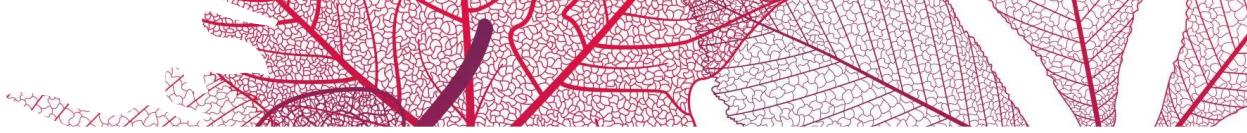
Hoe uitgebreid?



**TABLE 2.** Comparison of kappa values achieved before and after the initiation of graphical performance feedback

	Before	After	Change	p value
Acute glomerulitis	0.193	0.193	0.000	0.980
Arteriolar hyaline	0.233	0.221	-0.012	0.922
Interstitial fibrosis grade	0.306	0.249	-0.057	0.348
Intimal arteritis	0.327	0.415	0.088	0.494
Intimal thickening grade	0.360	0.333	-0.027	0.820
Mononuclear infiltration grade	0.320	0.391	0.071	0.224
Tubular atrophy grade	0.314	0.213	-0.101	0.196
Tubulitis	0.160	0.279	0.119	0.056

0 = geen overeenstemming  
1 = volledige overeenstemming



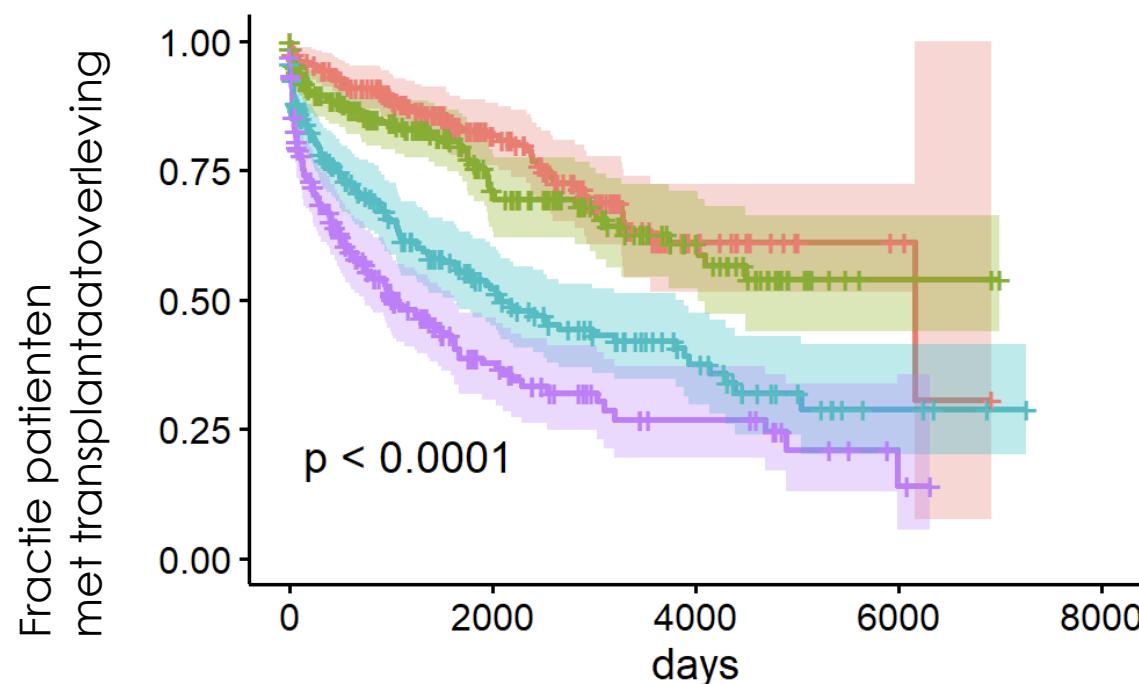
## Mate van overeenstemming is relevant voor de patient!

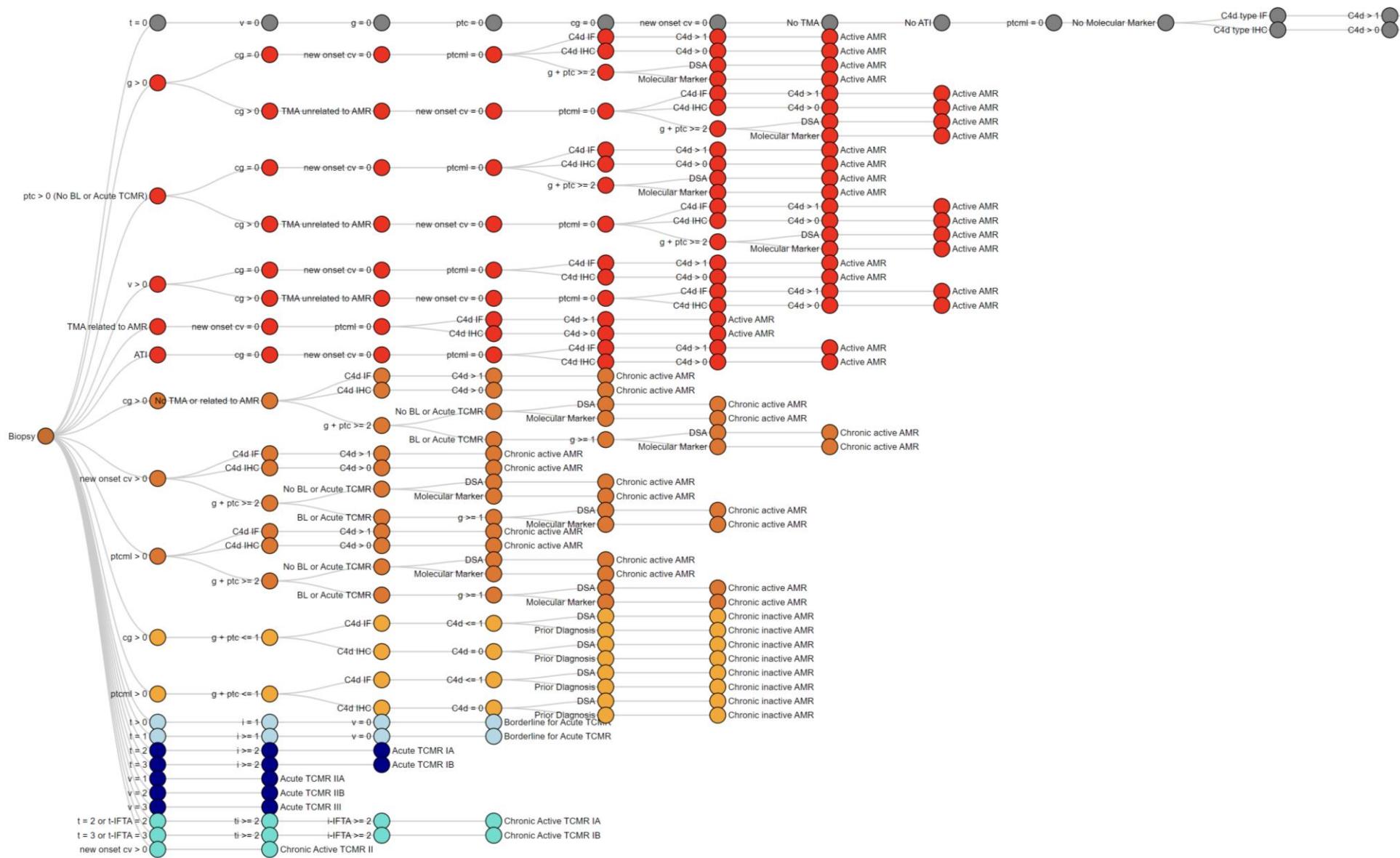
Q1 (veel overeenstemming)

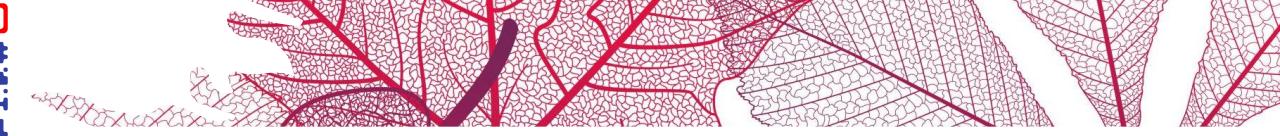
Q2 ...

Q3 ...

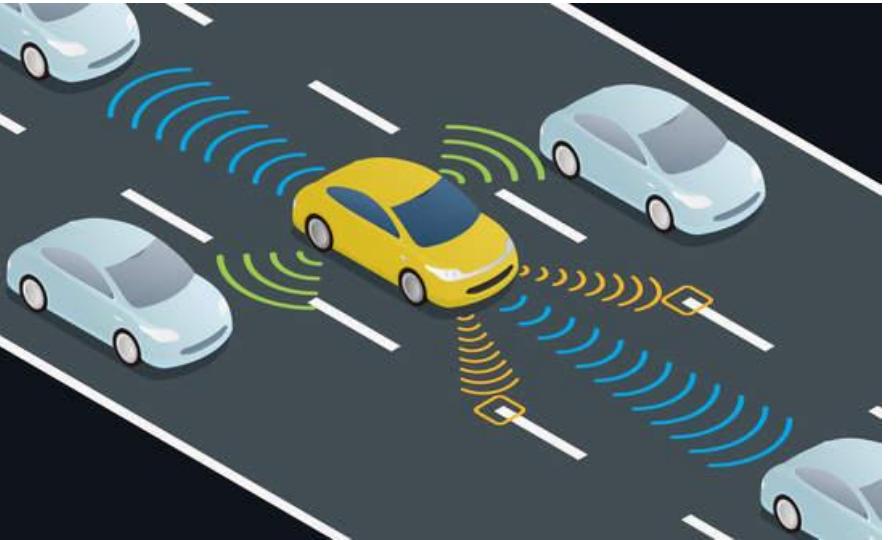
Q4 (weinig overeenstemming)

