

Future: Is pathology more than a specimen?

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“Computational Pathology and Spatial-omics” Lab

Residential course: Modern Radiation Oncology 33rd edition: 10/10/2023



Artificial Intelligence



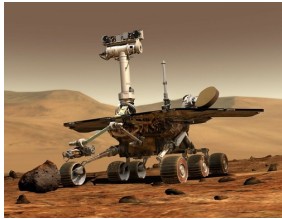
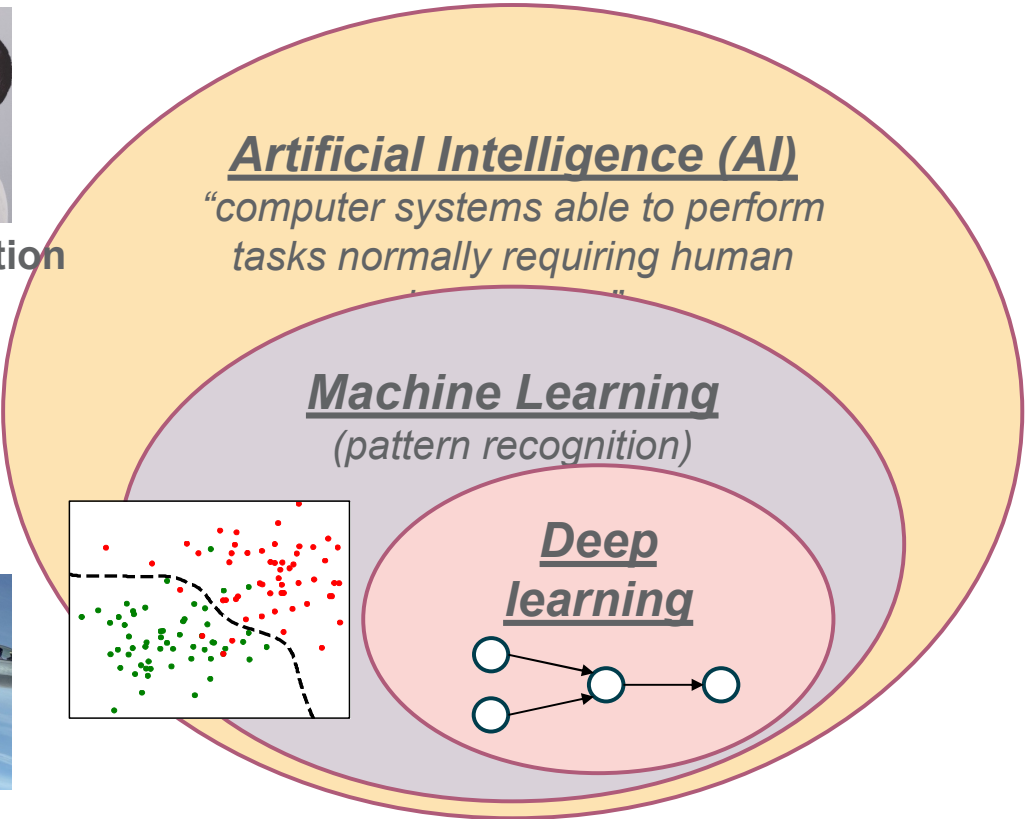
Speech Recognition



