## Medical image interpretation challenges and research activities of the tAlmedIA group at UniBS

Alberto Signoroni, Mattia Savardi, Davide Farina, Sergio Benini, Edoardo Coppola, Damiano Ferrari, Mauro Massussi, Salvatore Curello, Michele Svanera, Giuseppe D'Ancona





DEGLI STUDI BRESCIA 

May 29-31, 2023



## **Current main research activities**

#### **Brain imaging and Neuroscience**

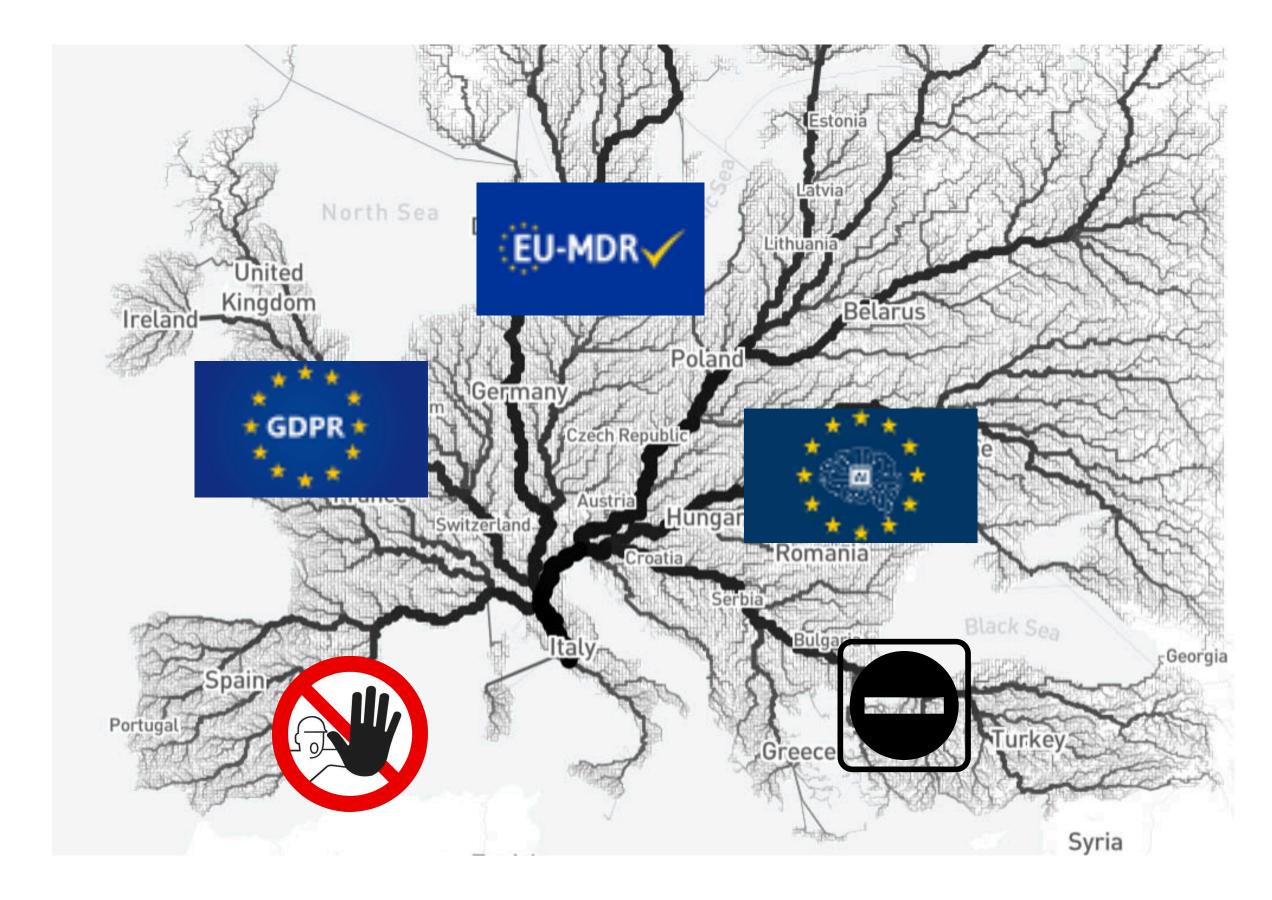
- Structural Brain imaging (MRI)
  - Brain segmentation, morphometry
- Functional Brain imaging (fMRI)
  - Brain decoding

### Cardiothoracic imaging and signals

- COVID-19 severity assessment on Chest X-ray
- Cardiothoracic risk factors prediction on Chest X-ray and ECG

### **Trustworthy Al**

- User-driven/Patient-driven design (Explainability, Deployment,...)
- Regulation (GDPR, SaMD, Al-acts)
- Ethics and Trustworthiness audits (e.g. Z-inspection)



#### Glasgow stitute of

Neuroscience and

London

Segmentation of brain structures from MRI Psychology, University of Glasgow

INDILII

From 2018

#### Kinga

WALES ENG

SCOT.

Amsterdam

Leiden

Denmark

Hamburg

Berlin

Vivantes

Klinikum

Cardiotoracic

Cardiac risk

factors

Austria

Naples

Italy

Tripoli

imagning, ECG,

Uzechia

Croatia

From 2019

Poland

Slovakia.

Serbia

Albonia

Leiden University Medical Center many

Cardiac risk factors

#### France

ML and DL applied to nedical image and gnal understganding ligital microbiology, 3D computer vision and graphics, TLC and lemedicine

#### Brescia

University of Bresc ASST Spedali Civili Copan Italia Open Technologies Gexcel, Antares Vision

Switze

Tunisia

Spain

#### Barcelona

Portugal

Algiers

### Collaborations

Alberto Signoroni, PhD, Associate Prof. ING-INF/05 Dip. Specialità Medico-Chirurgiche, Scienze Radiologiche e Sanità Pubblica - UniBS alberto.signoroni@unibs.it

Sergio Benini, PhD, Associate Prof. ING-INF/03 Dip. Ingegneria dell'Informazione -UNIBS sergio.benini@unibs.it

Mattia Savardi, PhD, RTD-a ING-INF/05 Dip. Specialità Medico-Chirurgiche, Scienze Radiologiche e Sanità Pubblica - UniBS mattia.savardi@unibs.it

Israel

From 2018

Lith

Ro

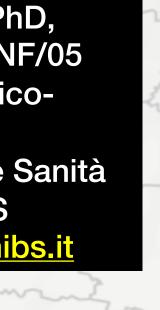
Gre

Cyprus

Cognitive Neuroscience: Functional fMRI image analysis, Deep Learning for Brain decoding From 2018