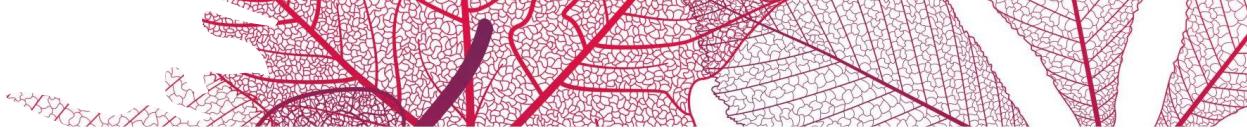






# Kan kunstmatige intelligentie helpen patronen te herkennen?

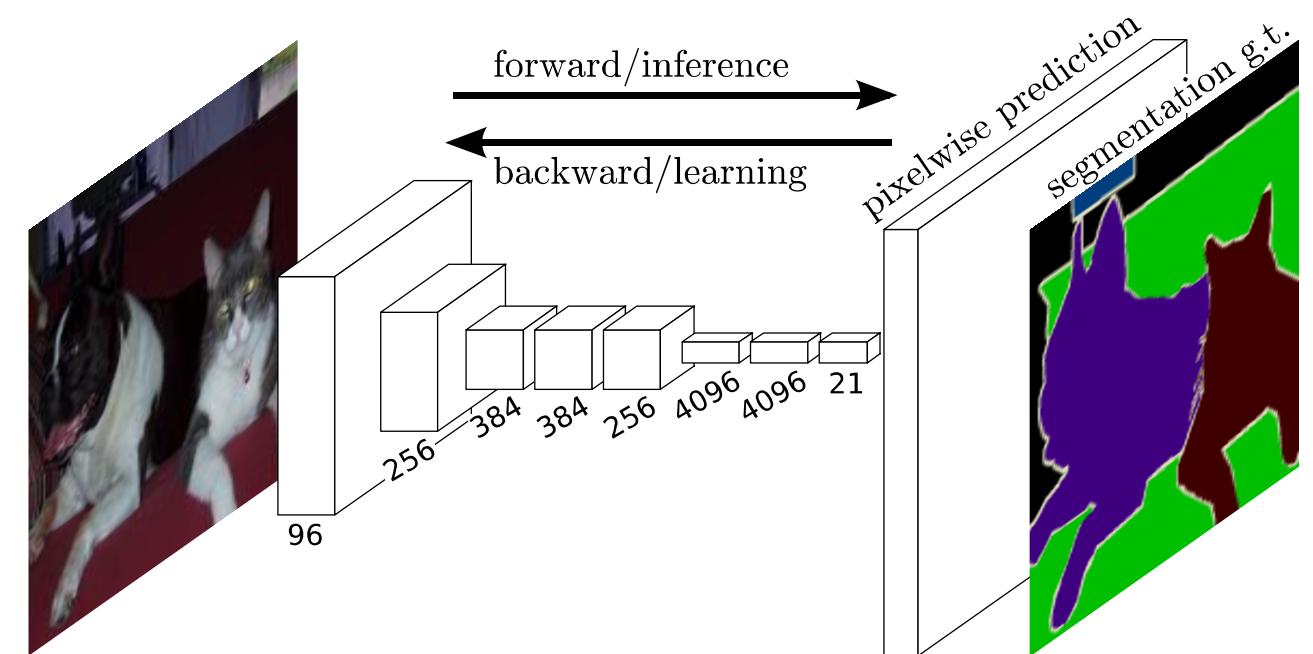


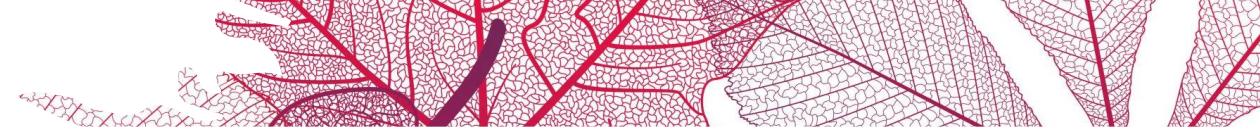


## Patholoog: Visuele patroonherkenning

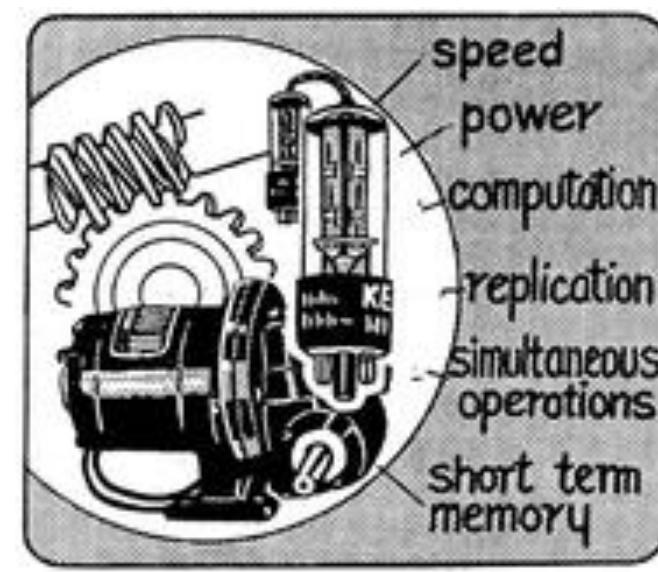
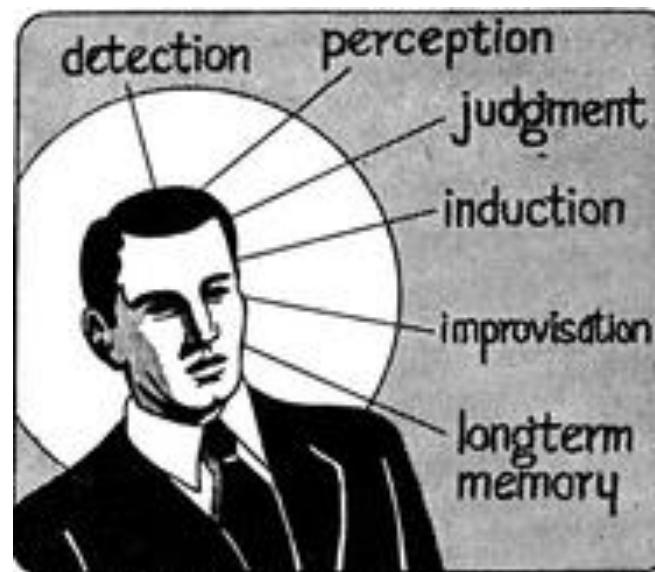


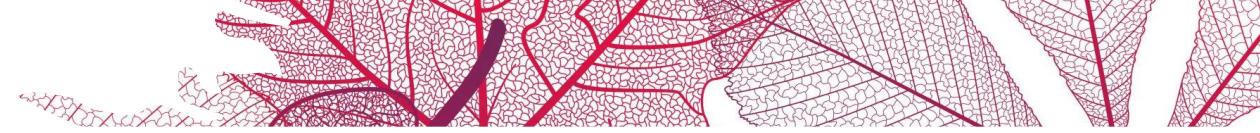
## Computer visie: van pixels naar kennis





## AI + patholoog = betere diagnostiek

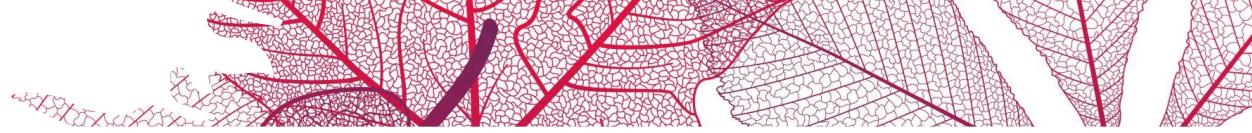




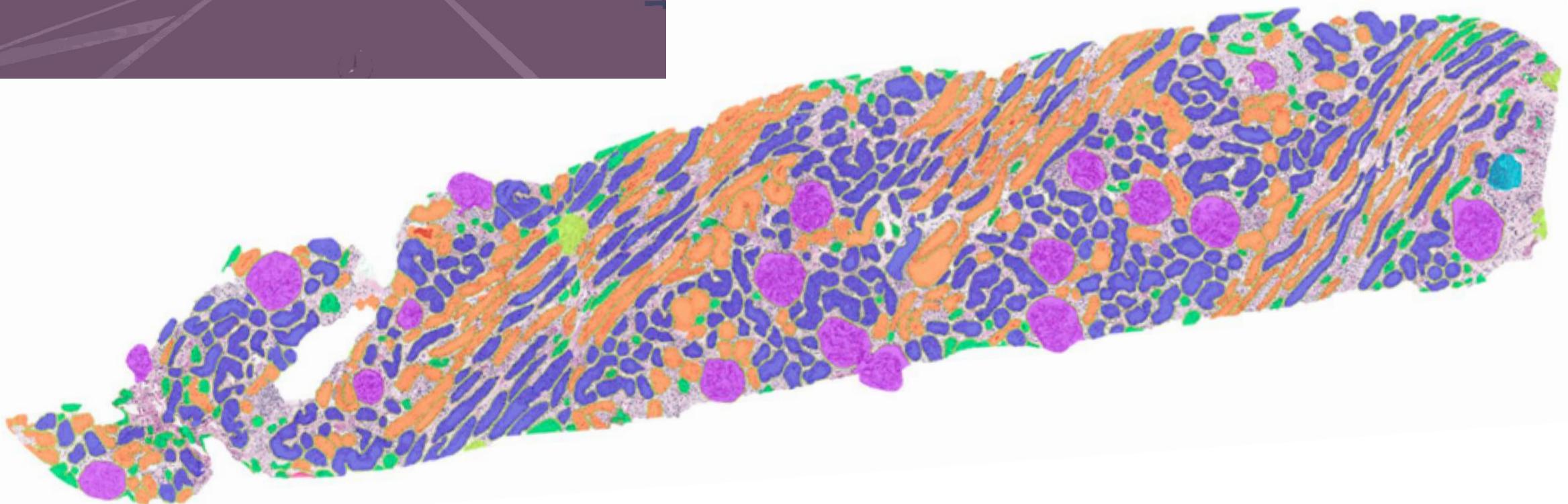
## **Doelen DEEPGRAFT (DEEP learning on kidney GRAFT biopsies)**

2018 - 2024

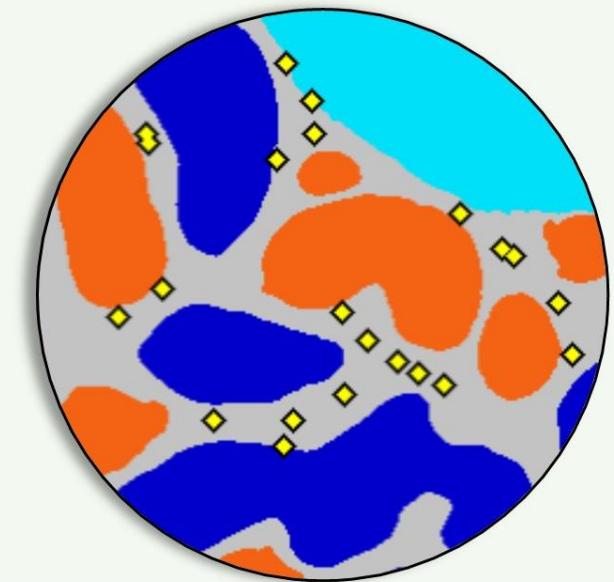
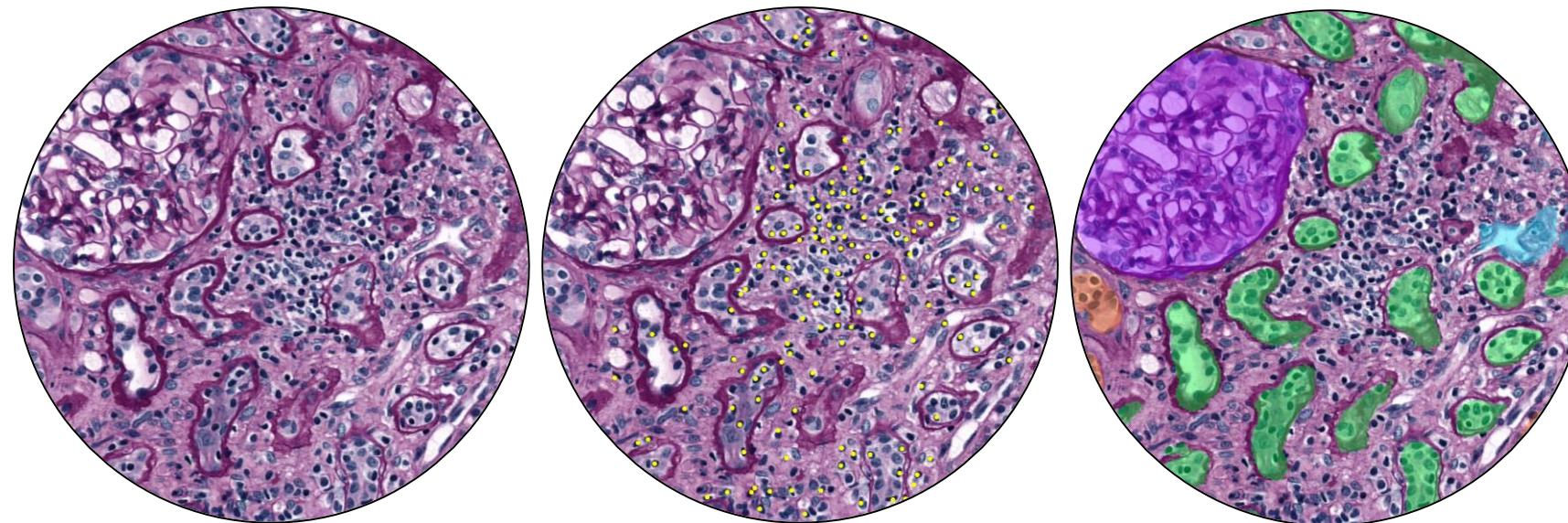
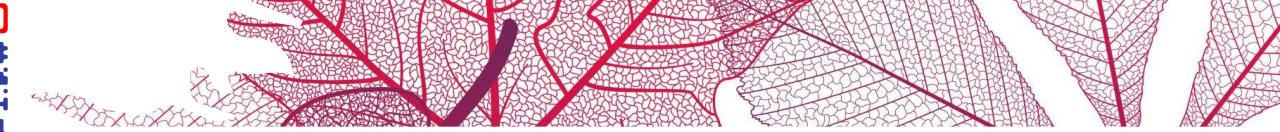
1. Eerste ontwikkeling van AI speciaal voor nierbiopten
2. Beter begrijpen/visualiseren van de AI patronen