Finance



Aviation



Robotics



Navigation

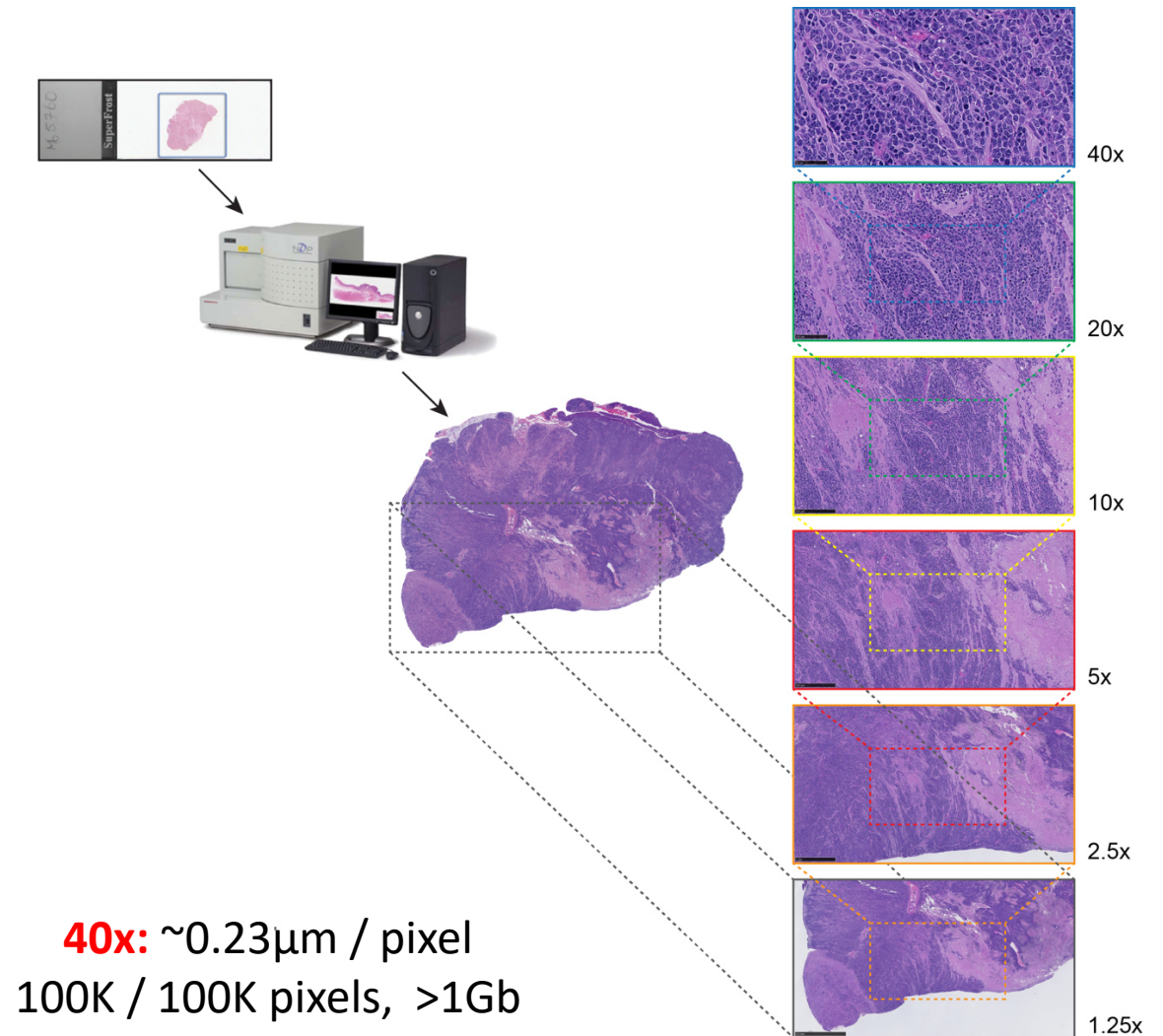


Gaming

Courtesy of Dr. Matthew Blackledge

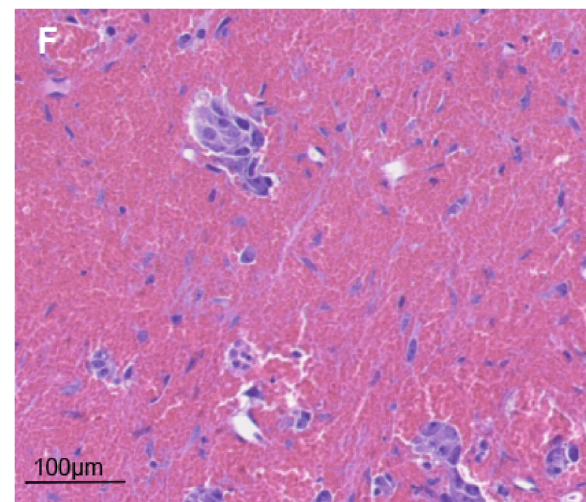
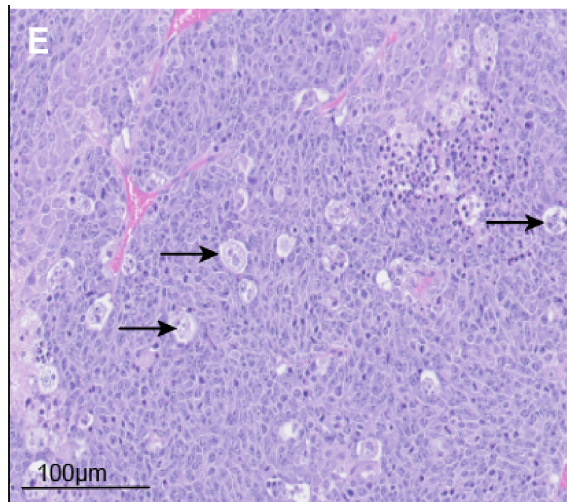
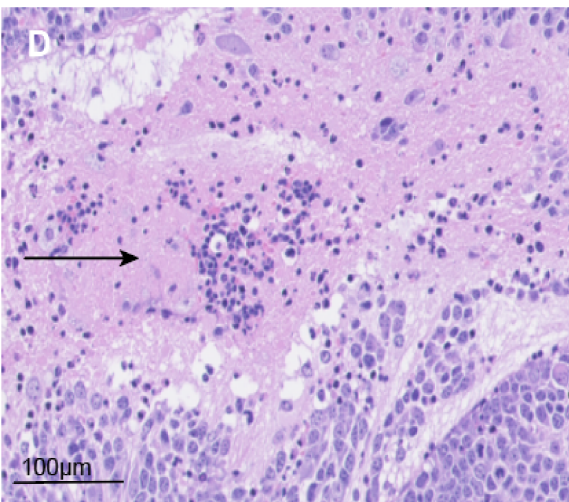
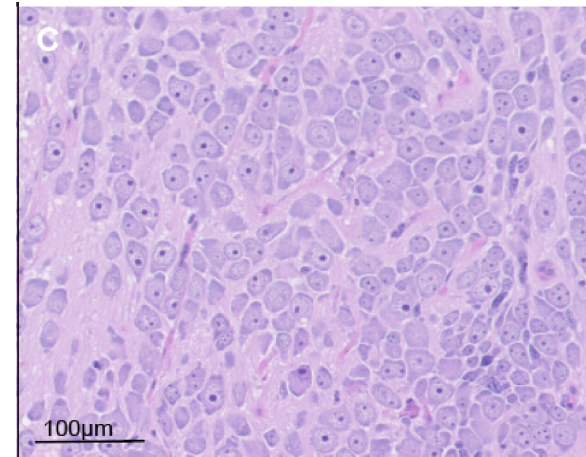
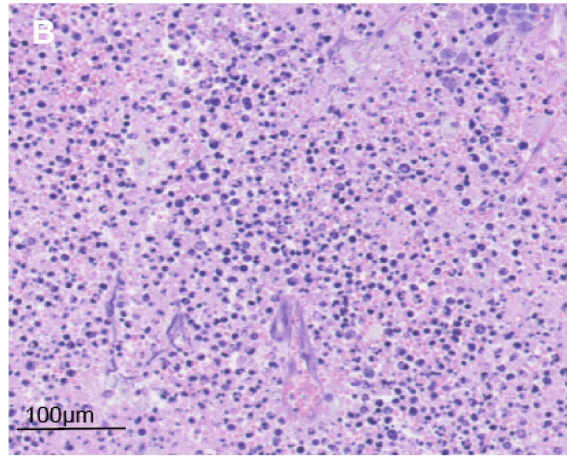
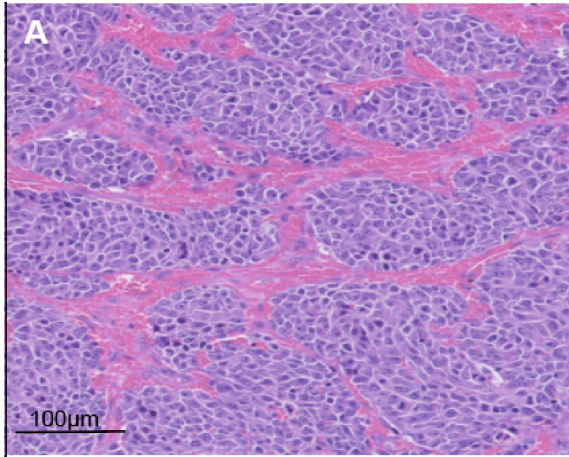
Digital Pathology

- Analysis of tissue samples under the microscope by pathologists – the “gold-standard” of cancer patient management
- Qualitative or semi-quantitative
- The new era of digital pathology
- Going forward: Full digitization
e.g. The PathLAKE consortium



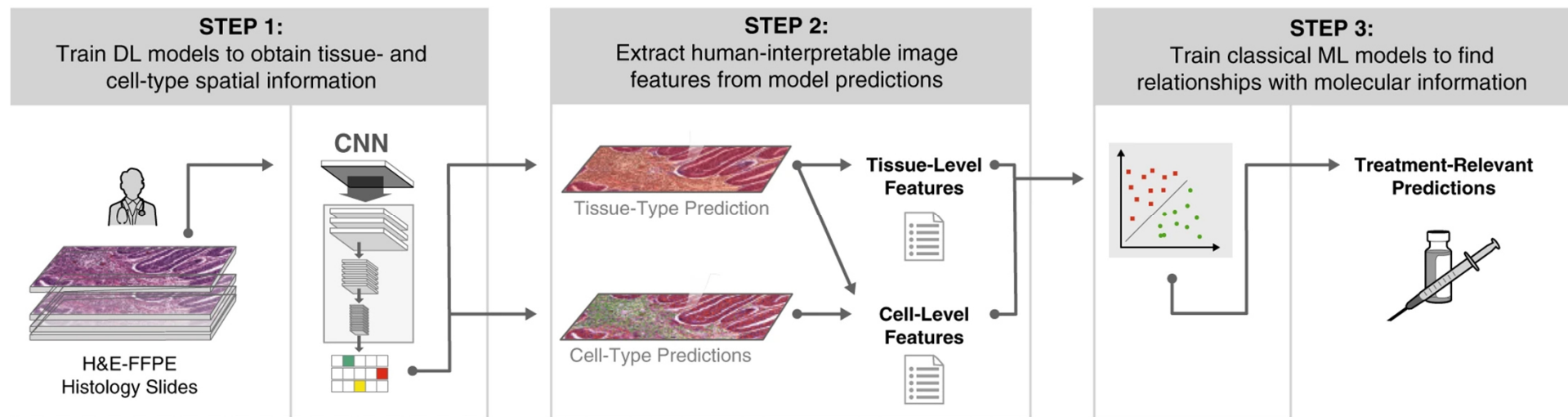
Digital Pathology – Sample heterogeneity

Pre-clinical Neuroblastoma (Th-*MYCN* transgenic mouse model)