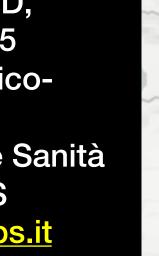
#### **Tel Aviv**

Sagol Brain Institute, Wohl Institute for Advanced Imaging







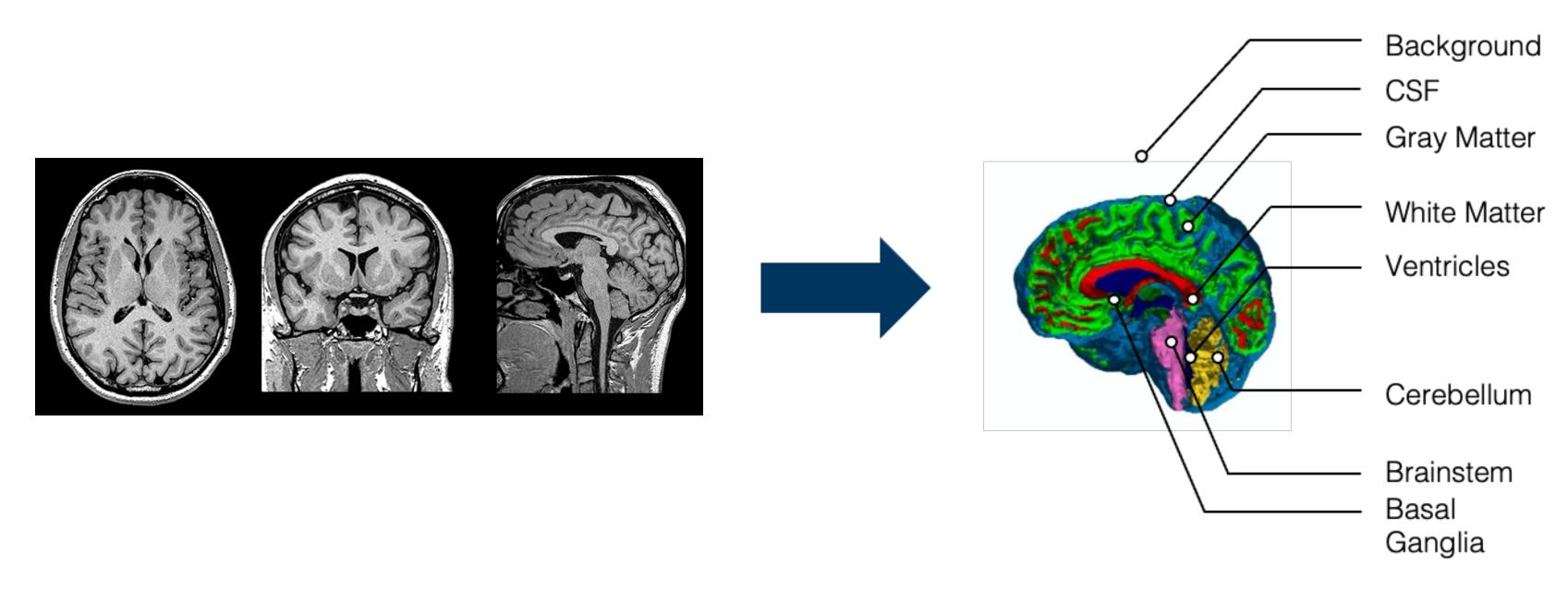






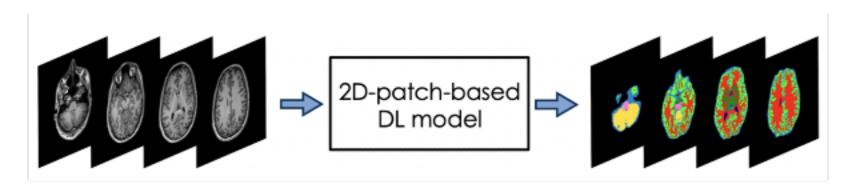
## **Brain MRI segmentation 3-Tesla**

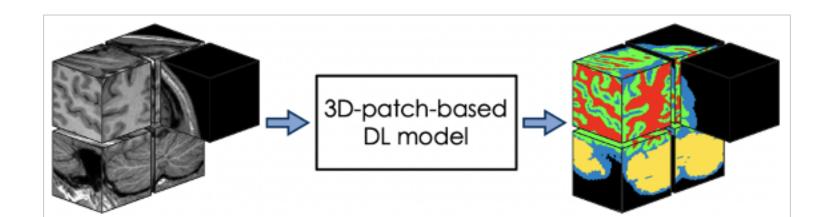


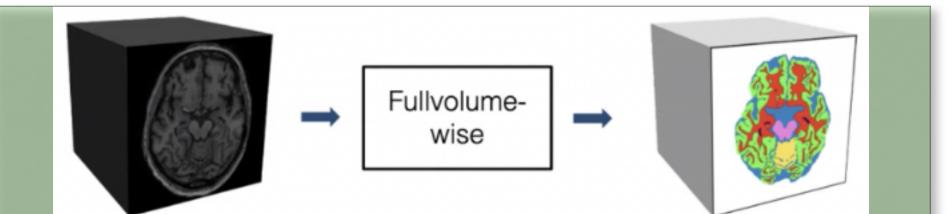


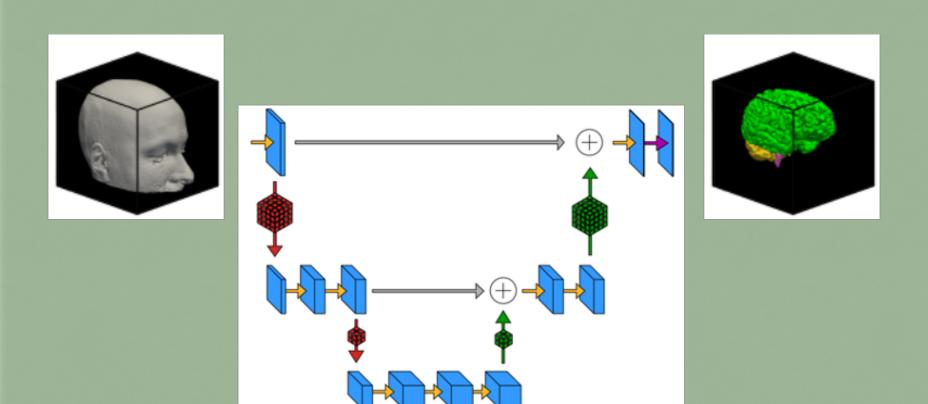
MICCAL <u>Challenge</u>

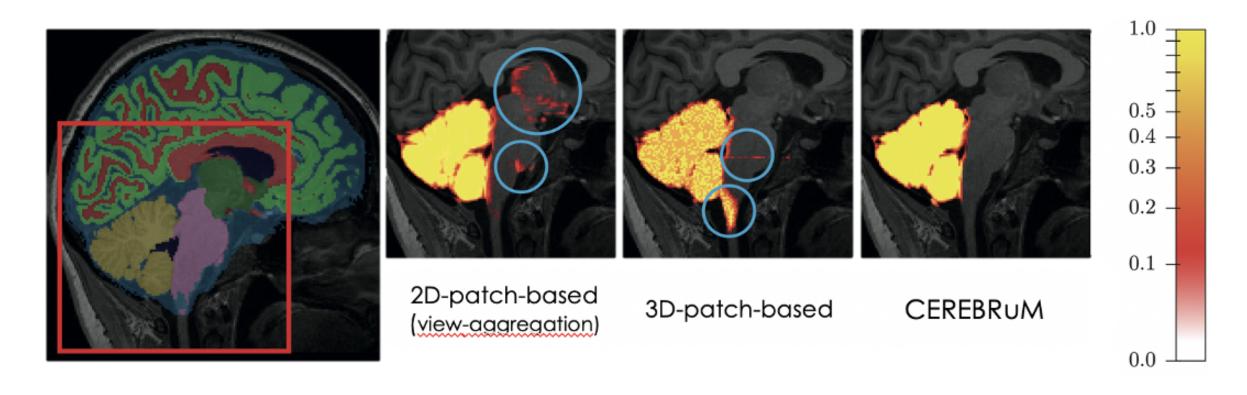
## **Brain MRI segmentation**

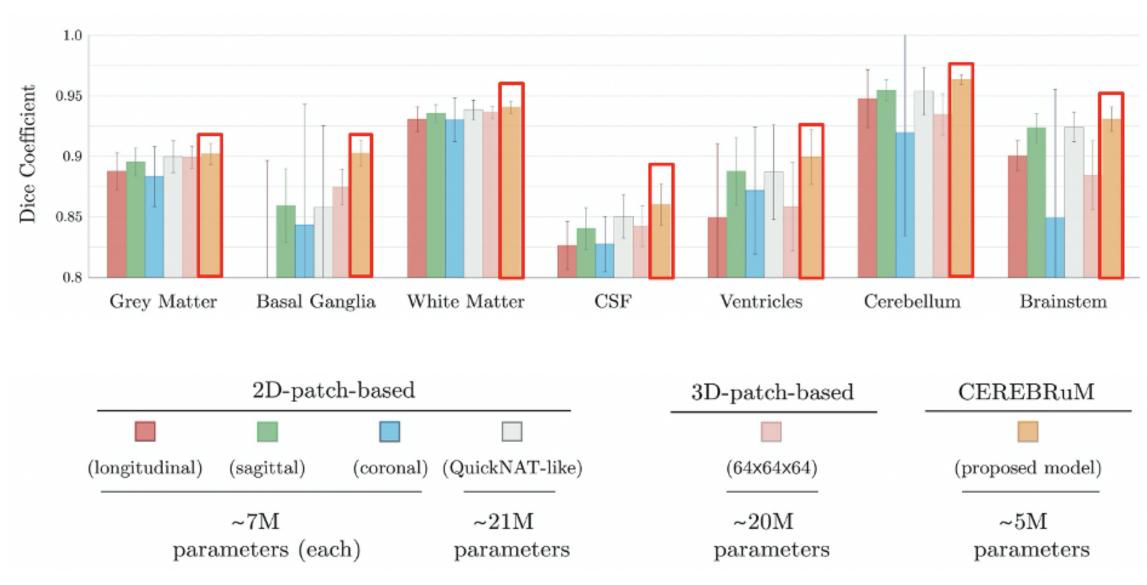












D. Bontempi, S. Benini, A. Signoroni, M. Svanera, L. Muckli,