JASN®

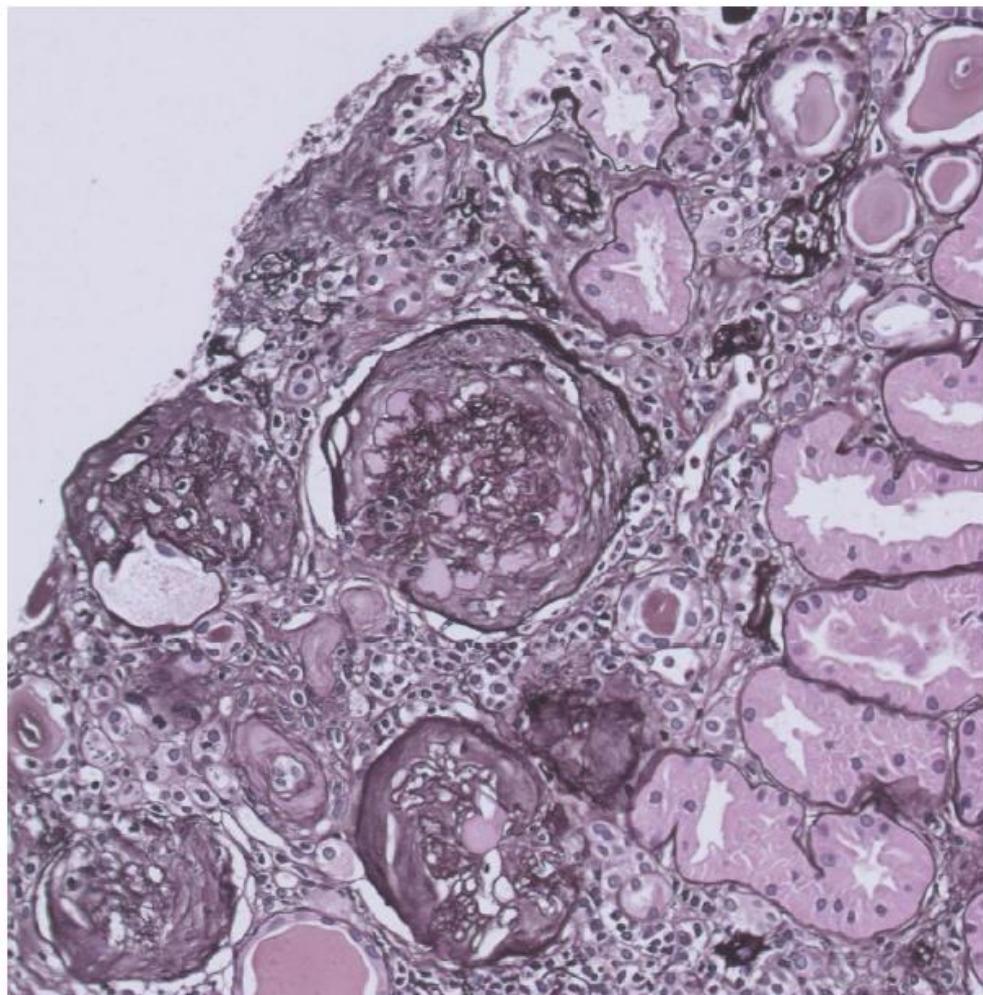
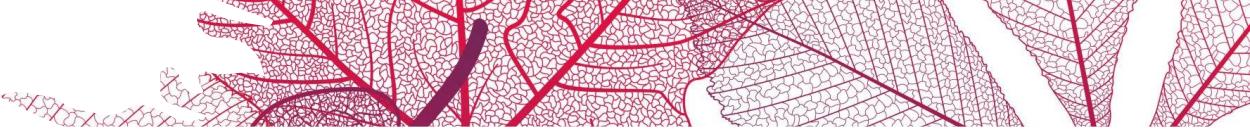