Digital Pathology – Phenotypic quantification

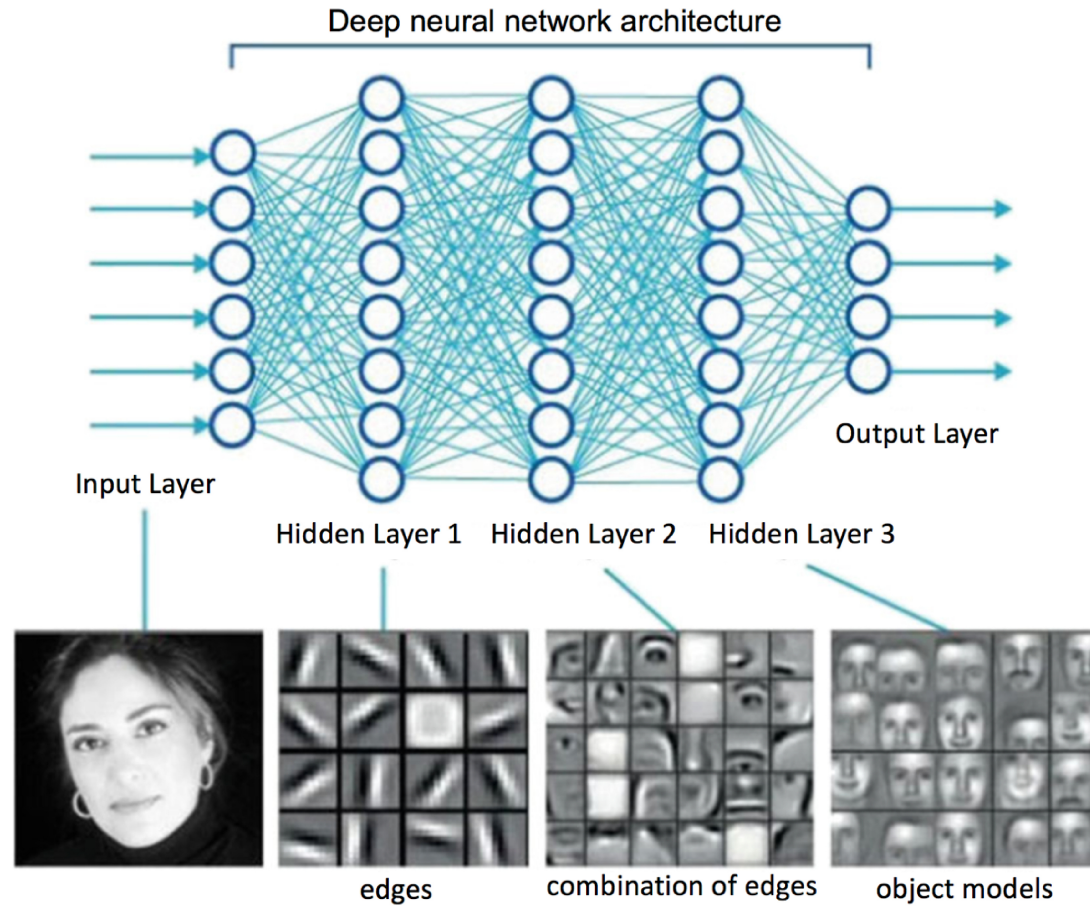
A typical pipeline



40x: $\sim 0.23\mu\text{m}$ / pixel
100K / 100K pixels, >1Gb



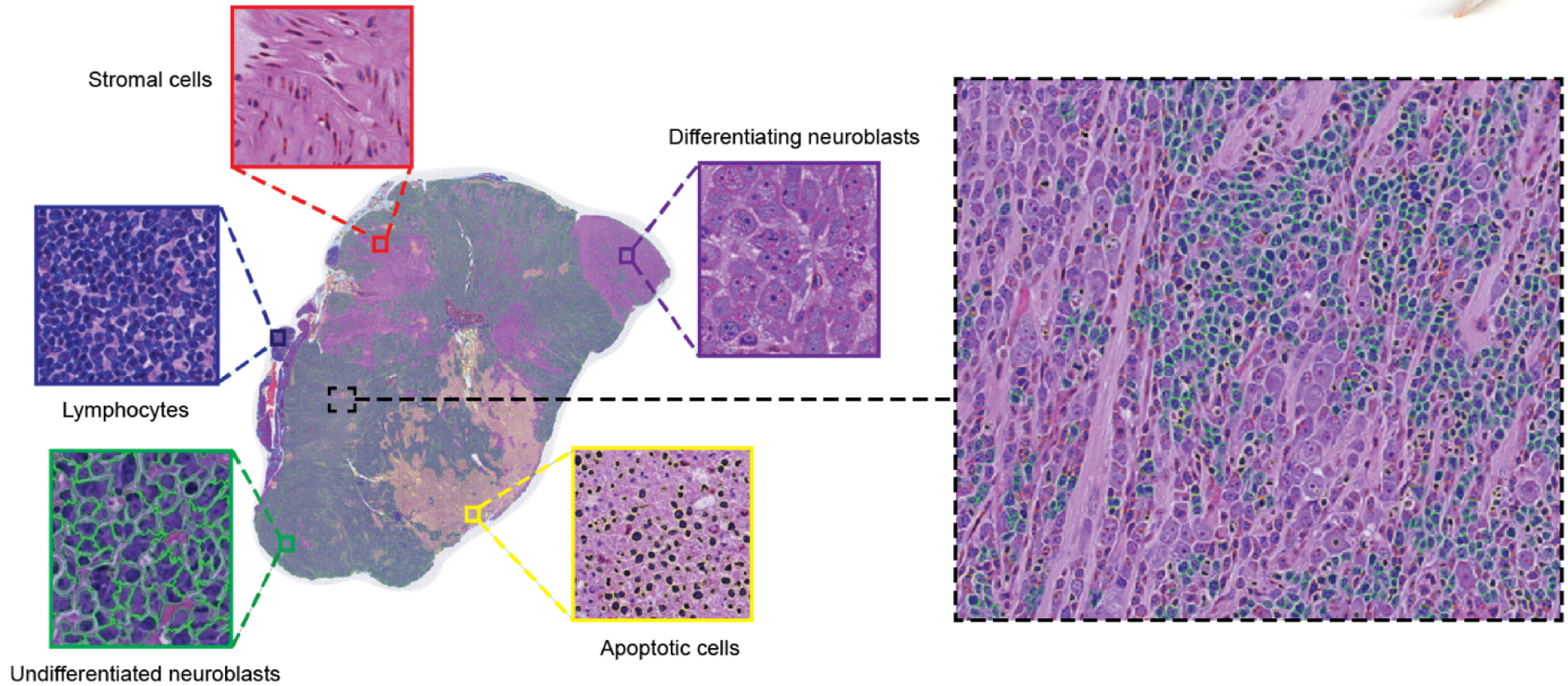
Deep learning – Computer Vision



Adapted from Artificial Intelligence in Medical Imaging: Opportunities, Applications and Risks








Digital Pathology – Phenotypic quantification

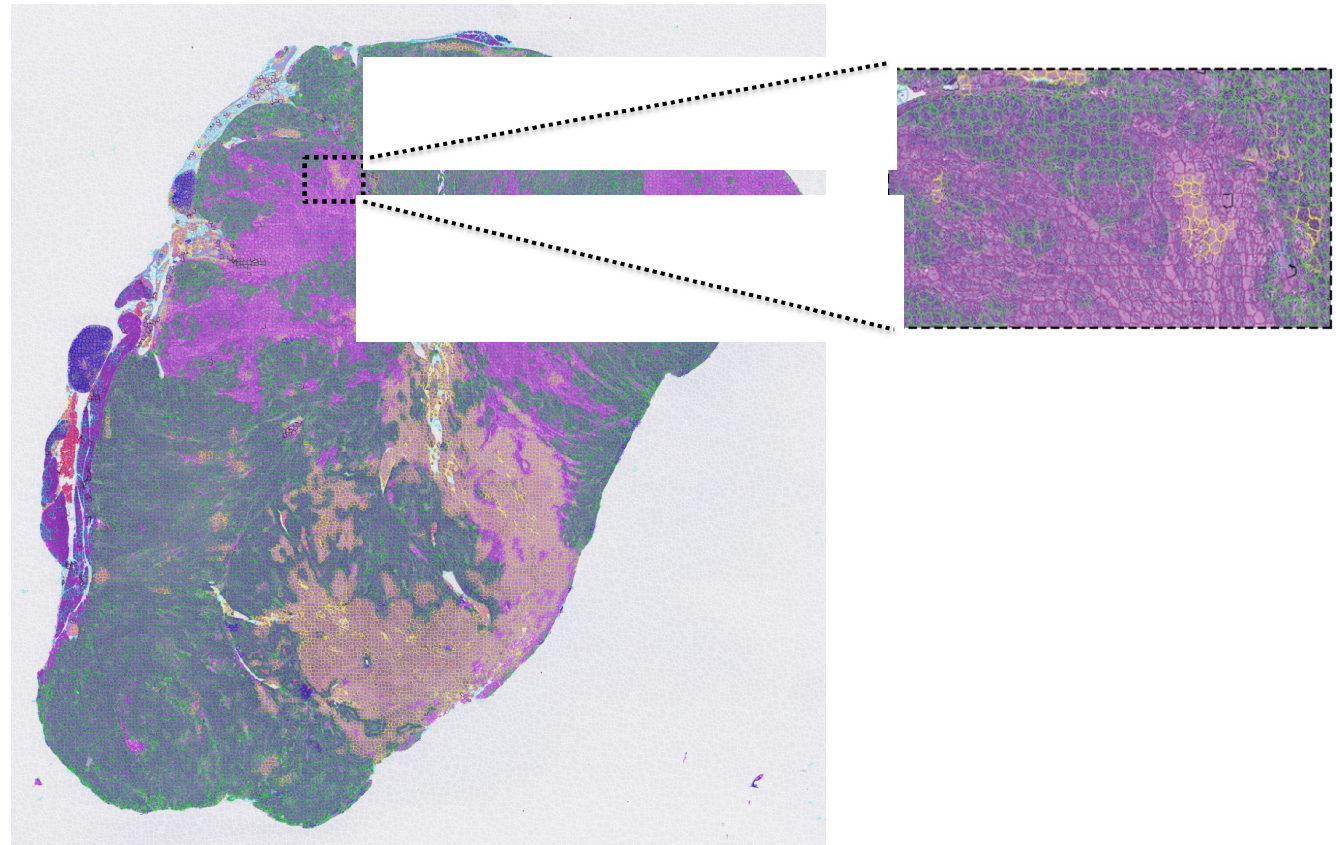
Cell segmentation / classification



Digital Pathology – Region / Tissue-level classification

Pre-clinical Neuroblastoma (Th-MYCN transgenic mouse model)

-  Tumour
-  Cell death
-  Differentiation
-  Blood
-  Lymphocyte cluster
-  Muscle
-  Other







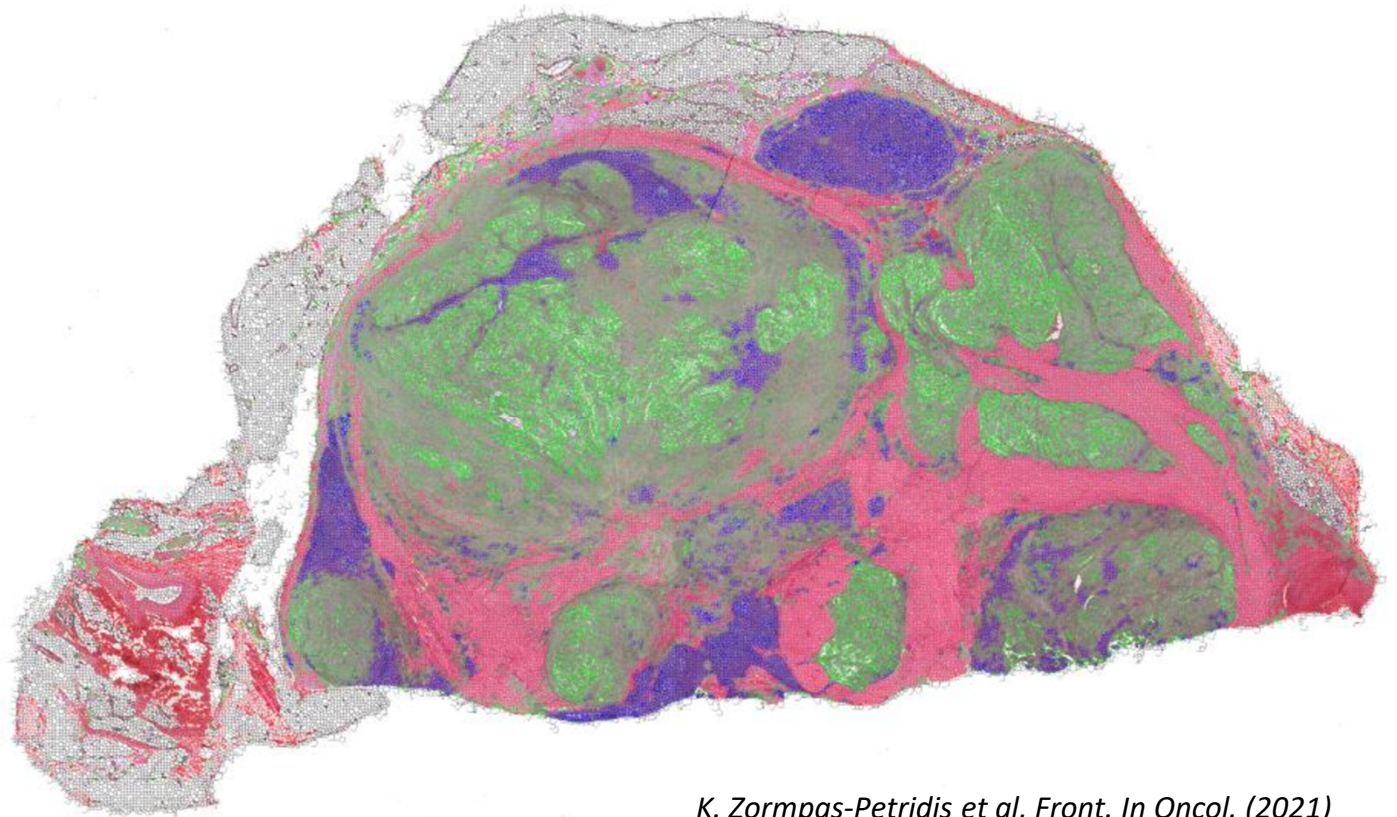
K. Zormpas-Petridis et al, Front. In Oncol. (2021)