"CEREBRUM: a fast and fully-volumetric Convolutional Encoder-decodeR for weakly-supervised sEgmentation of BRain strUctures from out-of-the-scanner MRI", in *Medical Image Analysis*, Volume 62, May 2020.





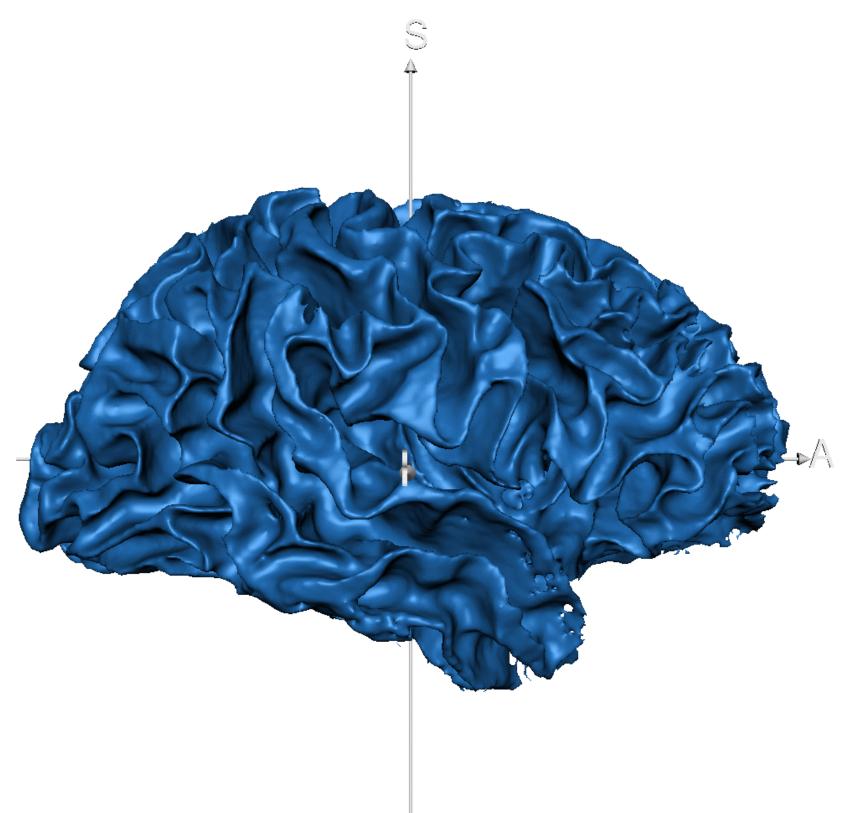


## **Extension to 7-Tesla**

### **Single-site**



#### https://rocknroll87q.github.io/cerebrum7t/results\_glasgow

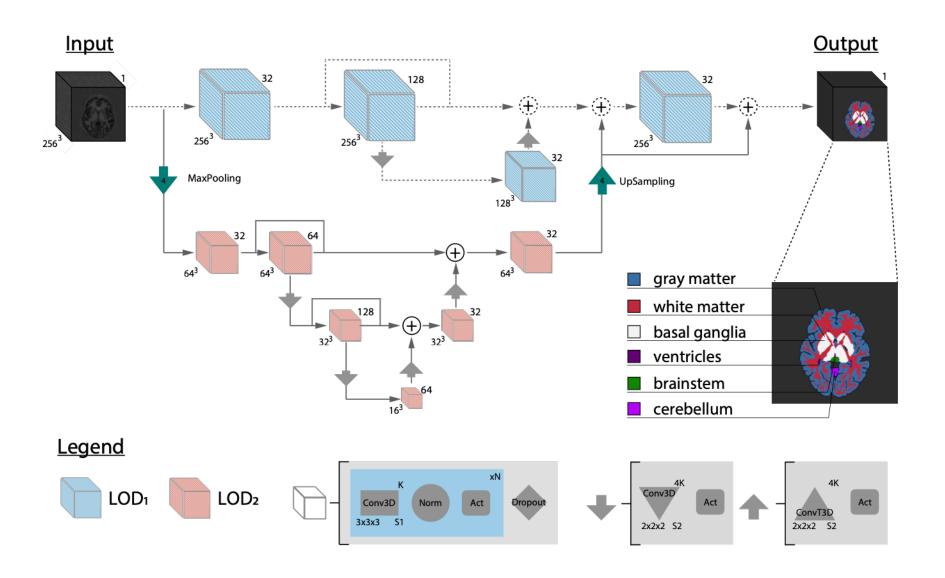


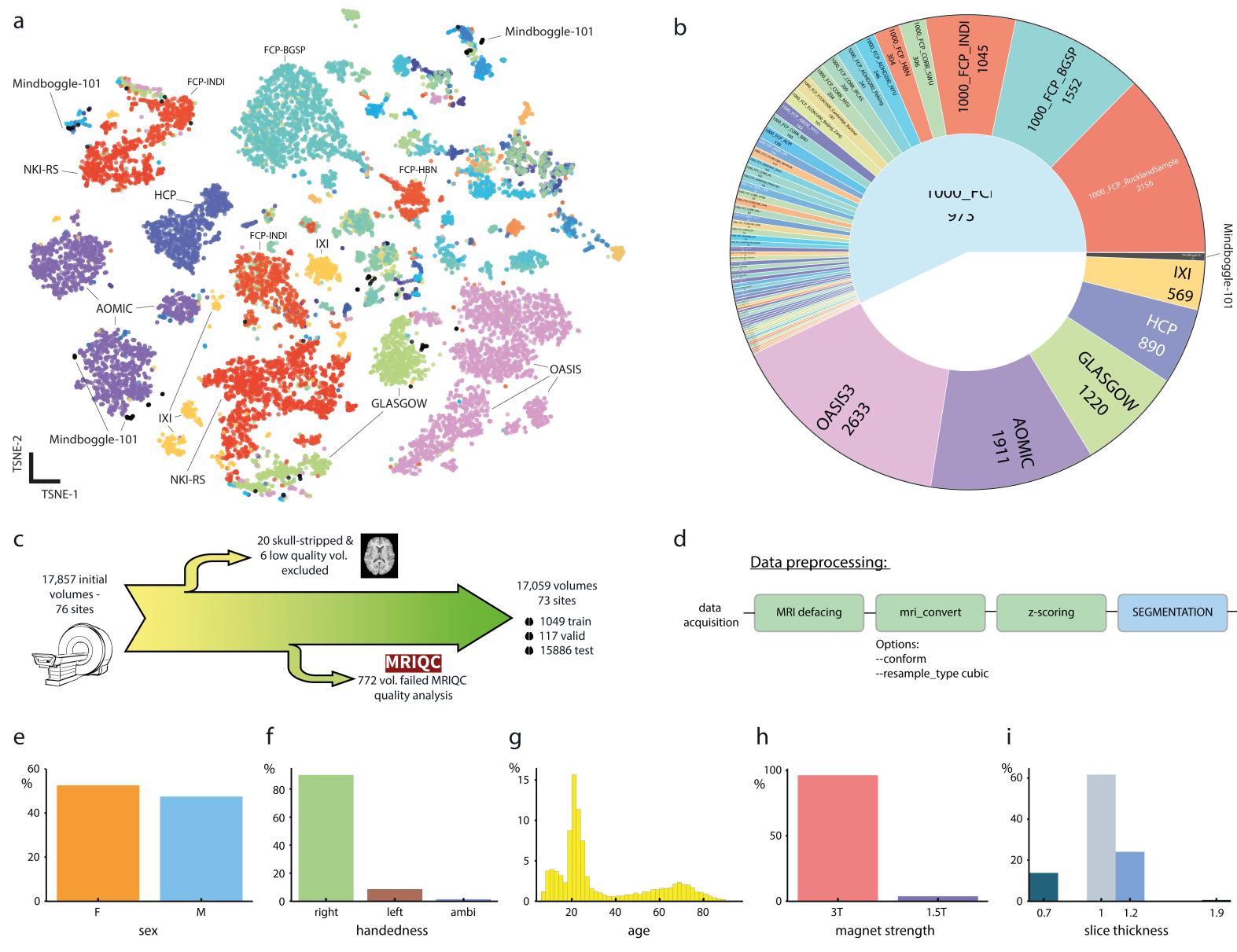
M. Svanera, S. Benini, D. Bontempi, and L. Muckli, "CEREBRUM-7T: Fast and Fully-volumetric Brain Segmentation of 7 Tesla MR Volumes", in *Human Brain Mapping*, Volume 42, Issue 17, December 1, 2021, Pages 5563-5580, October 2021.