Samenwerking Radboud UMC, Nijmegen

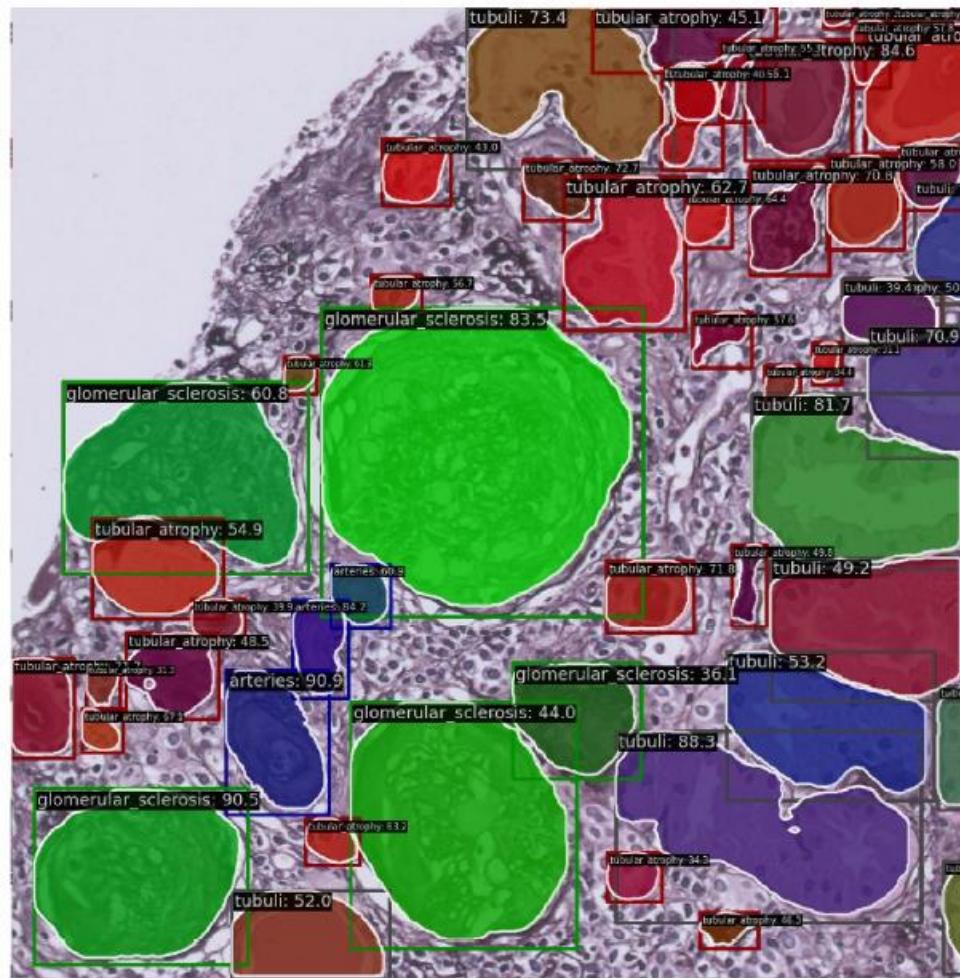


Automated  
quantification of  
lymphocytes inside  
specific tissue classes

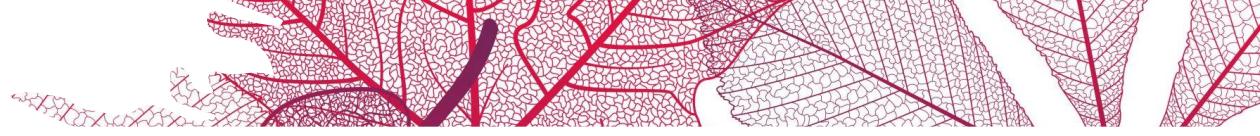
Samenwerking Radboud UMC, Nijmegen



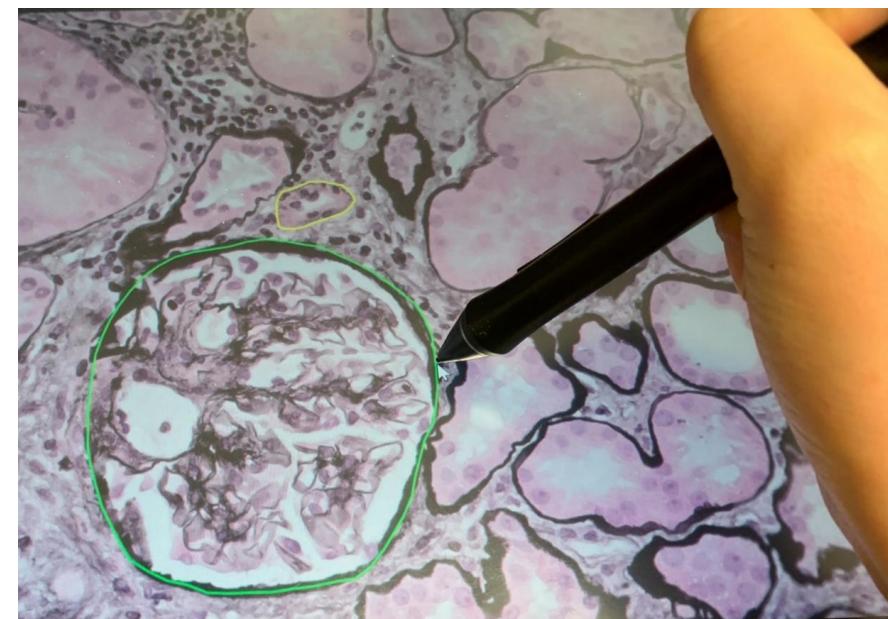
(a) ROI image

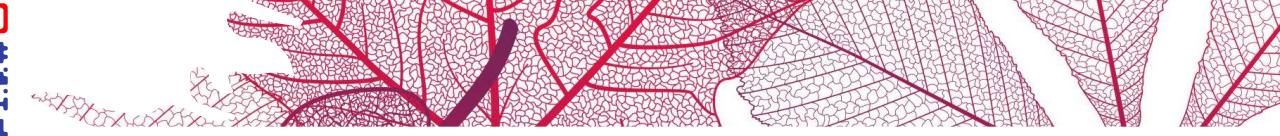


(d) instance lesion classification



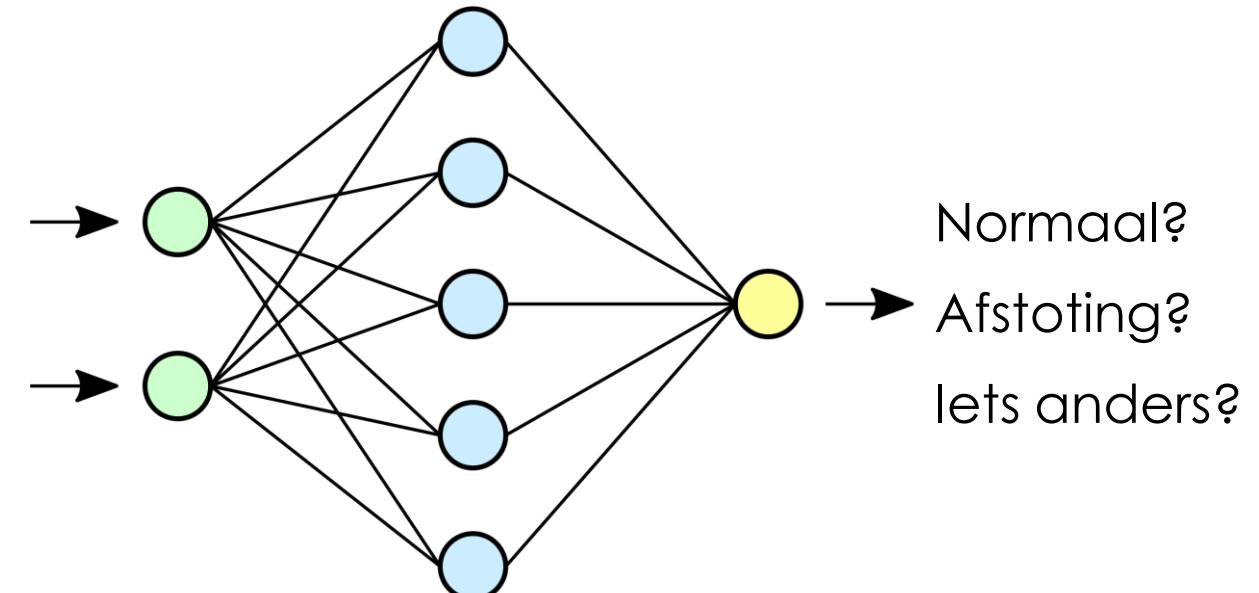
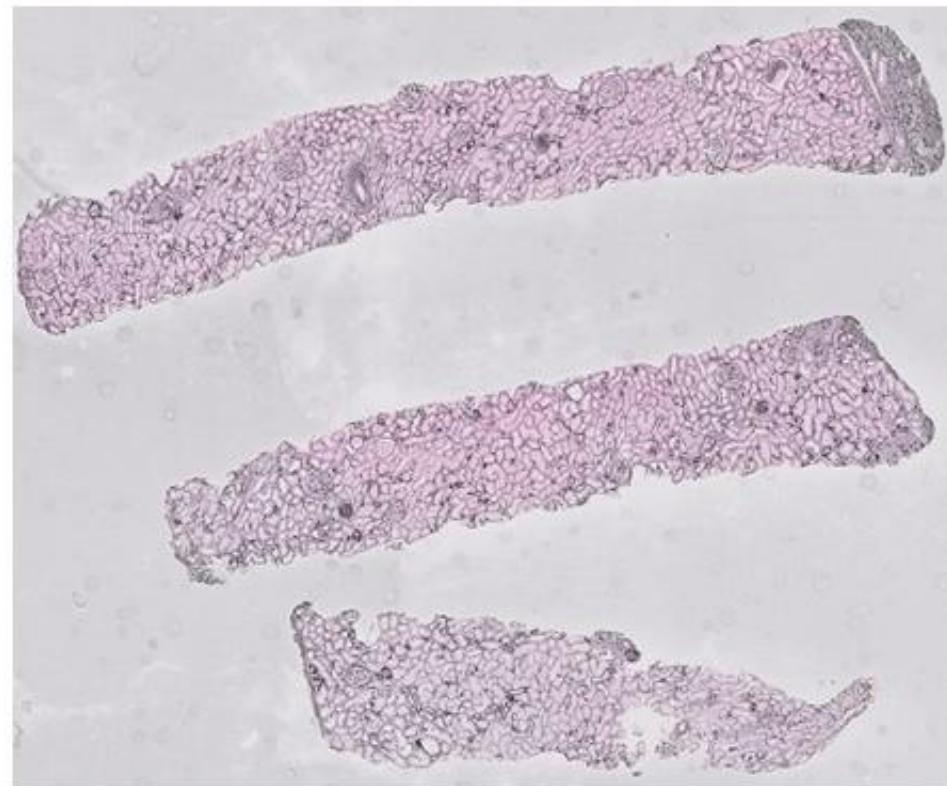
# Annoteren kost veel tijd en expertise!

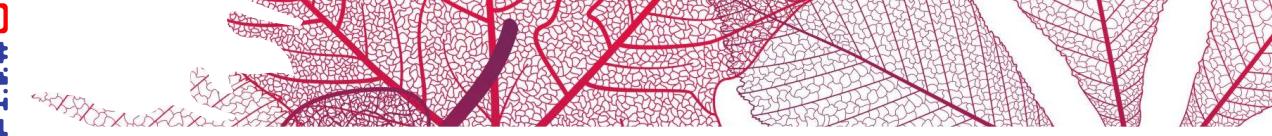


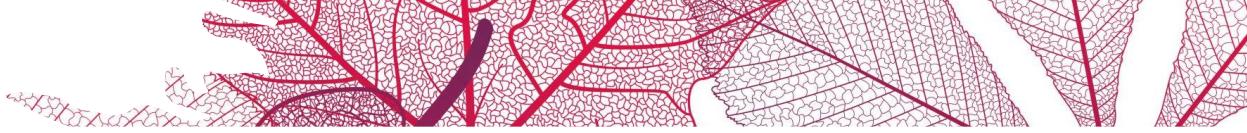


# Trainen met “zwakke” labels

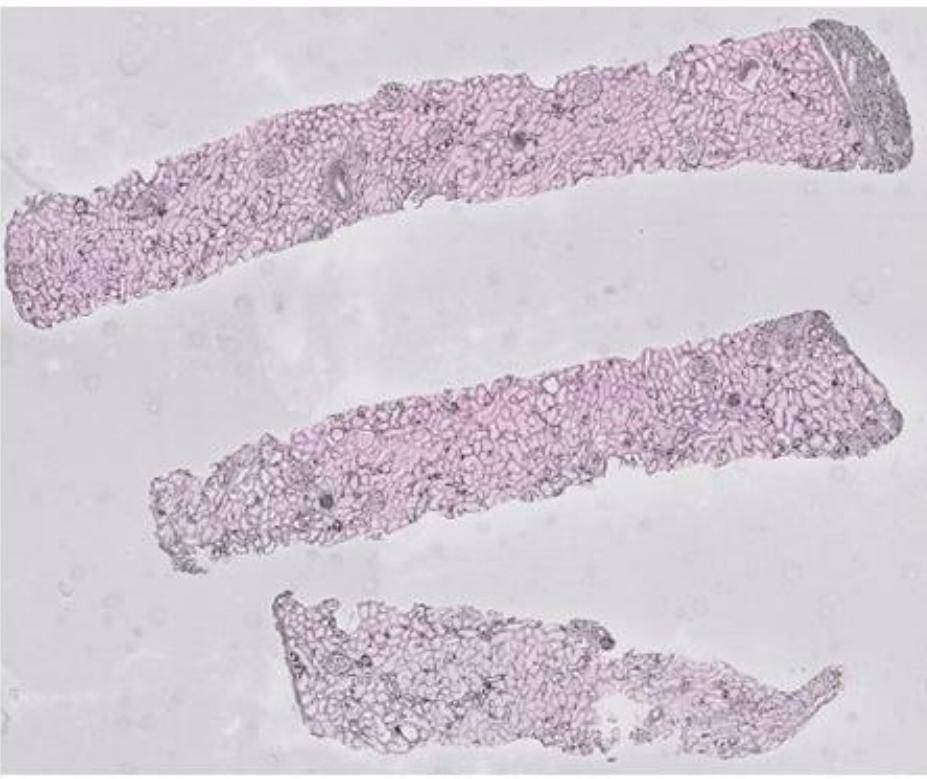
Whole slide image



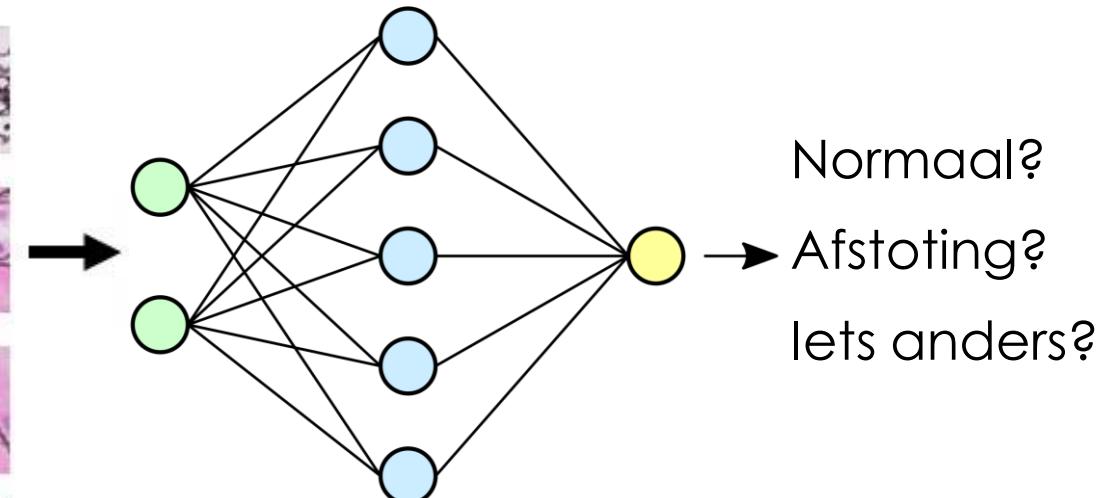
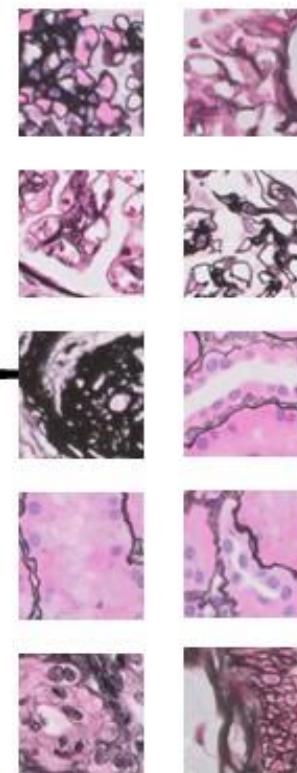




Whole slide image



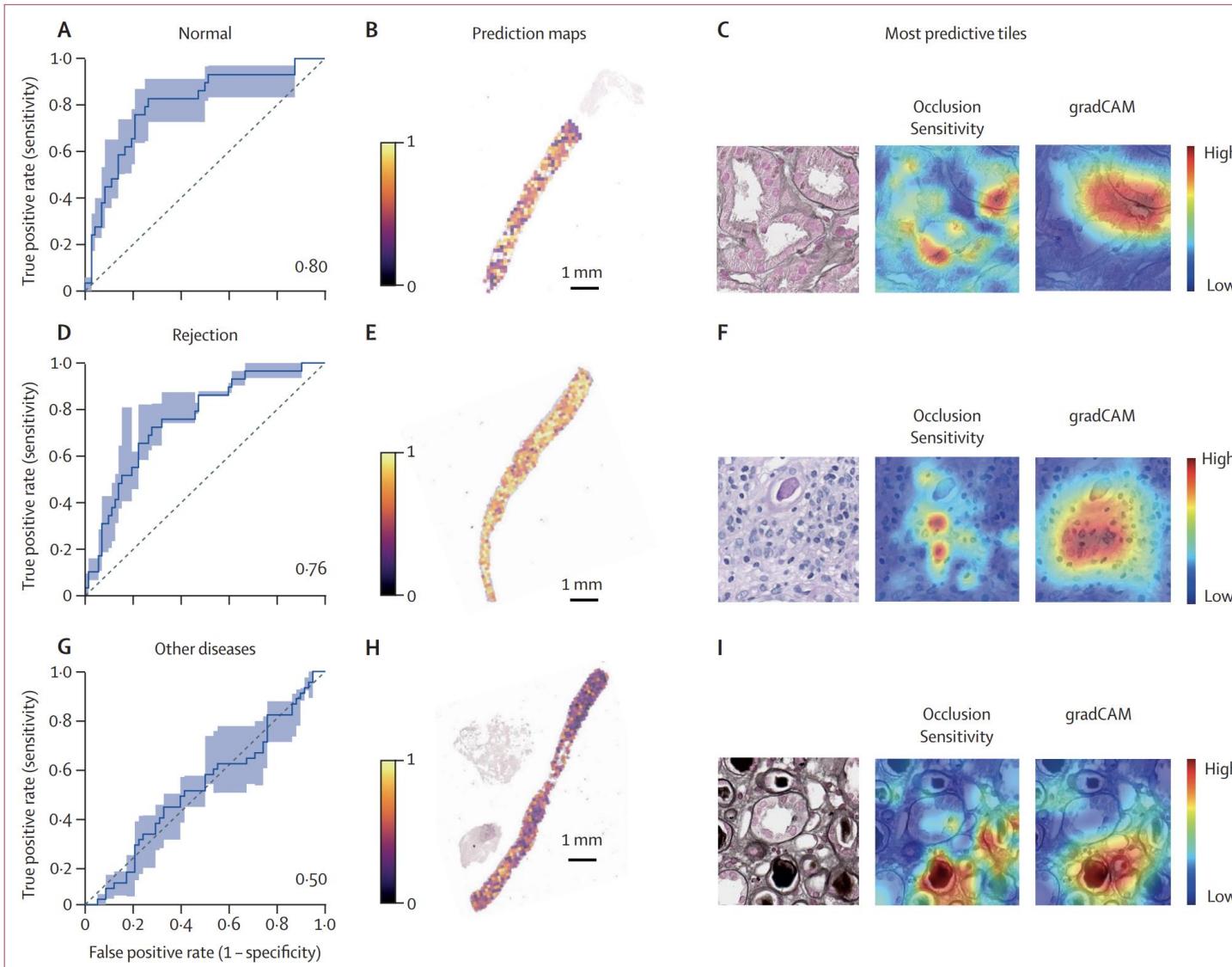
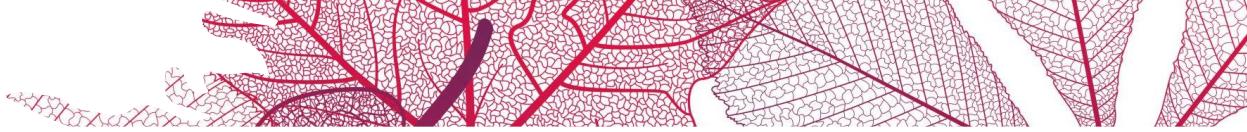
256x256 px patches