Digital Pathology – Region / Tissue-level classification

Melanoma

-  Tumour
-  Stroma
-  Lymphocyte cluster
-  Fat







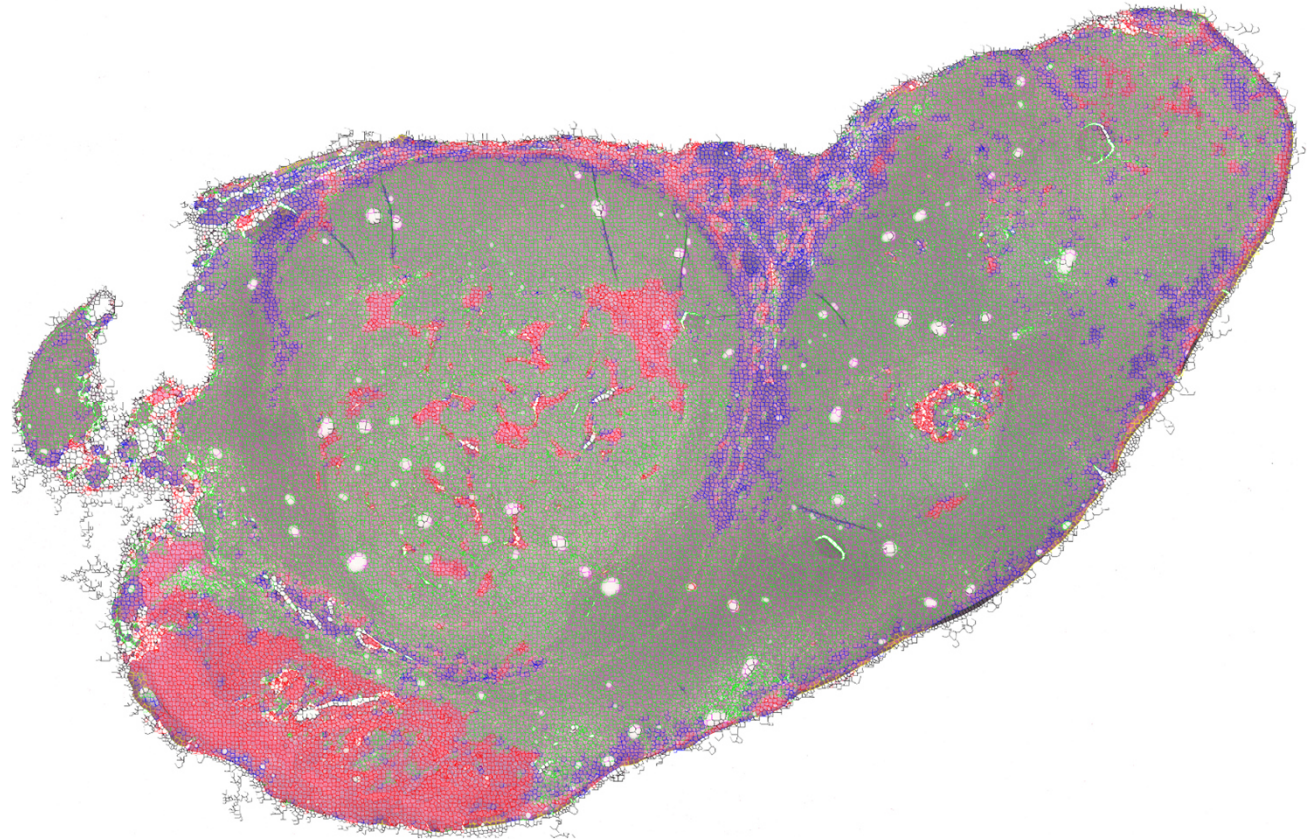
K. Zormpas-Petridis et al, Front. In Oncol. (2021)



Digital Pathology – Region / Tissue-level classification

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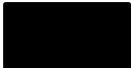


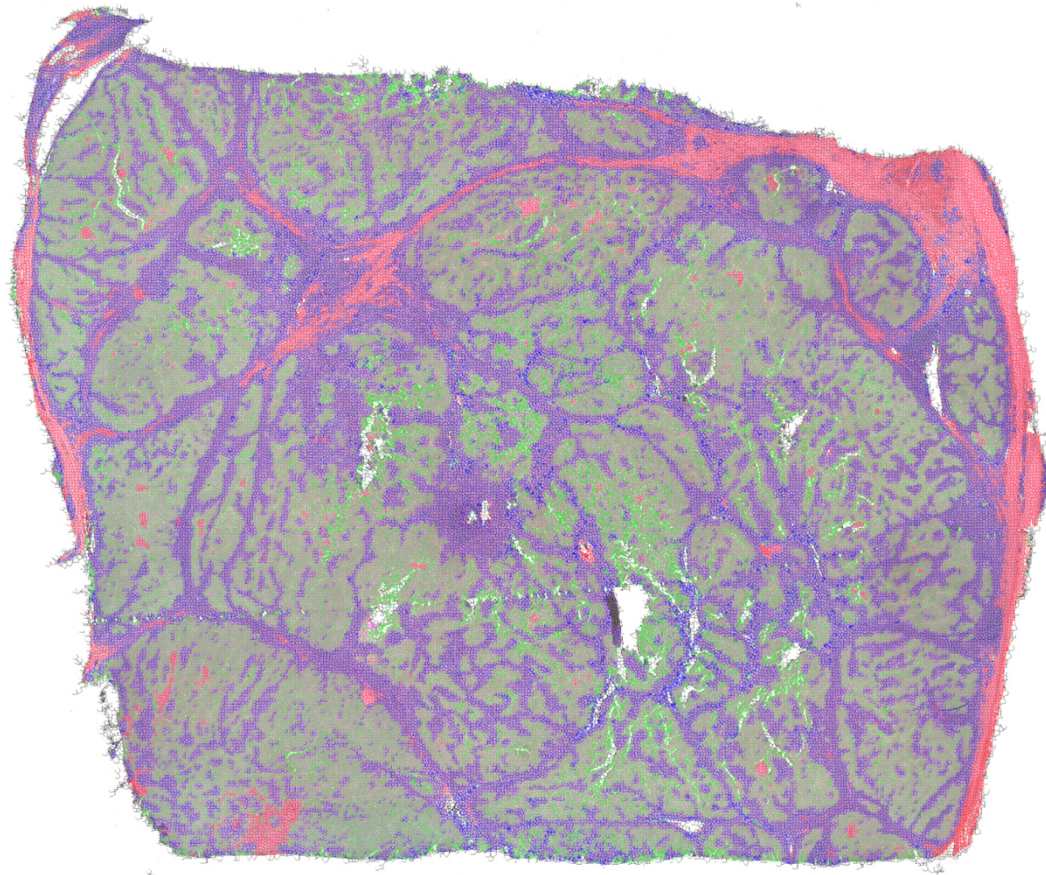
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Digital Pathology – Region / Tissue-level classification