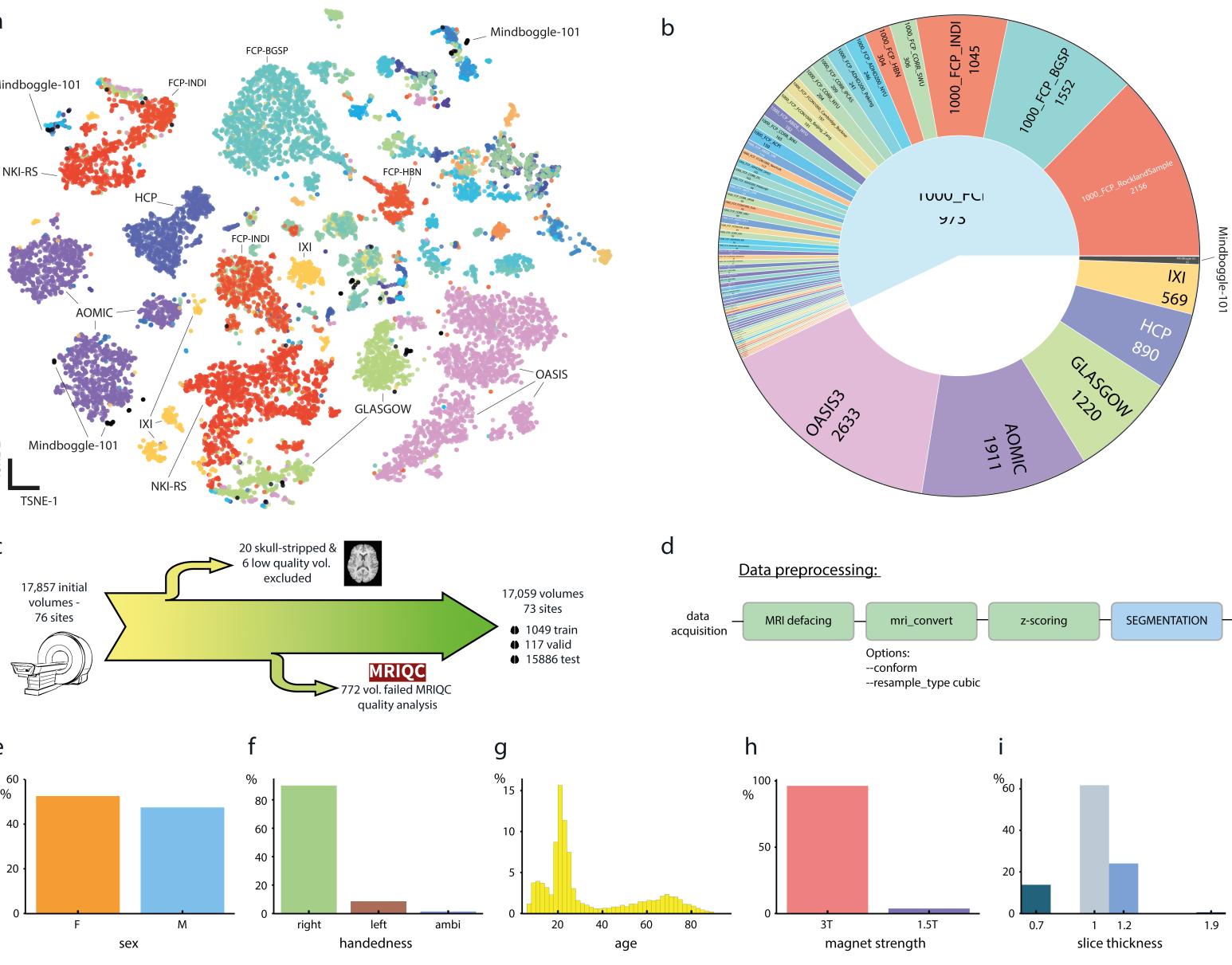
## Fighting the scanner effect in brain MRI segmentation on multi-site data

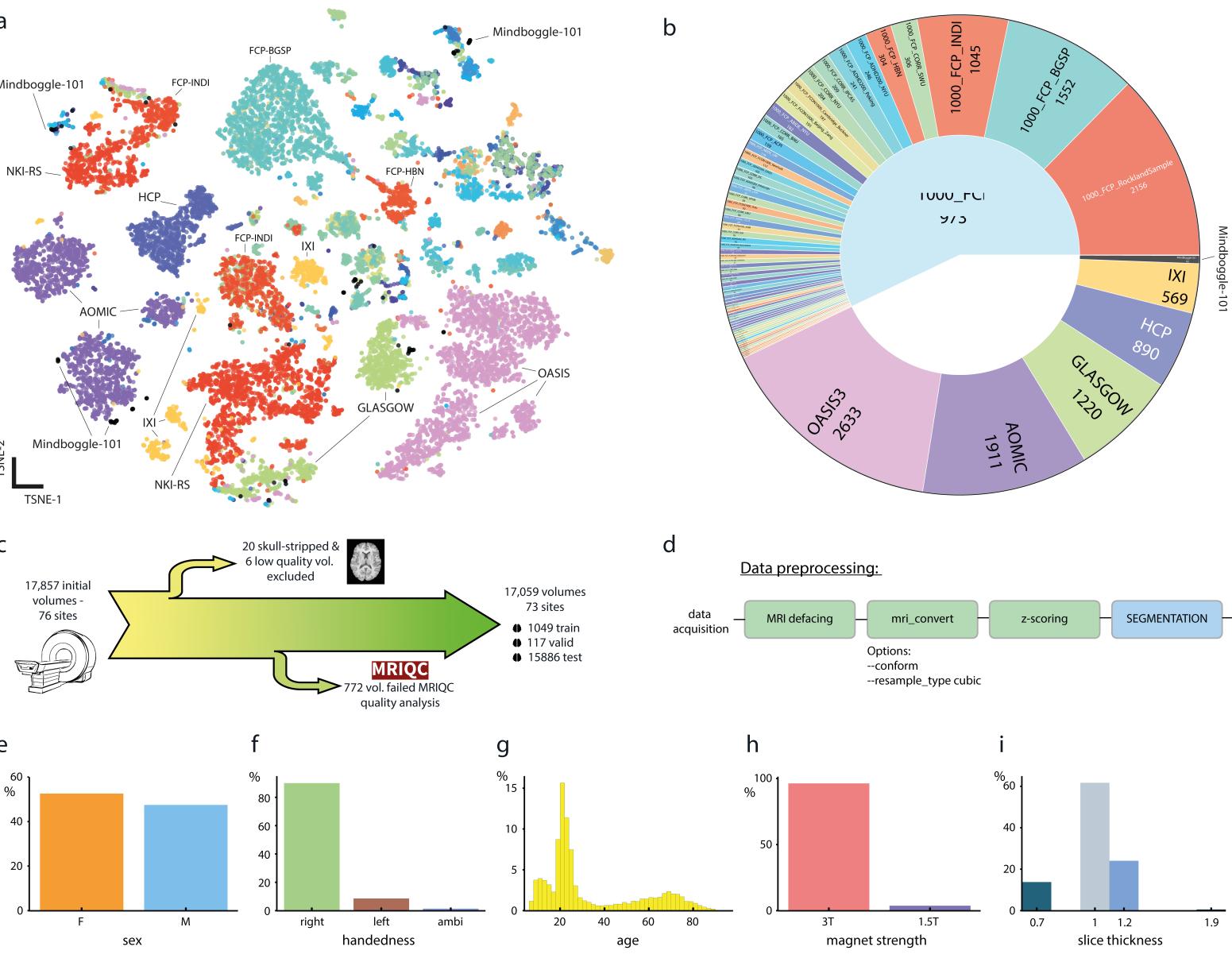
https://arxiv.org/abs/2211.02400 (under review)