**Van pixel naar barcode**  
"ChatGPT" voor pathologie

**Neuraal netwerk op  
barcodes**

**Classificatie**



## THE LANCET Digital Health

Volume 3 • Issue 12 • December 2021 [www.thelancet.com/digital-health](http://www.thelancet.com/digital-health)

**Editorial**

It's not easy being green  
See page e751

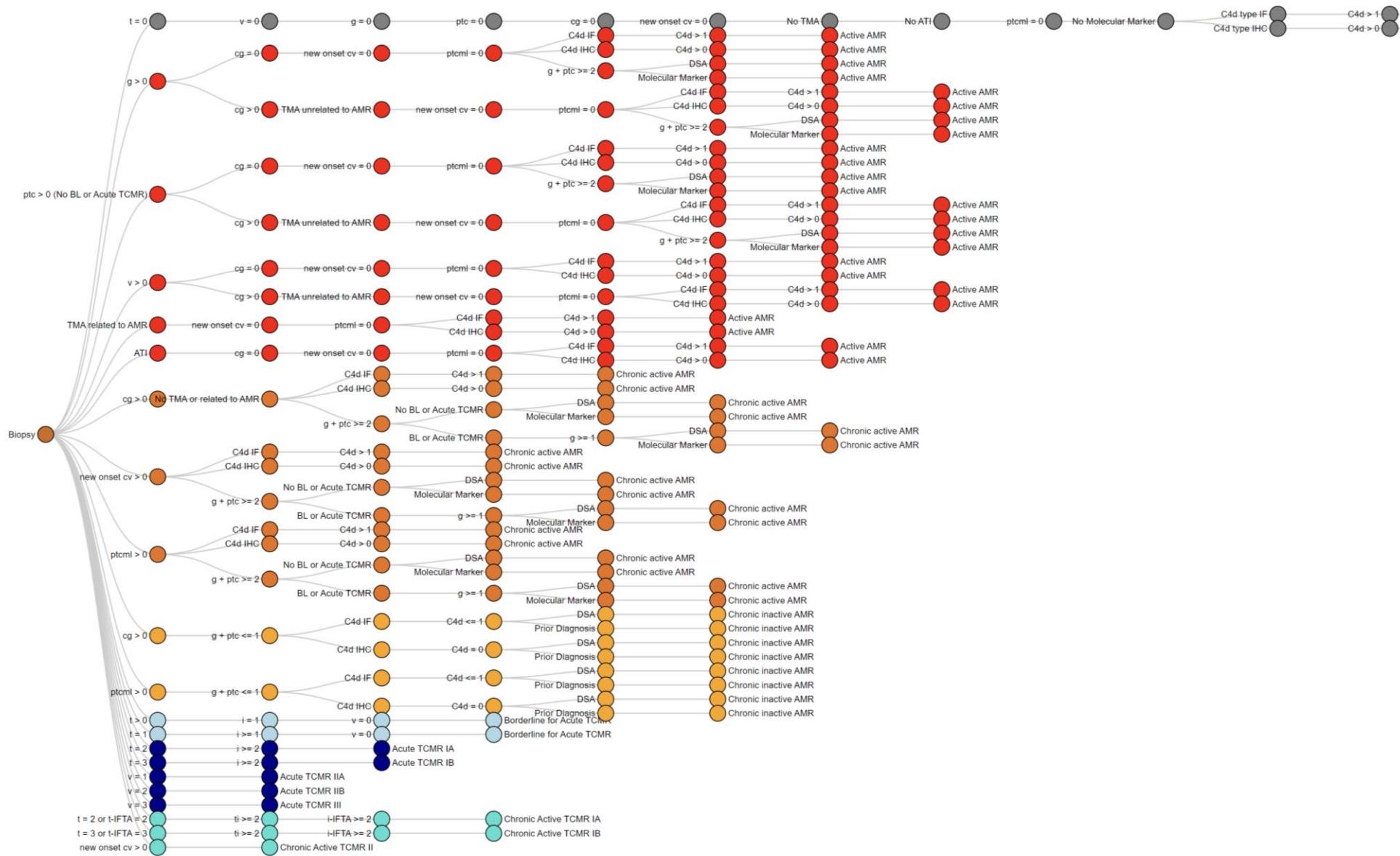
**Articles**

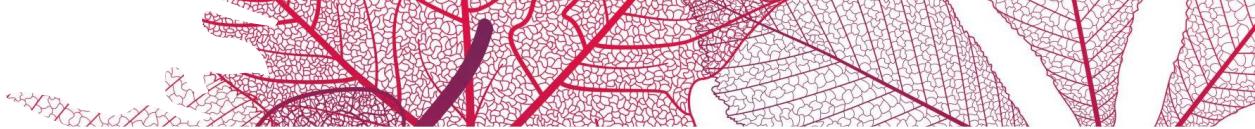
Dynamic prediction of renal survival among deeply phenotyped kidney transplant recipients using AI  
See page e795