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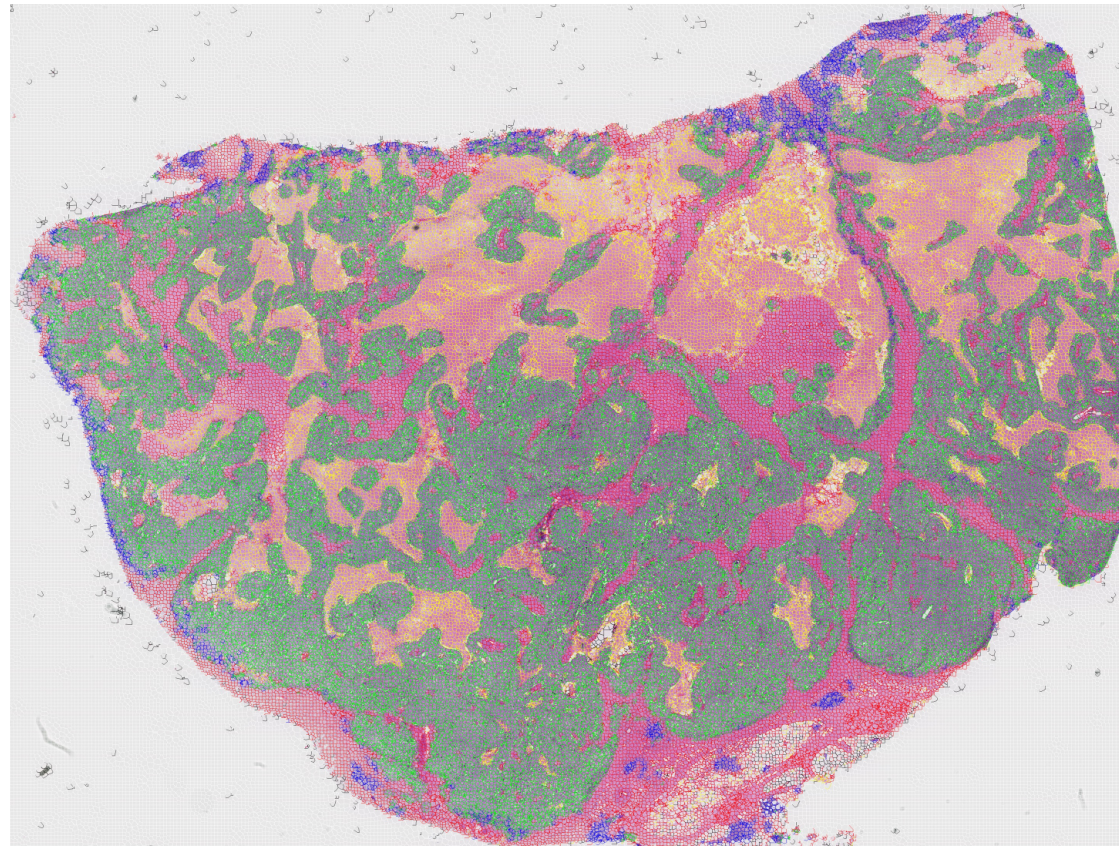
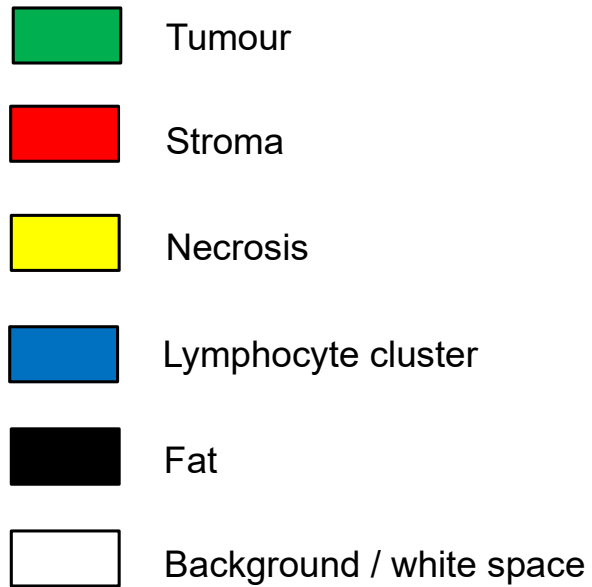


K. Zormpas-Petridis et al, Front. In Oncol. (2021)



Digital Pathology – Region / Tissue-level classification

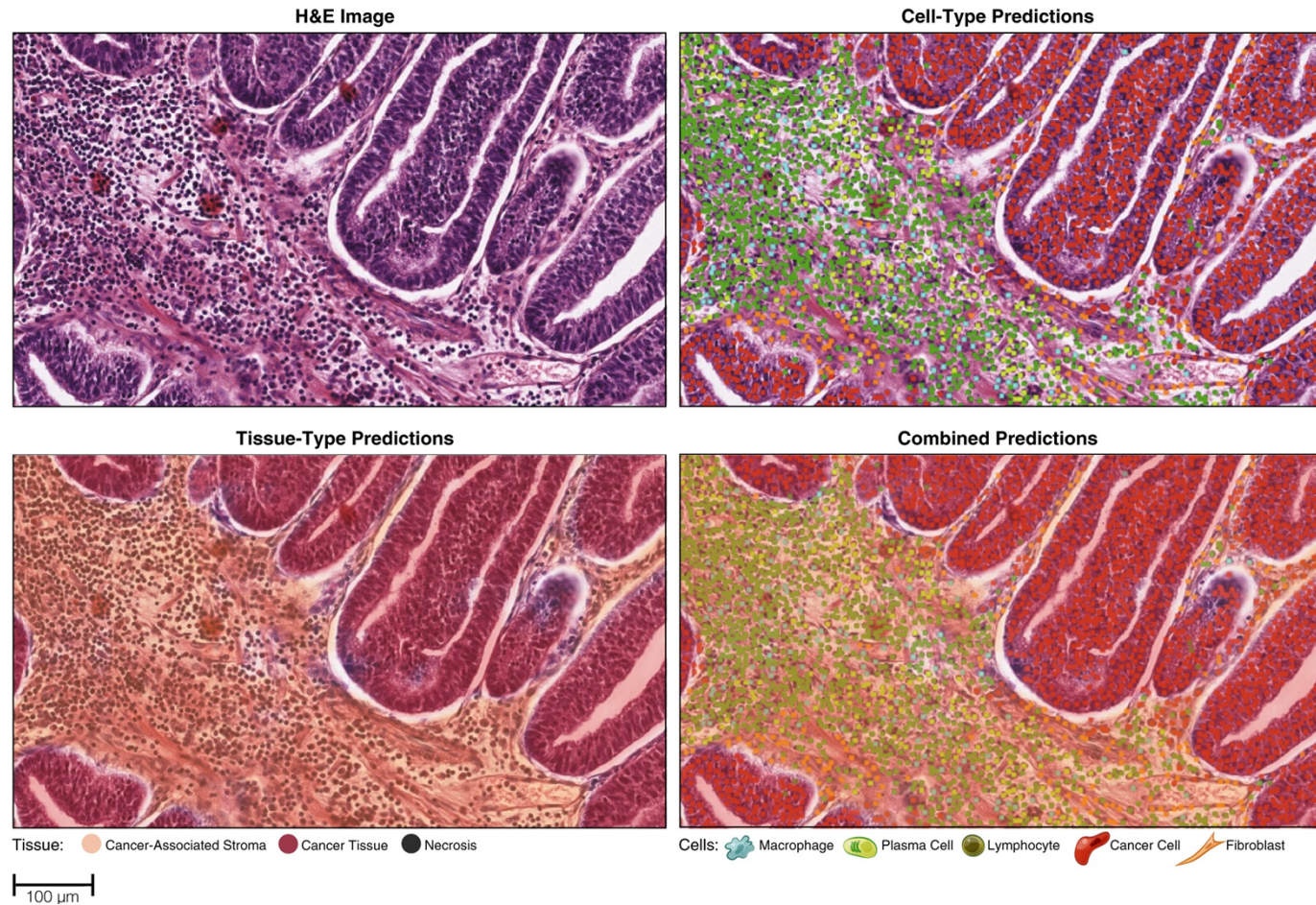
Triple-Negative Breast Cancer



K. Zormpas-Petridis et al, Front. In Oncol. (2021)



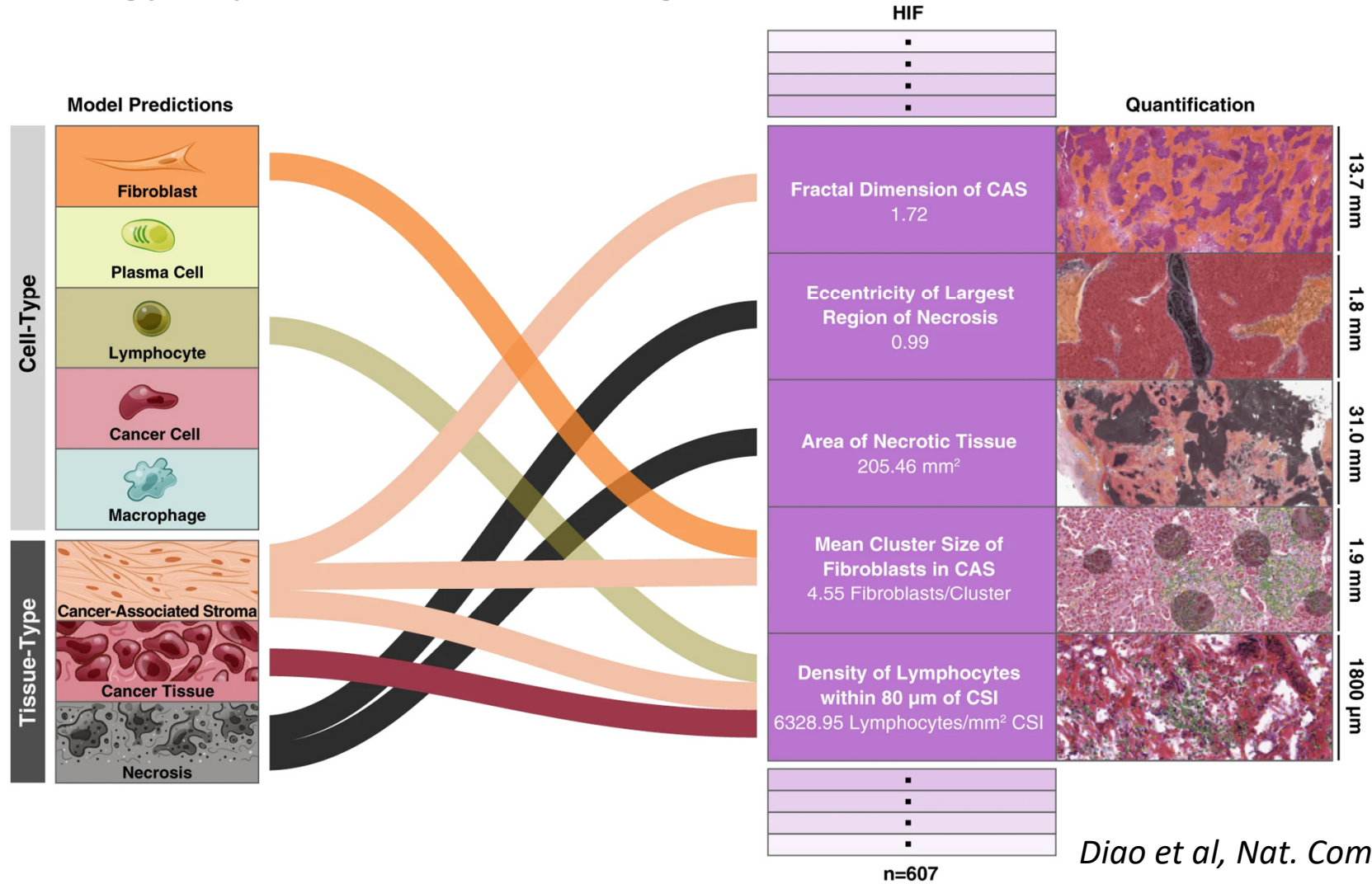
Digital Pathology – Spatial statistics / Biological features extraction