- 17,000 scans
- 73 sites
- 3T and 7T







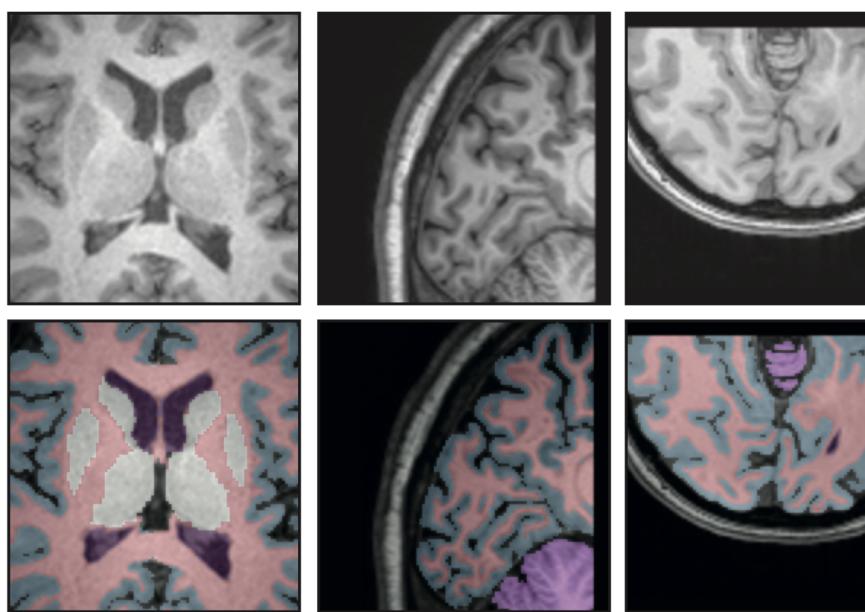


## **Multi-site brain MRI segmentation** Visual results: internal and external validation data

MindBoggle101\_HLN-12-10 (external)

MindBoggle101\_MMRR-21-10 (external)

MindBoggle101\_NKI-RS-22-1 (internal)



T1w

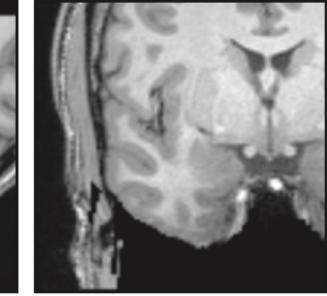
FS + manual correction

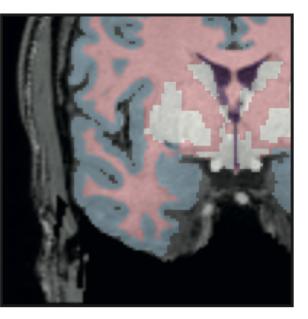
predicted

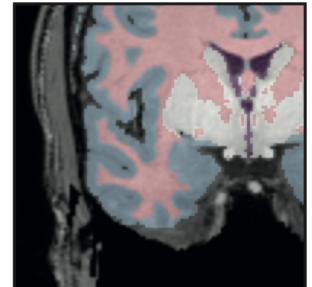
MindBoggle101\_NKI-RS-22-19 (internal)

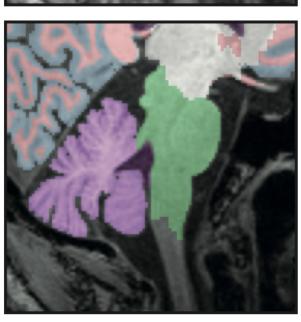
(external)

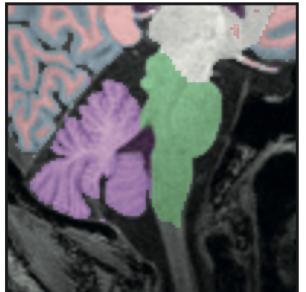
MindBoggle101\_NKI-TRT-20-1 MindBoggle101\_OASIS-TRT-20-19 (external)