**Review**

Blockchain applications in health care for COVID-19 and beyond  
See page e819

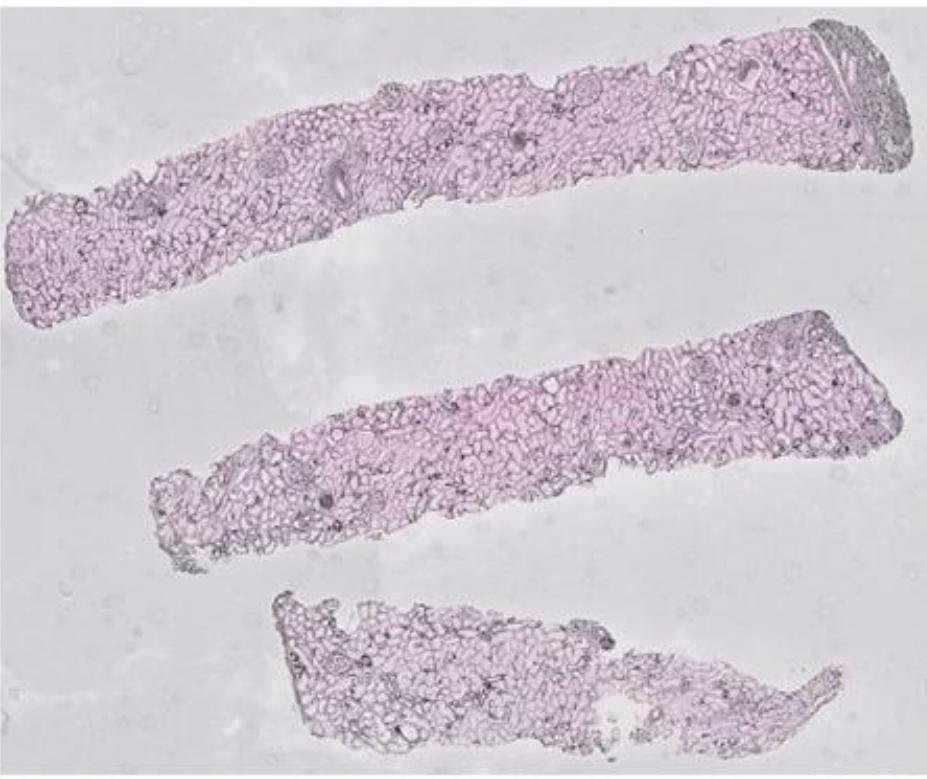
**oa**  
OPEN ACCESS



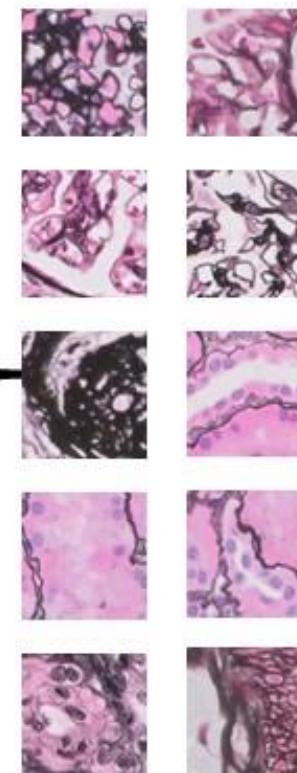


# Gehele classificatie voorspellen!

Whole slide image



256x256 px patches



$$P_{ah}(patch_0), P_{ah}(patch_1), \dots, P_{ah}(patch_B)$$

$$P_{atn}(patch_0), P_{atn}(patch_1), \dots, P_{atn}(patch_B)$$

$$P_{cg}(patch_0), P_{cg}(patch_1), \dots, P_{cg}(patch_B)$$

$$P_{cv}(patch_0), P_{cv}(patch_1), \dots, P_{cv}(patch_B)$$

$$P_g(patch_0), P_g(patch_1), \dots, P_g(patch_B)$$

$$\vdots$$

$$P_{tma}(patch_0), P_{tma}(patch_1), \dots, P_{tma}(patch_B)$$

$$P_v(patch_0), P_v(patch_1), \dots, P_v(patch_B)$$

Bayesian aggregation operator

$$\oplus$$

$$P_{ah}$$

$$P_{atn}$$

$$P_{cg}$$

$$P_{cv}$$

$$P_g$$

$$\vdots$$

$$\vdots$$

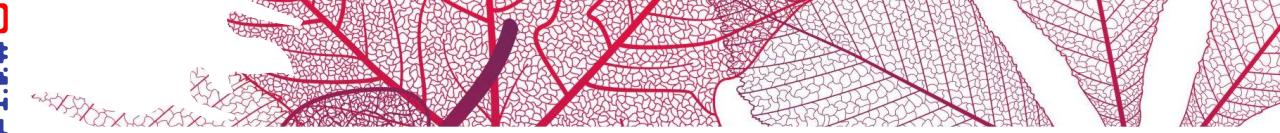
$$\oplus$$

$$P_{tma}$$

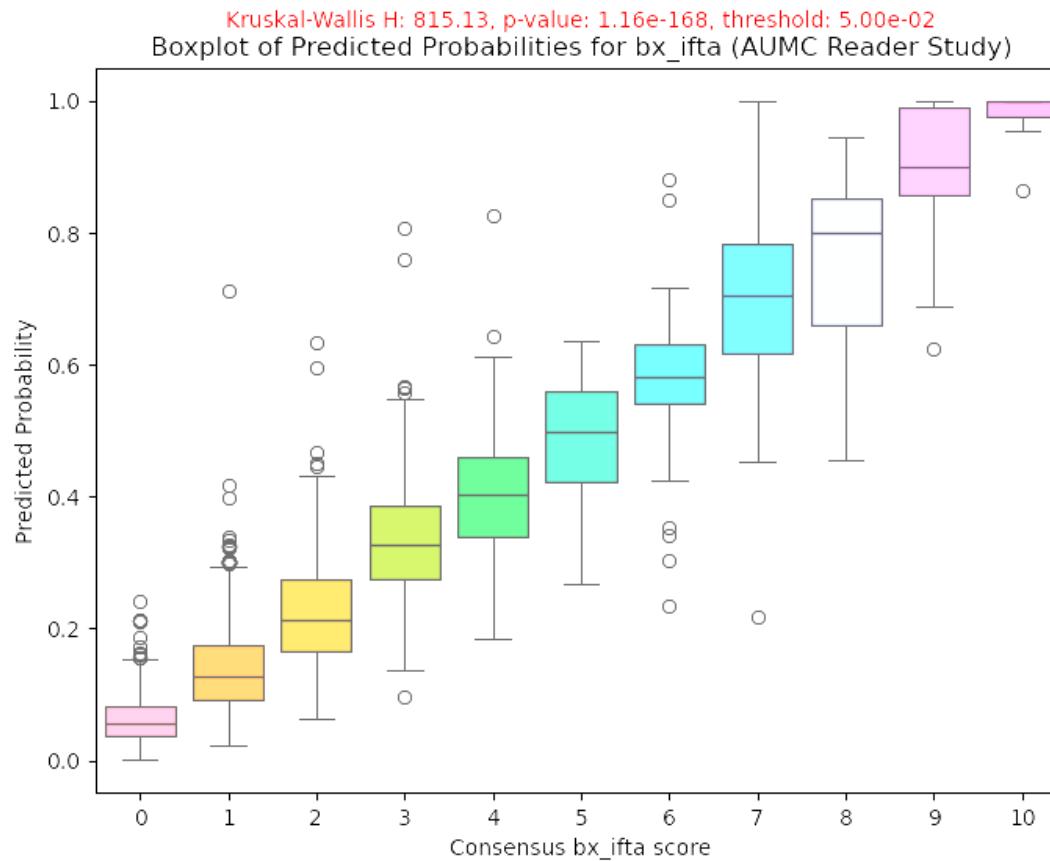
$$P_v$$

Van pixel naar barcode

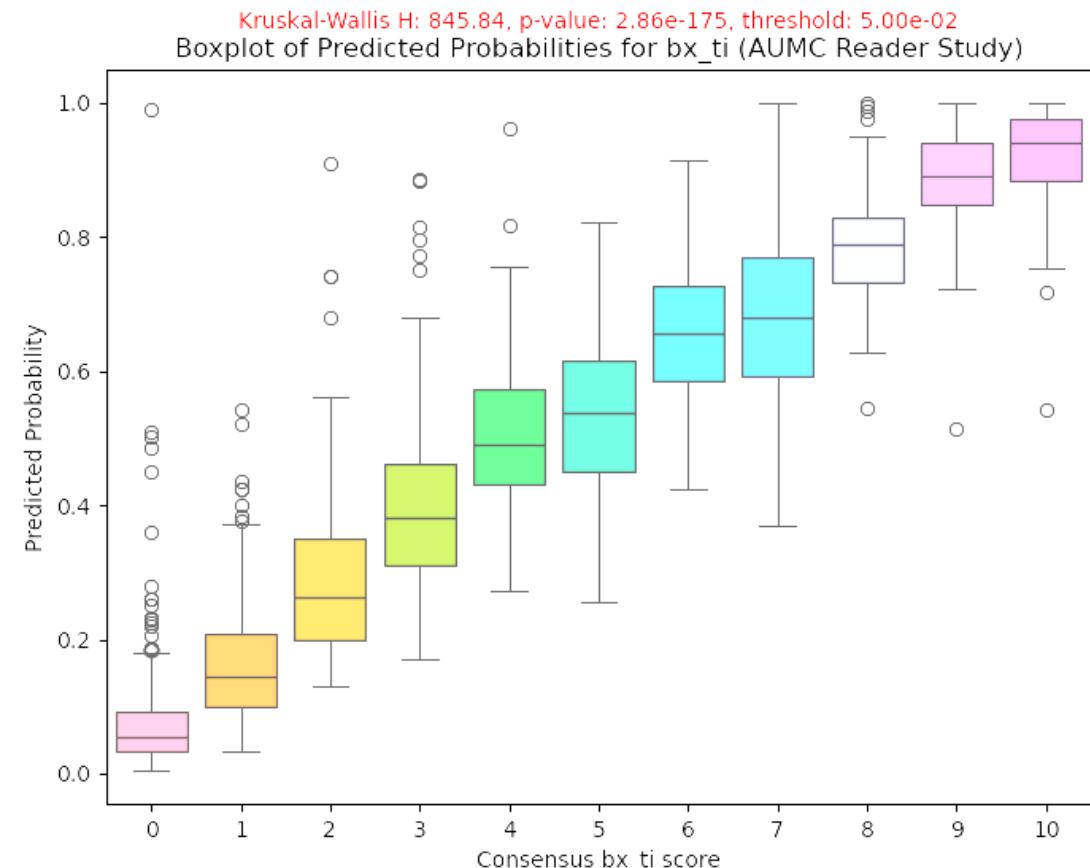
Speciaal neuraal netwerk      Kans op afwijking



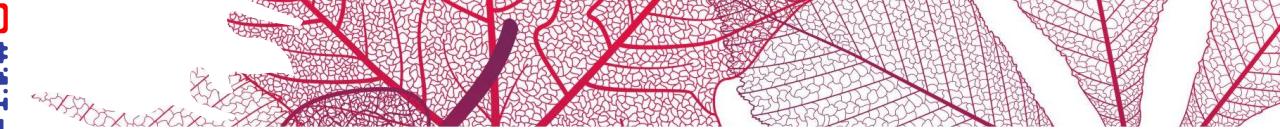
## Banff-NET litteken nier



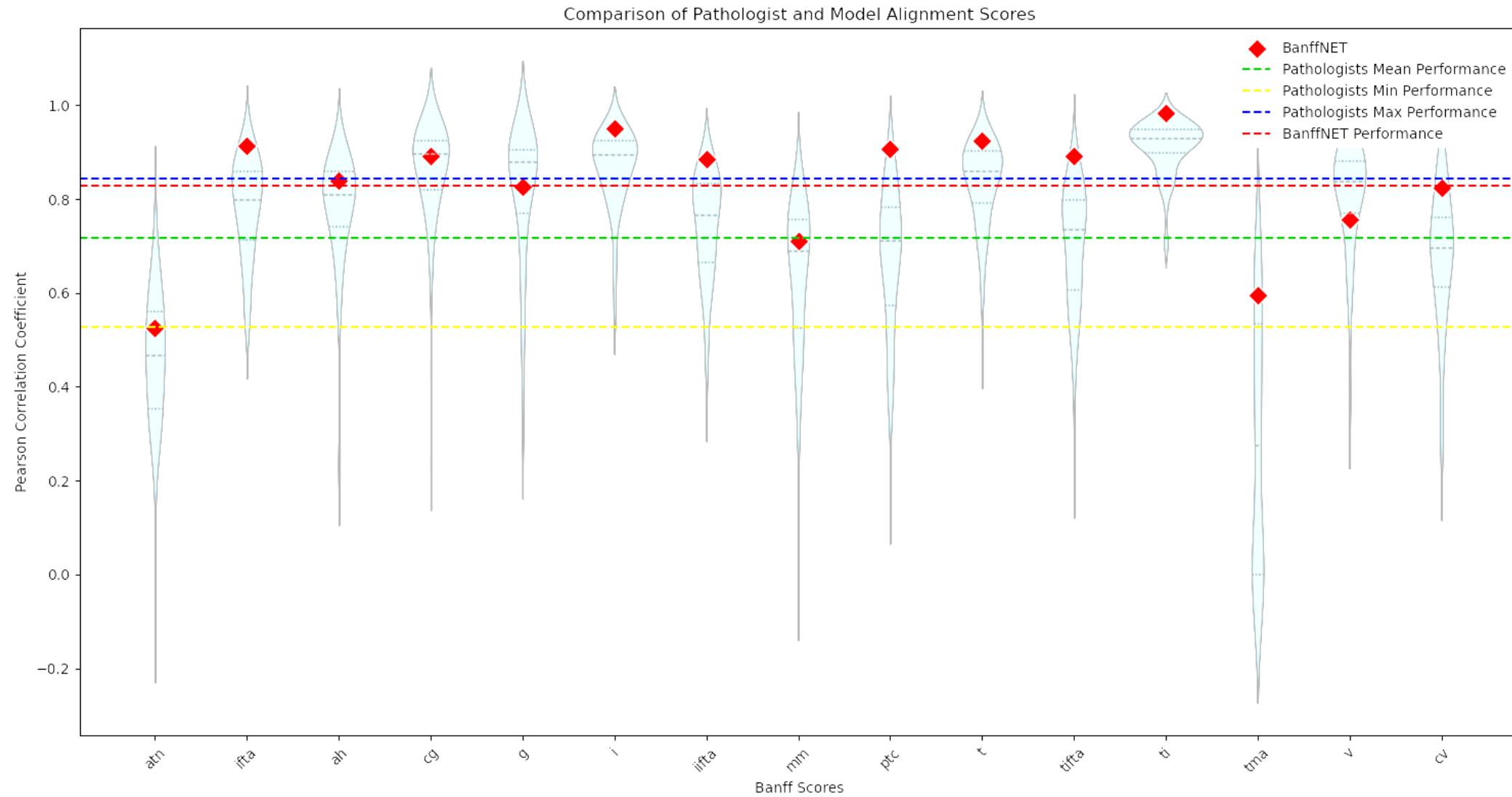
## Banff-NET ontsteking nier

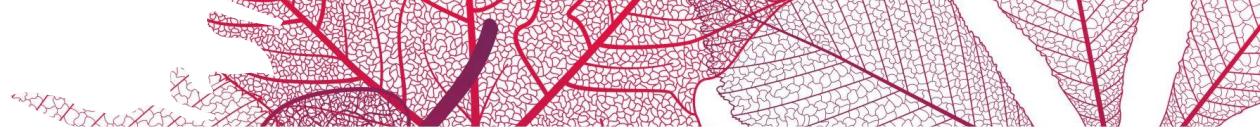


Ten opzichte van consensus 67 pathologen

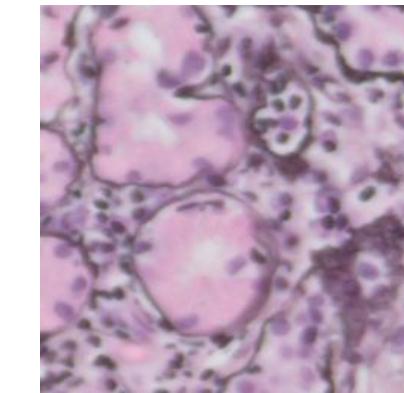
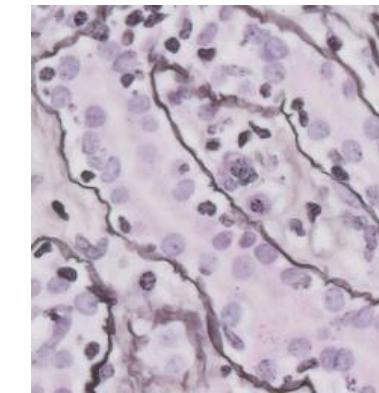
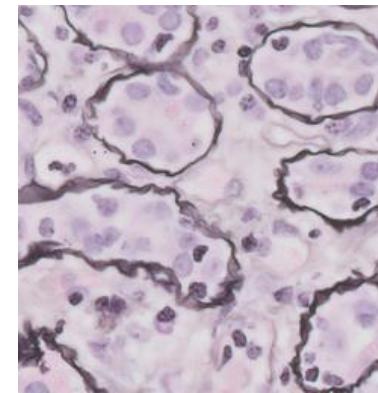
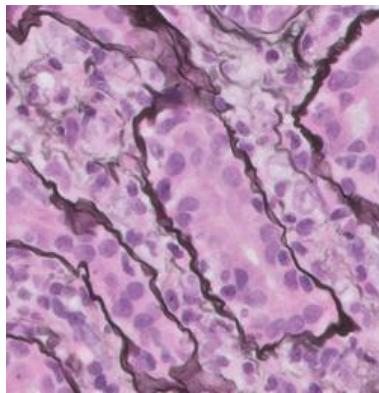
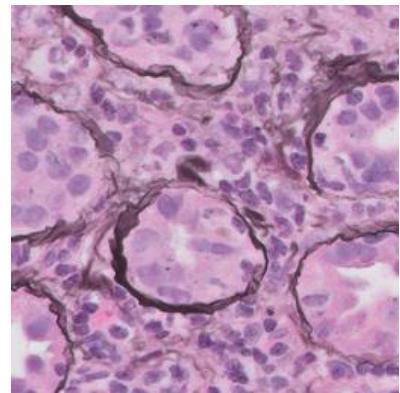