Diao et al, Nat. Comm. (2021)



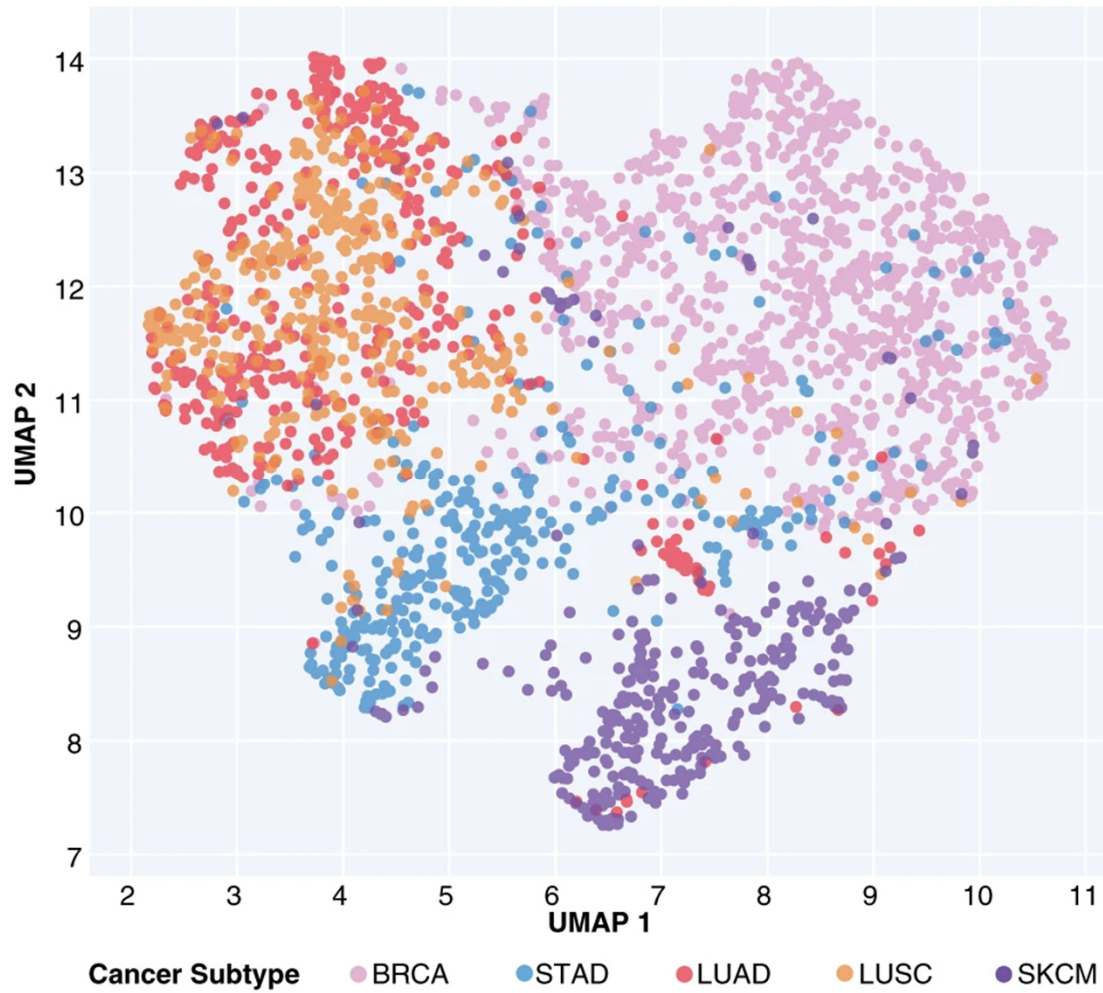
Digital Pathology – Spatial statistics / Biological features extraction



Diao et al, Nat. Comm. (2021)



Digital Pathology – Applications: Mutation prediction

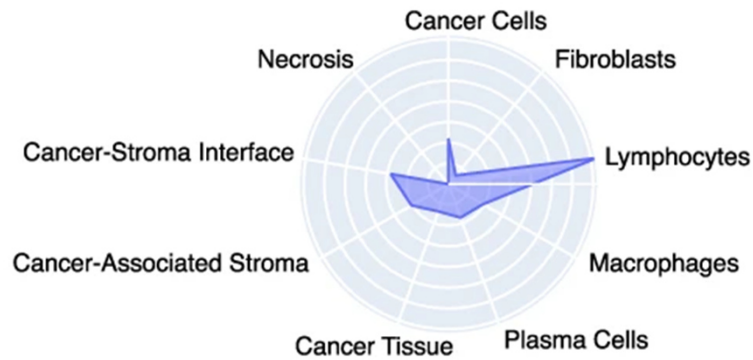


Diao et al, Nat. Comm. (2021)