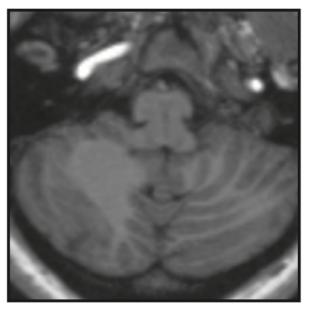


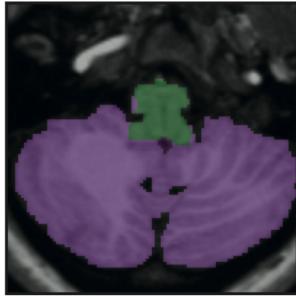


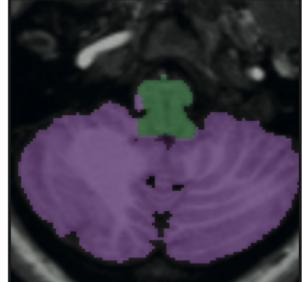






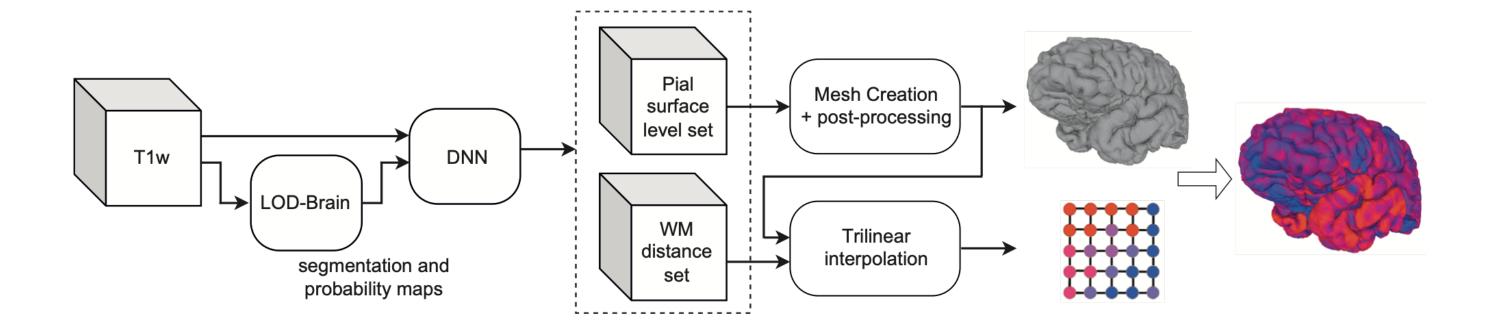




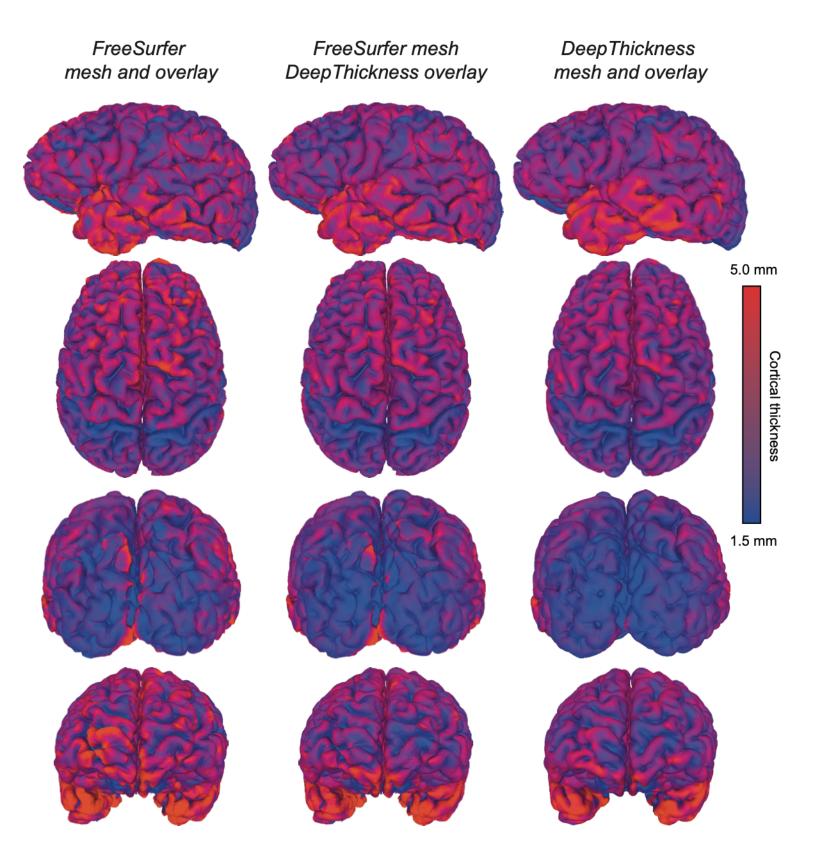


## DeepThickness

### a method for estimating cortical thickness in Brain MRI



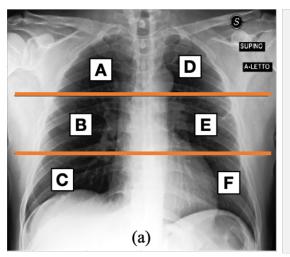
- Cortical thickness across the brain is associated with normal ageing and neurodegenerative conditions
- **DL-based cortical thickness estimation from brain MRI** (in just a few seconds compared to hours with FreeSurfer)
  - The supervised model is trained to predict Level Set and "Distance Set" volumes with weak supervision (FreeSurfer)



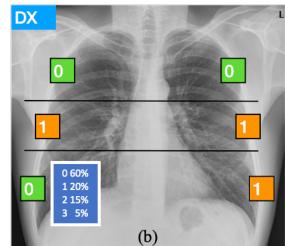
**Under development. Presented at** 2023 Annual Meeting of the Organization for Human Brain Mapping https://www.humanbrainmapping.org

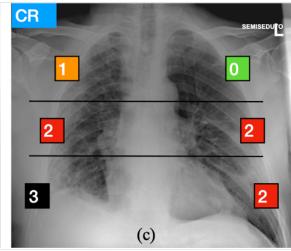


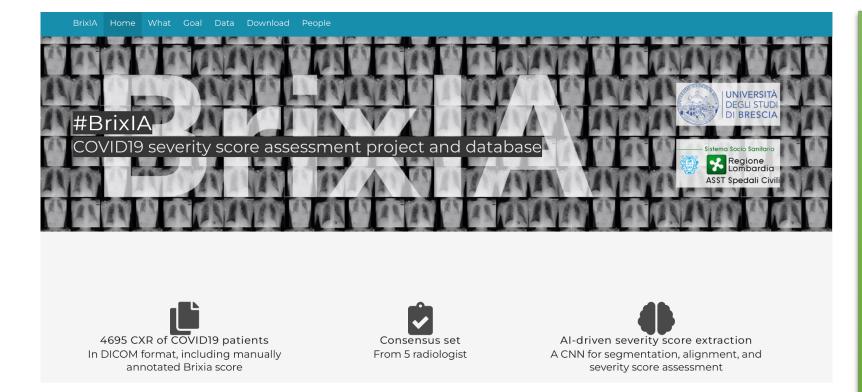
### Trustworthy AI for COVID-19 severity estimation and prognosis



- Score 0: no lung abnormalities
- Score 1: interstitial infiltrates
- Score 2: interstitial and alveolar infiltrates (interstitial predominance)
- Score 3: interstitial and alveolar infiltrates (alveolar predominance)