## Banff-NET heeft hogere accuratesse dan 80% van de pathologen

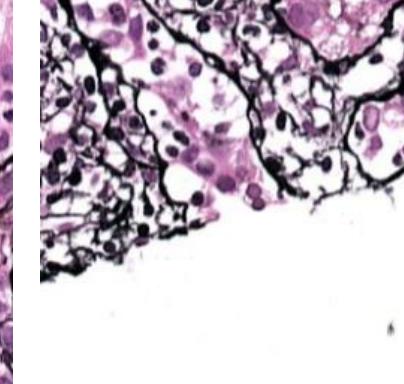
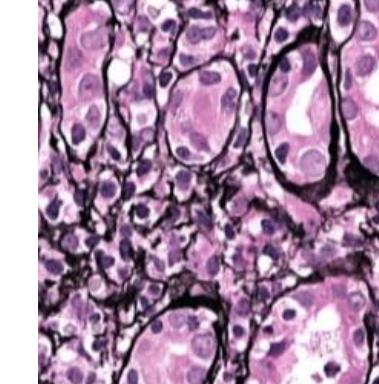
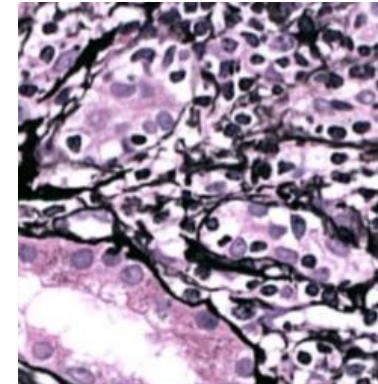
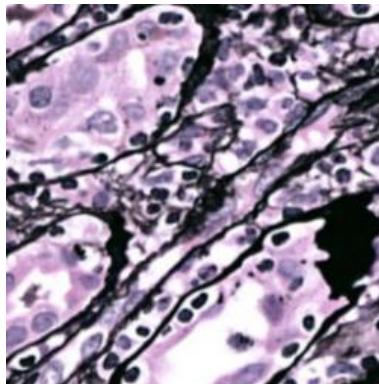
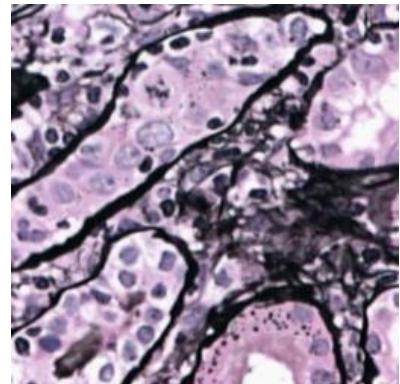


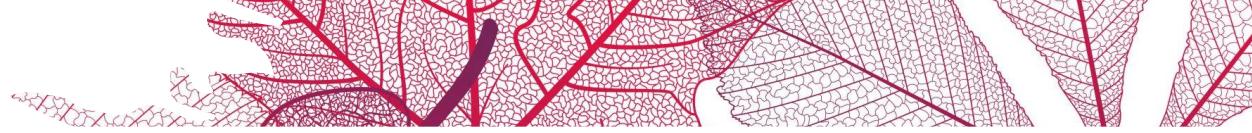


Tubulitis op Amsterdamse biopten (gezien tijdens trainen)

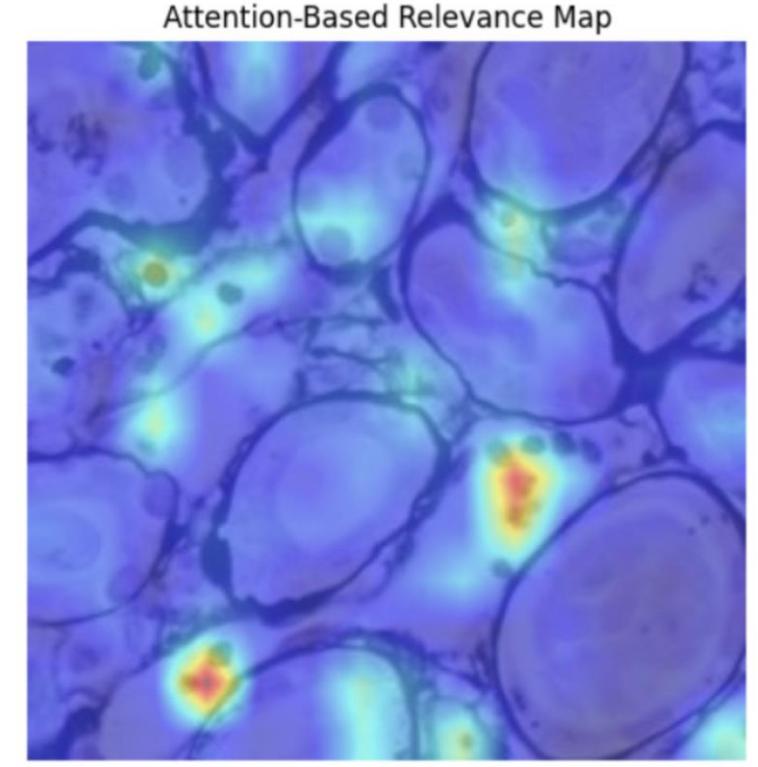
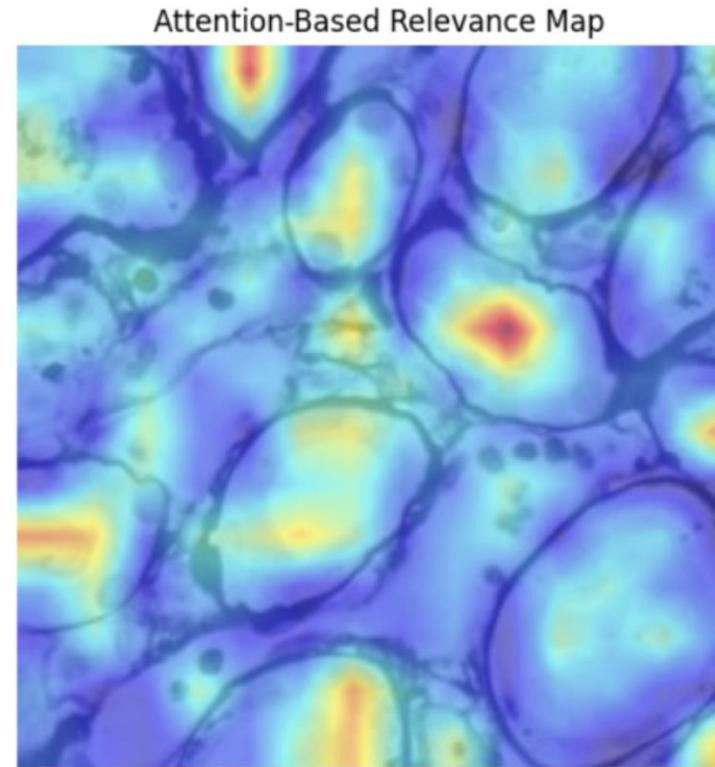
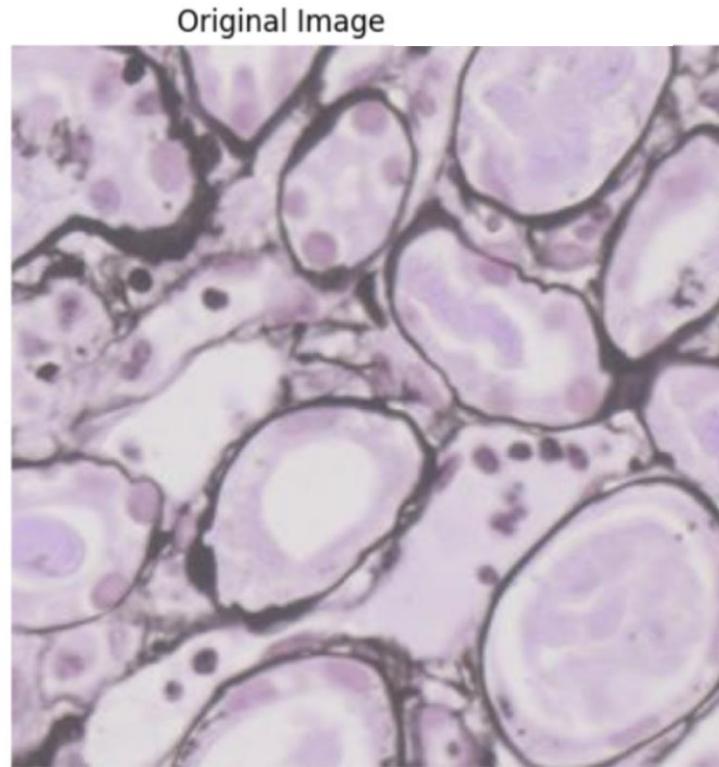


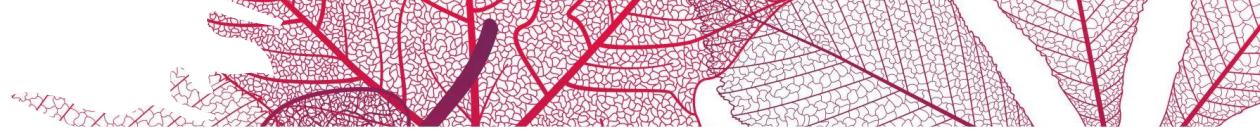
Tubulitis op Radboud biopten (nooit gezien door Banff-NET)





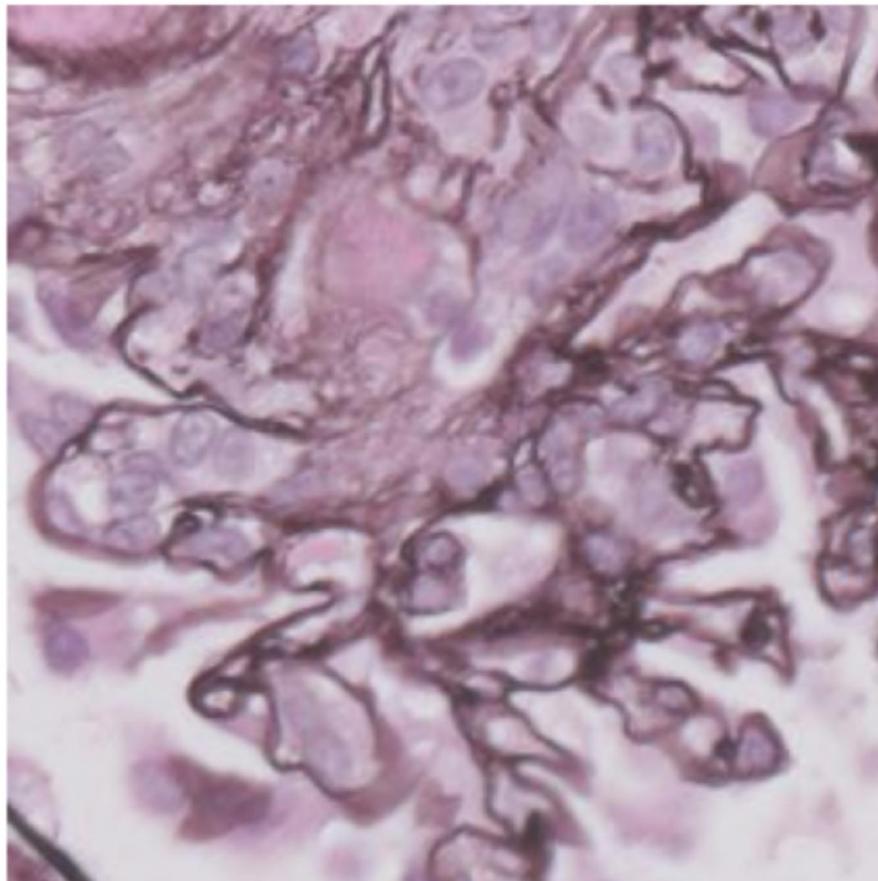
Banff-NET herkent meerdere afwijkingen per regio