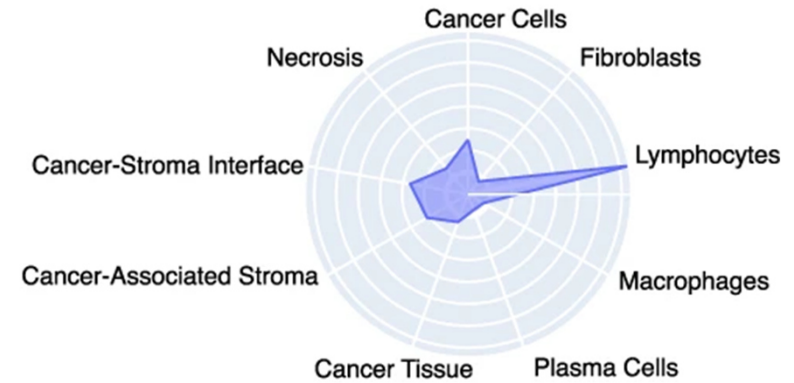


Digital Pathology – Applications: Mutation prediction

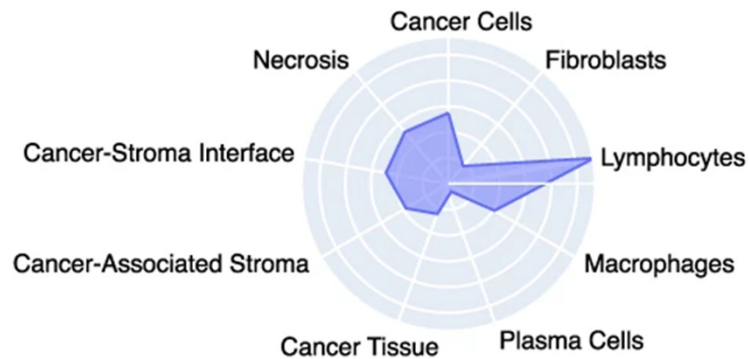
PD-1



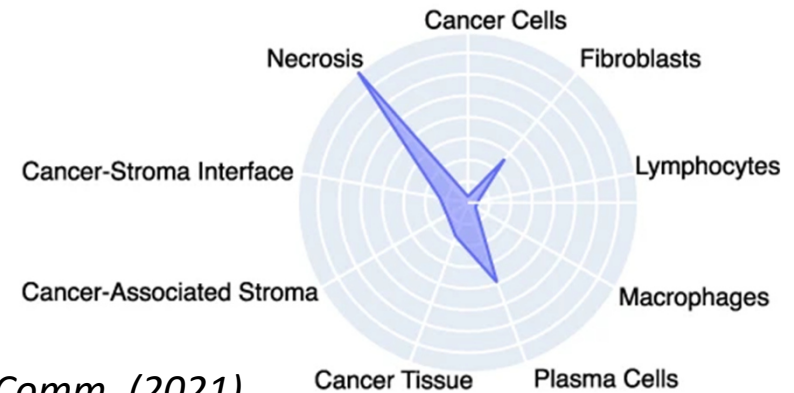
CTLA-4



PD-L1



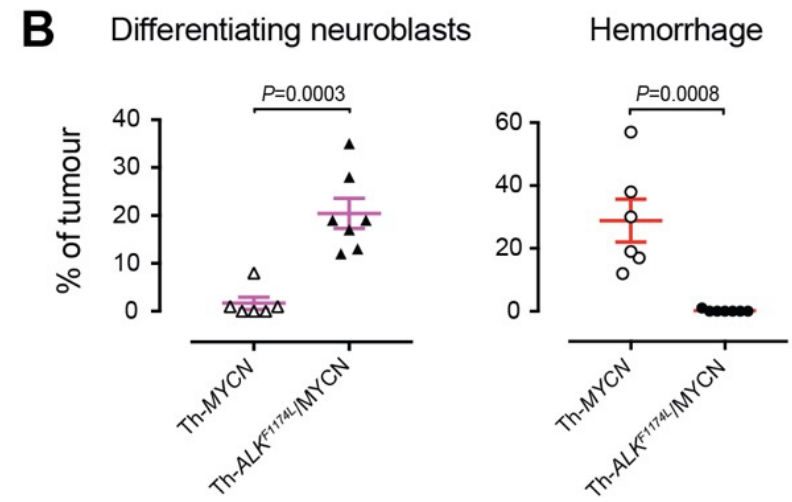
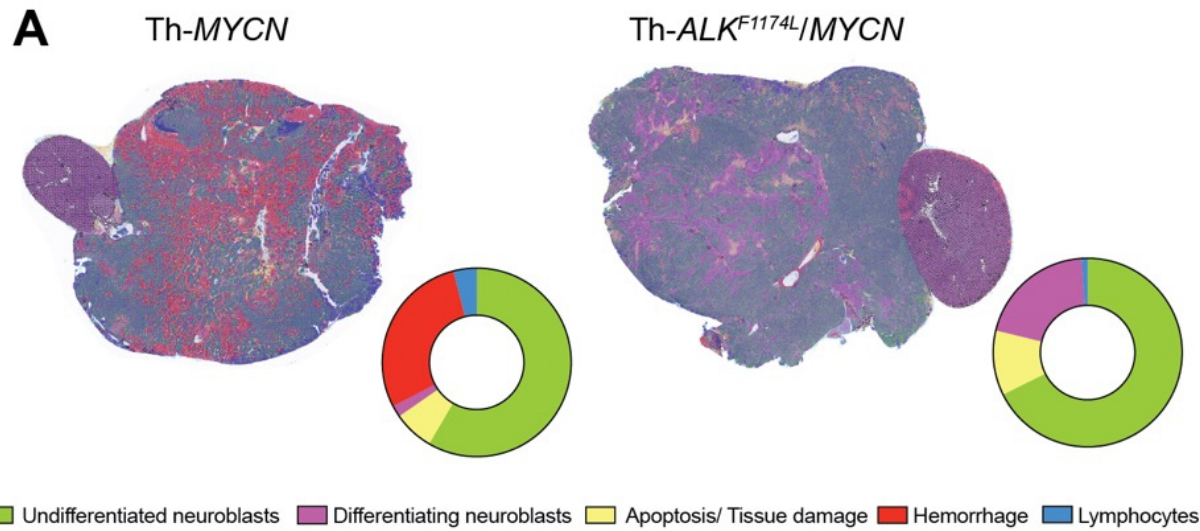
HRD



Diao et al, Nat. Comm. (2021)



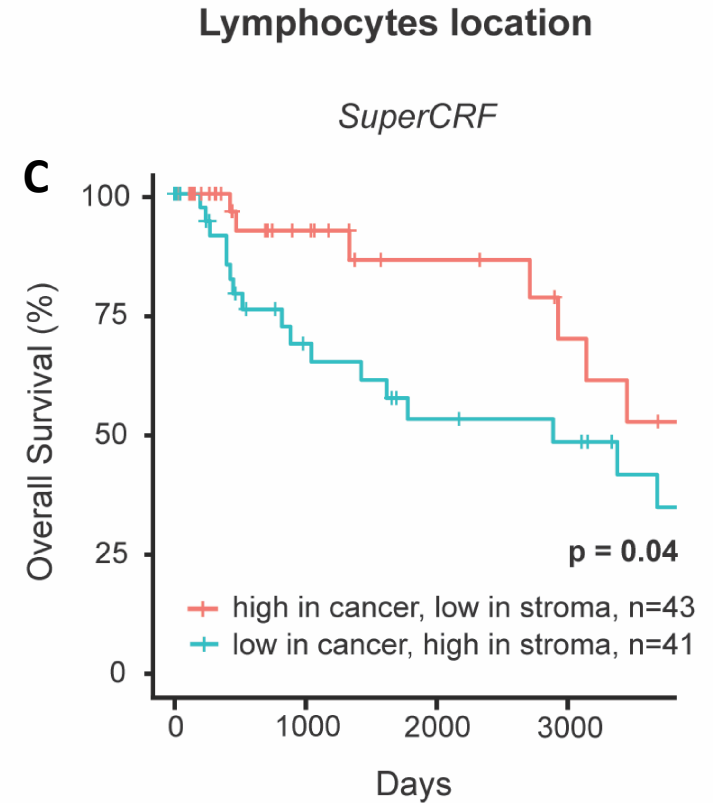
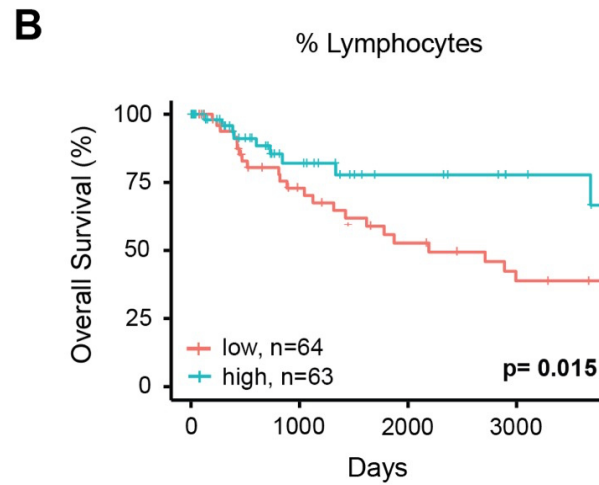
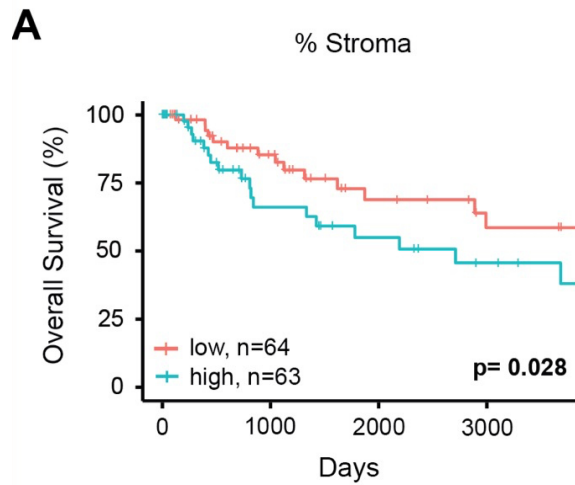
Digital Pathology – Applications: Mutation prediction