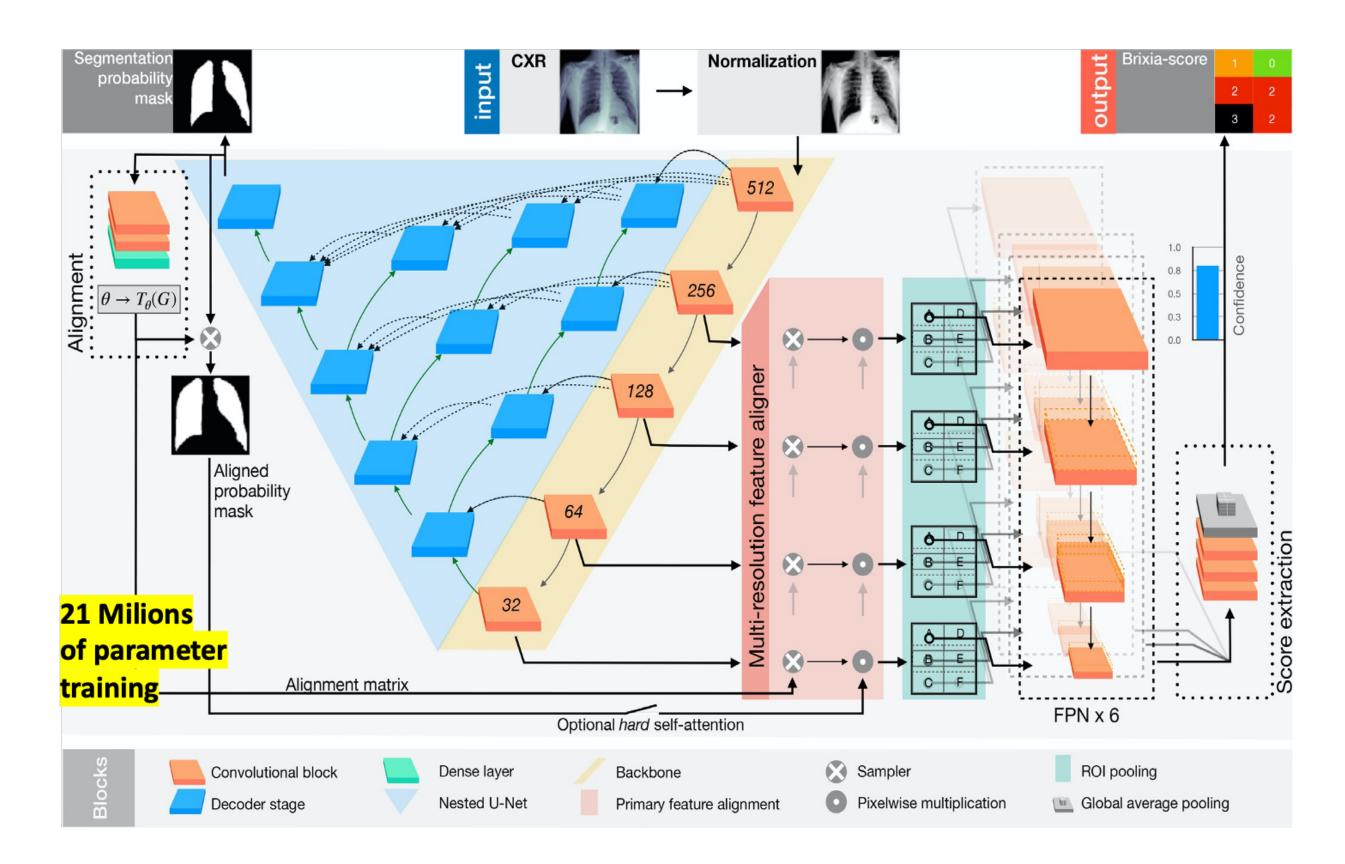


«Cognitive» workflow (multi-network)

- 1. Segmentation
- 2. Normalization (alignment)
- Feature extraction (multi-scale, multiregion)
- Score estimation (6-fold discrete regression)

Signoroni, Alberto, et al. "BS-Net: Learning COVID-19 pneumonia severity on a large chest X-ray dataset." Medical Image Analysis 71 (2021): 102046. <u>https://doi.org/10.1016/j.media.2021.102046</u>

### **BrixIA-Net**



## **Trustworthy AI for COVID-19 severity estimation and prognosis**

- **Deployment** in the Radiology Units of our Hospital (Spedali Civili di Brescia, counting about 50 radiologists) was made possible by integration made in collaboration with the RIS vendor.
  - Experimental and emergency driven activity
- **User-driven tests:** here is no statistical difference in the quality of human and AI produced scores.
  - Radiologists who consult the AI have a better interrater agreement (from moderate to substantial)
  - Can contribute to resident training/supervision
- Z-inspection audit process
  - Wide group of  $\sim$ 50 experts in different domains (CV, Clinicians, Radiologists, Law&Ethics), structured activity, high level of exchange
  - Multidisciplinary team > Interdisciplinary activities > Transdisciplinary synthesis

unteggio rati interstizio-alveolari (dominanza interstiziale Score radiografico Brixia Score Percentuale accuratezza: 50 1 2 3 0 0 1 2 3 0 1 2 3 4.a 0 1 2 3 0 1 2 3 POSITIVO COVID-19 O Si O No

H. Allahabadi et al., "Assessing Trustworthy AI in Times of COVID-19: Deep Learning for Predicting a Multiregional Score Conveying the Degree of Lung Compromise in **COVID-19** Patients," in IEEE Transactions on Technology and Society, Dec. 2022