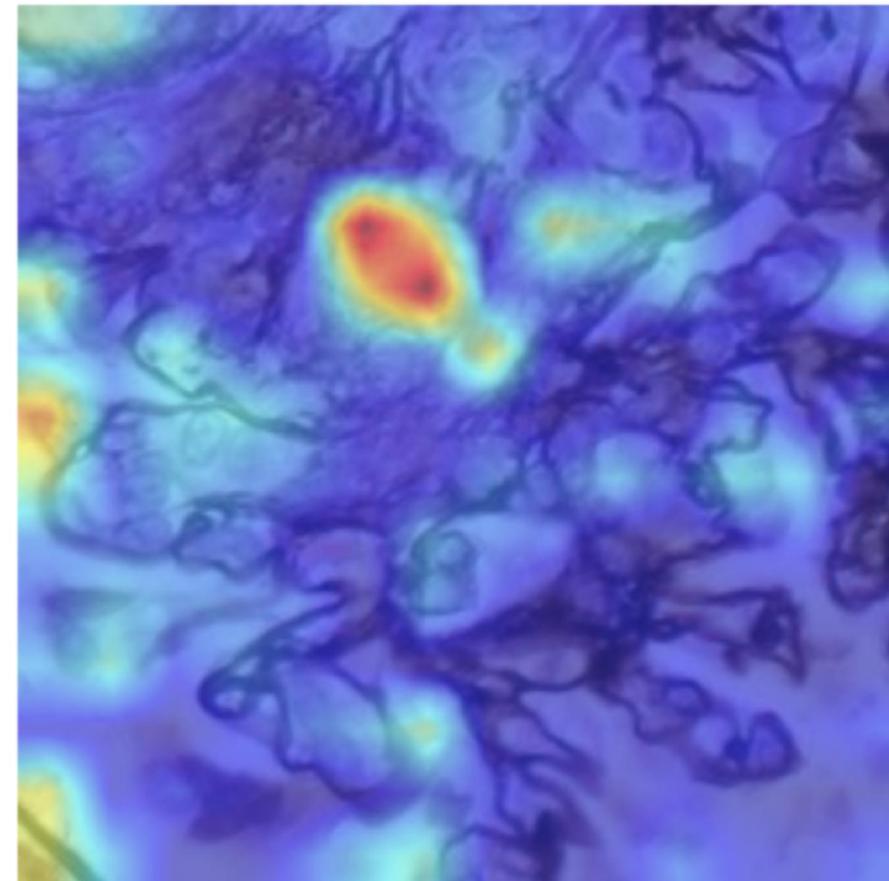


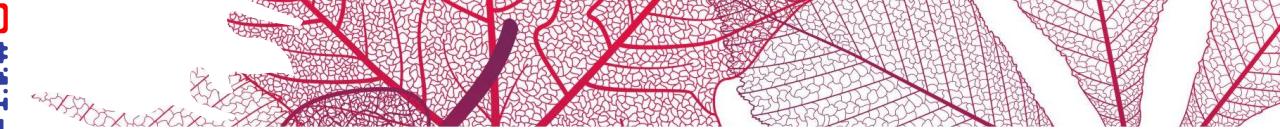
Banff-NET herkent moeilijke en lokale afwijkingen

Original Image showing tma

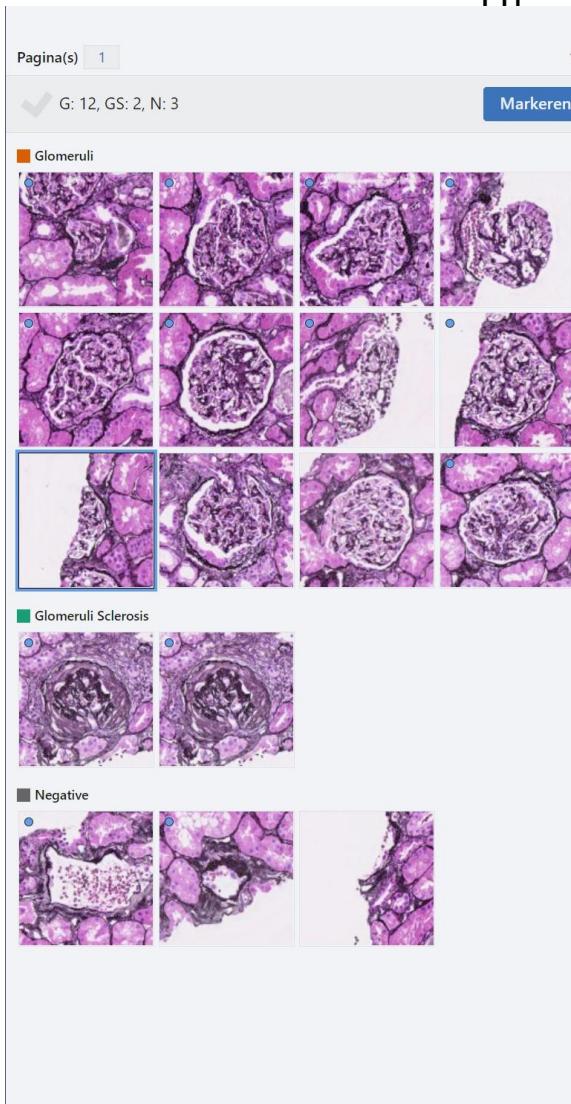


Attention-Based Relevance Map





## Impact voor patienten: **Implementatie kliniek!**



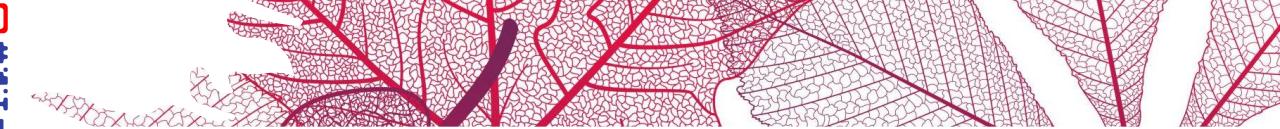
Pagina(s) 1  
G: 12, GS: 2, N: 3  
Markeren als geverifieerd

- Glomeruli
- Glomeruli Sclerosis
- Negative

1-17 van 17 patches

## Samenwerking UMC





## Impact voor patienten: Certificering FDA/EMEA



Segmentation of main  
tissue classes



AI-Powered  
quantification of fibrosis

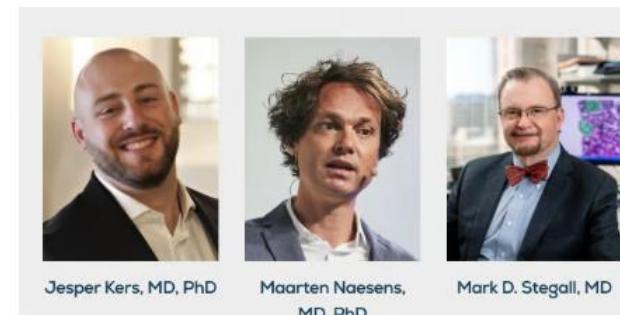


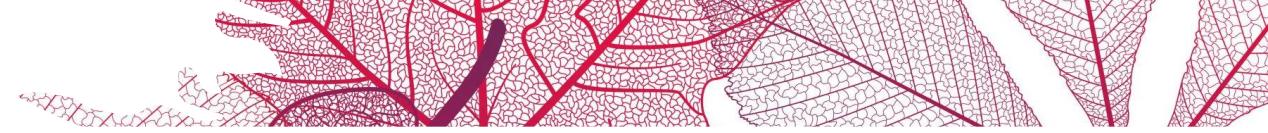
Localization and counting  
of glomeruli



Customized quantification  
services

### Aiosyn's Kidney image analysis news



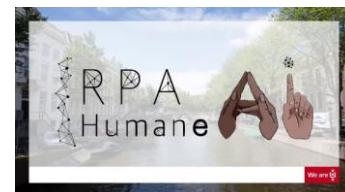
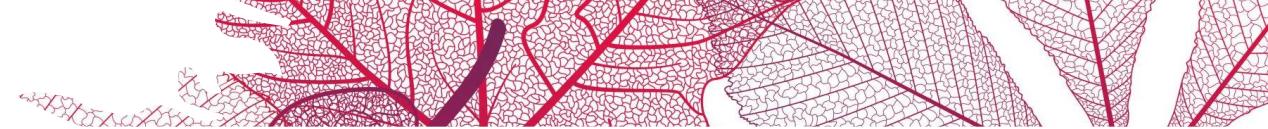


## Publicaties DEEPGRAFT

Hermsen et al. 2019 JASN  
De Bel et al. 2019 proc mach learn res  
Farris et al. 2020 Am J Transplant  
Bulow et al. 2020 Kidney Int  
Hermsen et al. 2021 Lab Invest  
Zhang et al. 2022 ArXiv  
Kers et al. 2022 Lancet Digital Health  
Vasey et al. 2022 BMJ  
Vasey et al. 2022 Nature Medicine  
Hermsen et al. 2022 Am J Pathol  
Roufosse et al. 2023 Am J Transplant  
Farris et al. 2023 Transplant Int  
Xiong et al. 2023 ArXiv  
Vo et al. ArXiv  
Tasca et al. 2024 Nature Reviews Nephrology  
Tam et al. 2024 Front Transplant  
Brussee et al. 2024 ArXiv

## Presentaties op uitnodiging DEEPGRAFT

Banff Foundation 2019, Banff, Canada  
AITRAC CARE-DX 2020, San Francisco, VS  
TTS 2020, Seoel, Korea  
European Pathology Conference 2021, Gotenborg, Zweden  
TTS 2022, Buenos Aires, Argentinie  
Banff Foundation 2022, Pittsburg, VS  
Hot topics in transplantation 2023, Genua, Italie  
Deep learning for renal pathology 2023, Chongqing, China  
USCAP-RPS 2023, New Orleans, VS  
Swiss Society for Pathology 2023, Lausanne, Zwitserland  
ERA 2024, Stockholm, Zweden  
Brazilian Society for Pathology 2024, Belem, Brazilië  
ATC 2024, Philadelphia, VS  
UK Kidney week 2024, Edinburgh, Schotland  
Precision medicine course 2024, Bari, Italie  
Banff foundation 2024, Parijs, Frankrijk  
Saudi Society for Pathology 2024, Riyadh, Saoedi Arabie  
Deep learning for pathology course 2024, Salvador, Brazilië



# Het talent!

**Giorgio Buzzanca** (PhD student LUMC)

**Ling He** (Postdoc LUMC)

**Zhan Xiong** (PhD student LIACS)

**Jia Li** (PhD student LIACS)

**Siemen Brussée** (PhD student LUMC)

**Pieter Valkema** (PhD student LUMC)

Weakly supervised learning, GNN modeling

Semantic segmentation modelling

Instance/panoptic segmentation modelling

Weakly supervised learning

Weakly supervised learning, GNN modelling

Software engineering, segmentation modeling

Groep Aiko de Vries, LUMC

Groep Frederike Bemelman, AUMC

Groep Peter Boor in RWTH Aachen

Groep Maarten NaeSENS, KU Leuven

Groep Jeroen van der Laak, RUNMC

Groep Tri Nguyen, UMC Utrecht

Groep Anne-Roos Schrader, LUMC

Collega's nephropathologen en nefrologen

Fellows nefropathologie Amsterdam UMC

# Nierbiopten beoordelen met behulp van AI biedt uitkomst!

Jesper Kers, MD, PhD  
Nierpatholoog Amsterdam UMC, Leiden UMC  
Amsterdam, The Netherlands



# DANK!!

Wetenschapsdag 2024



**Je hebt zojuist een presentatie van de Nierpatiënten Vereniging Nederland bekeken of bijgewoond.**

**Hiermee willen we niet alleen onze leden, maar alle nierpatiënten informeren over nierziekten en het leven ermee. Ben je geen lid, maar sta je achter het werk van de NVN? Steun ons dan met een gift. Zodat we mooie webinars/themadagen kunnen blijven maken. Wij zijn blij met elke bijdrage!**

**Scan hiervoor deze QR-code.**