K. Zormpas-Petridis et al, *Front. In Oncol.* (2021)



Digital Pathology – Applications: Survival prediction

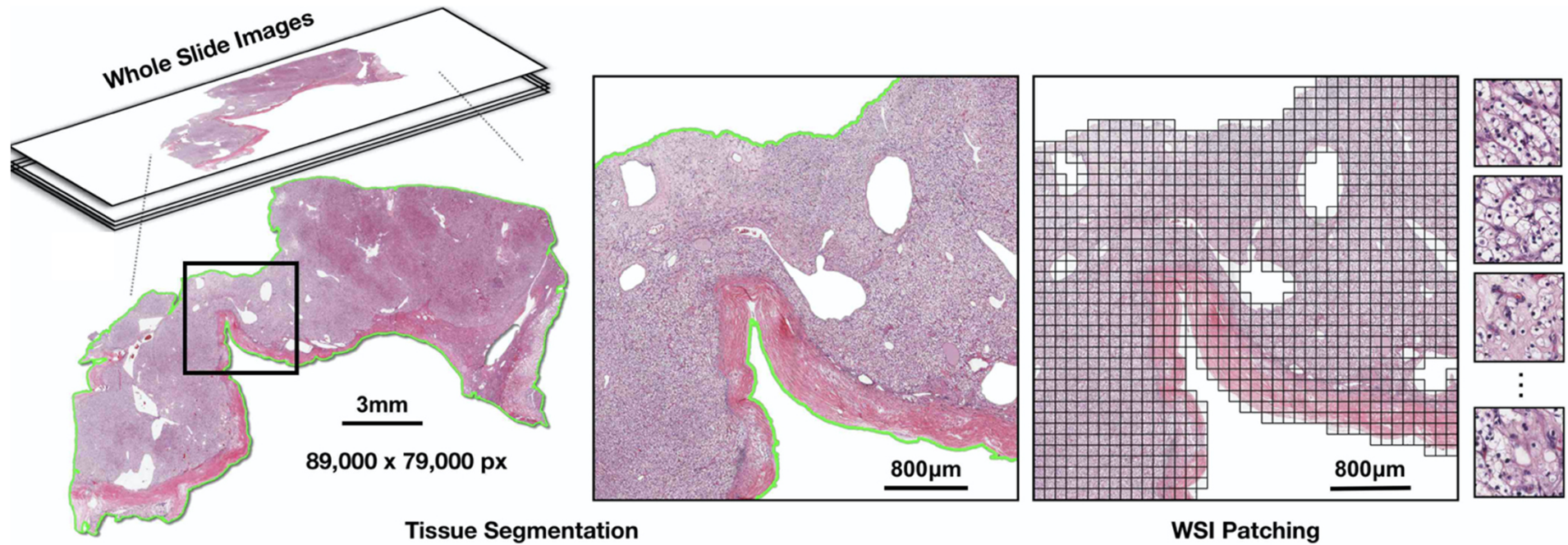


K. Zormpas-Petridis et al, *Front. In Oncol.* (2019)
K. Zormpas-Petridis et al, *COMPAY MICCAI* (2018)



Digital Pathology – Fully deep learning-based pipeline

Attention mechanisms for interpretability

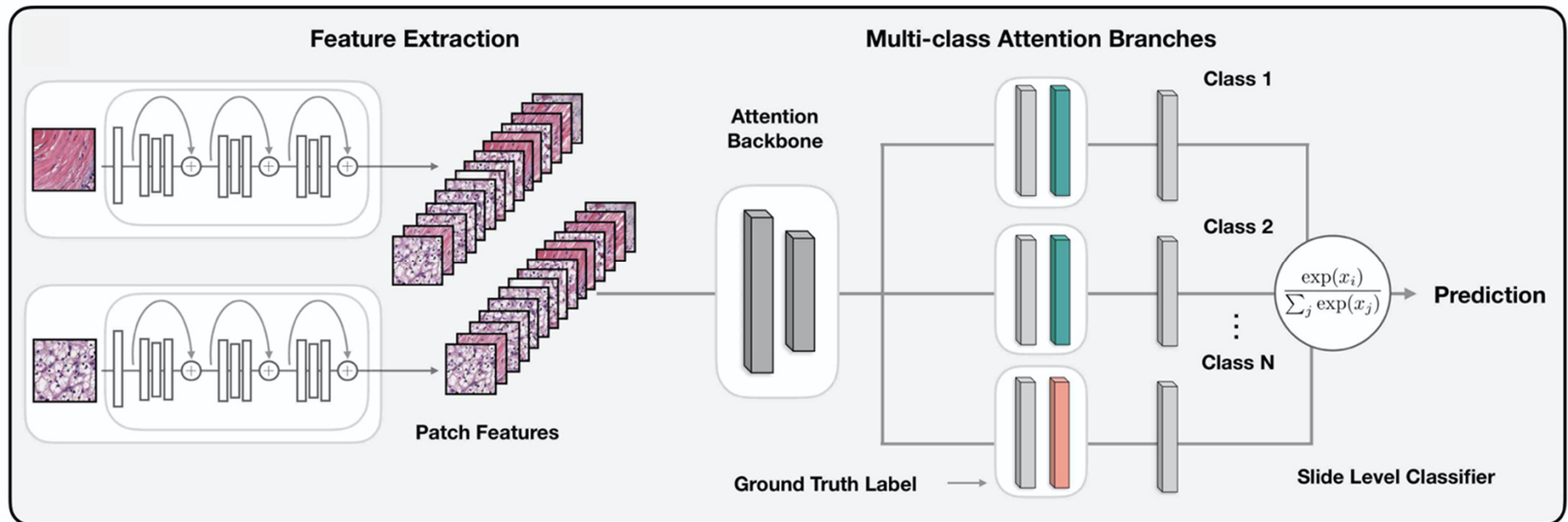


Lu et al, Nat. Biomed. Eng. (2021)



Digital Pathology – Fully deep learning-based pipeline

Attention mechanisms for interpretability

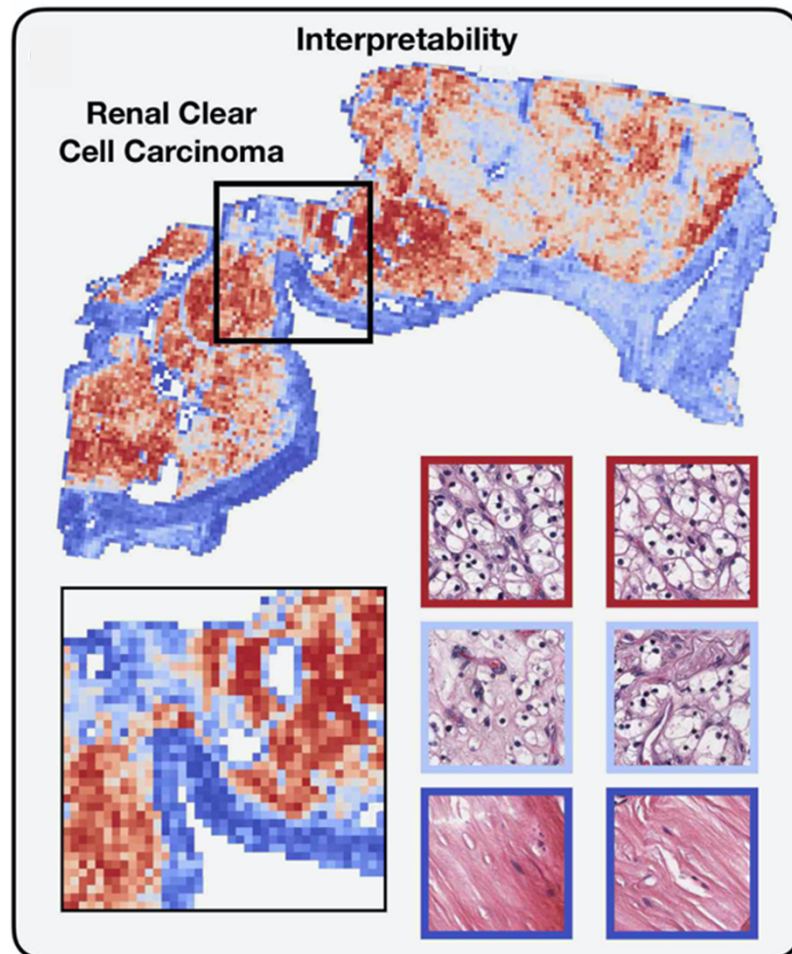


Lu et al, Nat. Biomed. Eng. (2021)

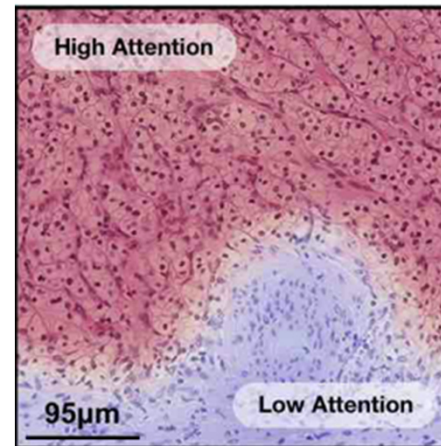


Digital Pathology – Fully deep learning-based pipeline

Attention mechanisms for interpretability



- Reverse engineering the biological mechanisms based on regions with high attention



Lu et al, Nat. Biomed. Eng. (2021)



Digital Pathology

Advantages

- Quantitative
- Reproducible
- Objective
- Novel biomarker discovery

Disadvantages

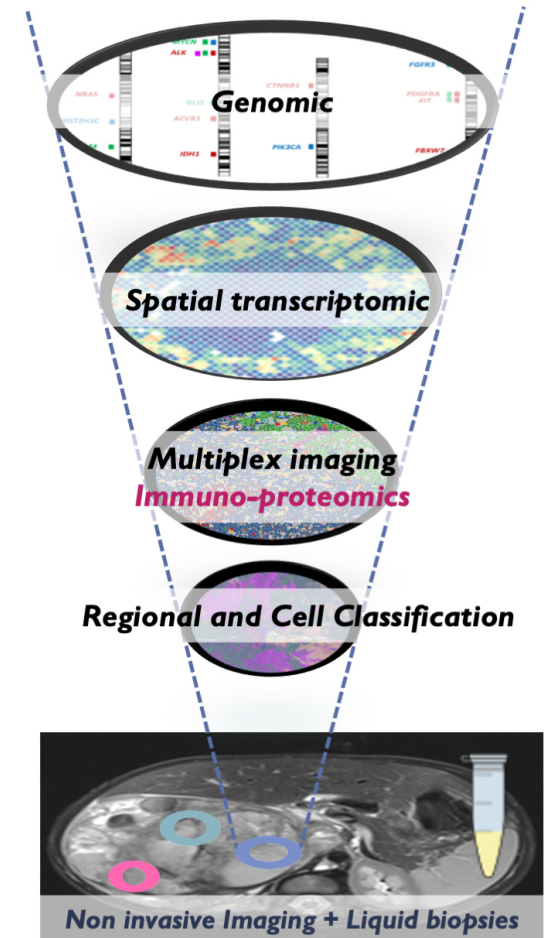
- Dependent on training dataset and current technology
- Need of extensive validation and optimization on new datasets
- Lack of full interpretability
- Long research time / difficult to adapt



Combination of medical data in a spatial manner

Types of medical data

- Genomic
- Transcriptomic
- Proteomics
- Histopathology
- Medical imaging



With the right understanding, digital pathology can be an invaluable tool to assist the pathologists

Courtesy of Dr. Yann Jamin