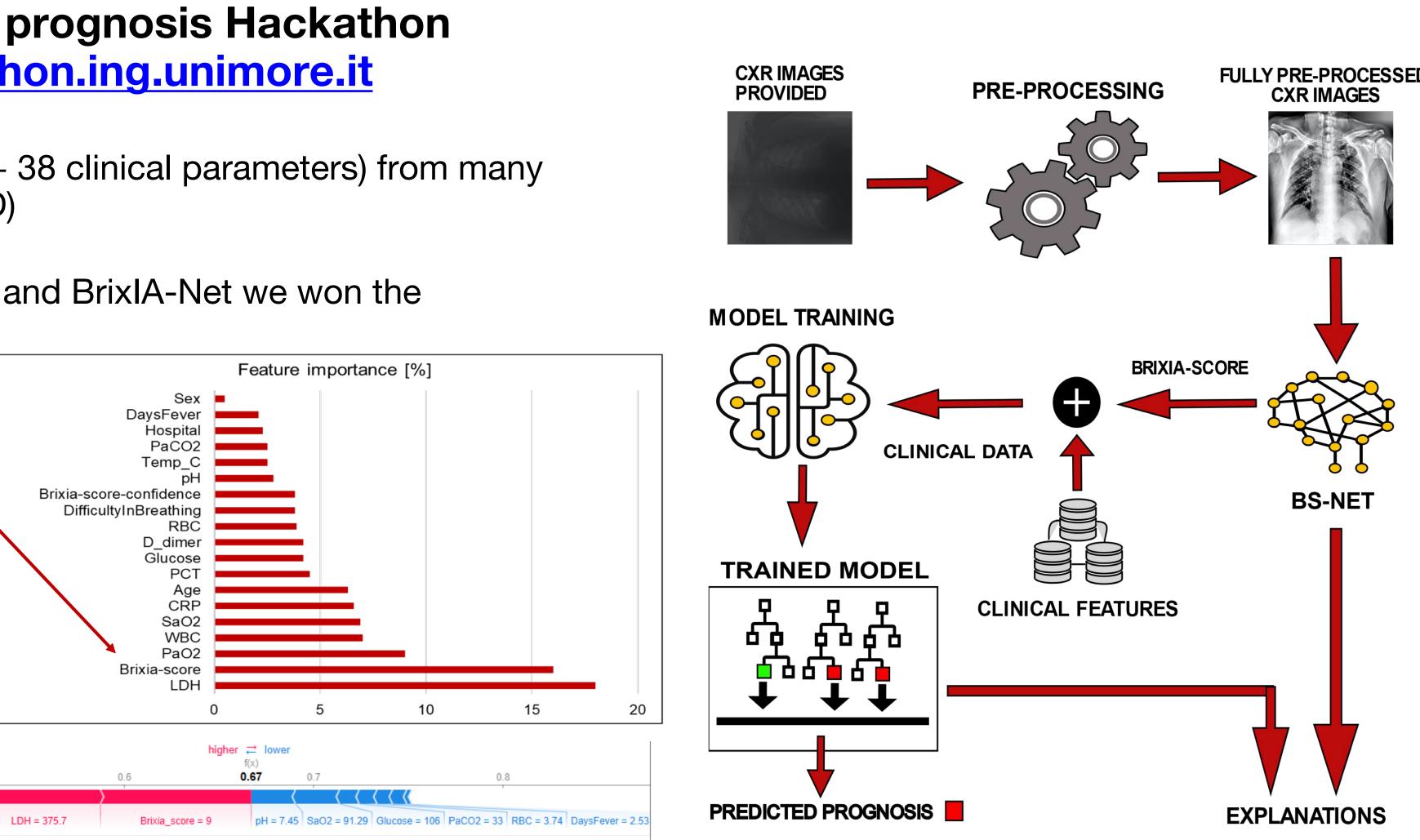


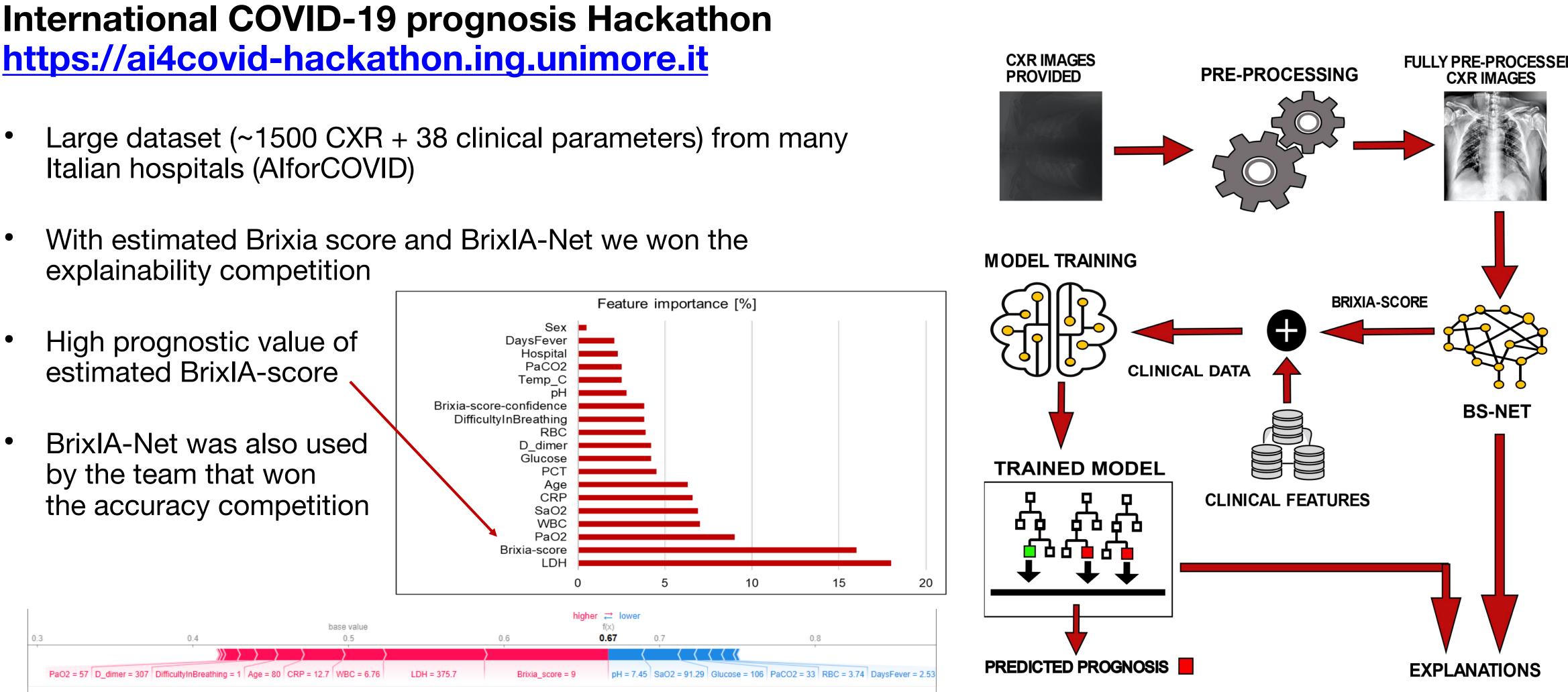


## **Trustworthy AI for COVID-19 severity estimation and prognosis**

## https://ai4covid-hackathon.ing.unimore.it

- Italian hospitals (AlforCOVID)
- explainability competition
- High prognostic value of estimated BrixIA-score
- BrixIA-Net was also used by the team that won the accuracy competition





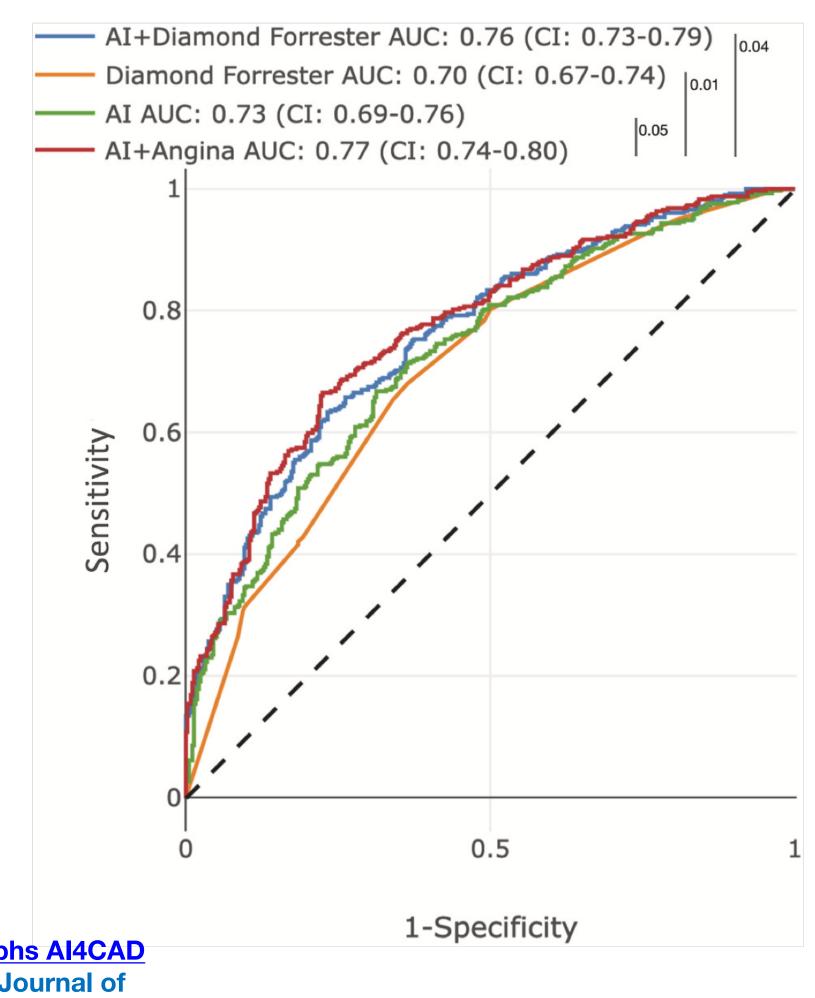
Edoardo Coppola, Damiano Ferrari, Mattia Savardi, Alberto Signoroni, "Explainable Al for COVID-19 prognosis from early chest x-ray and clinical data in the context of the COVID-CXR international hackathon," Proc. SPIE 12465, Medical Imaging 2023: Computer-Aided Diagnosis, 1246522 (7 April 2023); doi: 10.1117/12.2653530

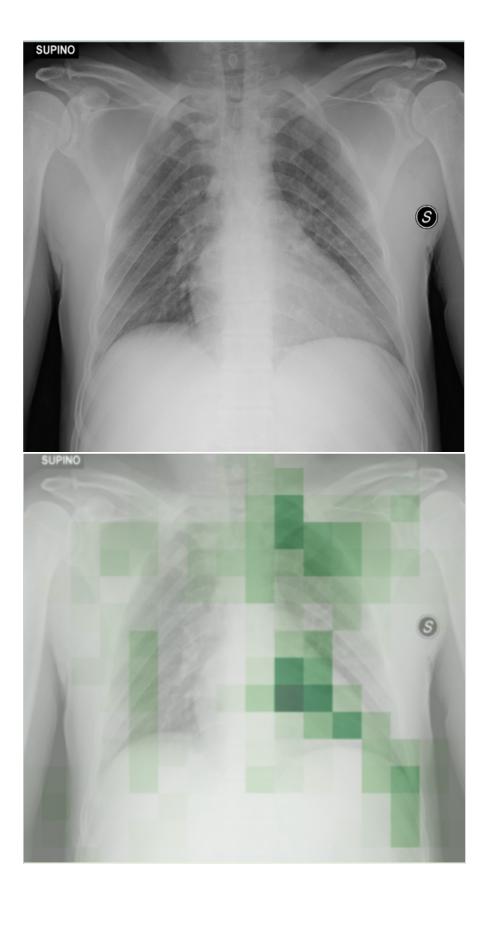


### Al to predict cardiovascular risk factors from Chest X-rays

- Coronary Artery Disease (CAD) is the single leading cause of mortality worldwide
- The goal is to develop DL algorithms for detecting the presence of CAD
  - Dataset composed of ~10000 patients with CXR and Angiography (GT)
  - CNN can be used to identify CAD imaging biomarkers (risk factors)
  - AI + patient symptoms produces results above all commonly used risk factors

Deep learning to detect significant coronary artery disease from plain chest radiographs Al4CAD G D'Ancona, M Massussi, M Savardi, A Signoroni, L Di Bacco, D Farina, International Journal of Cardiology 370, 435-441



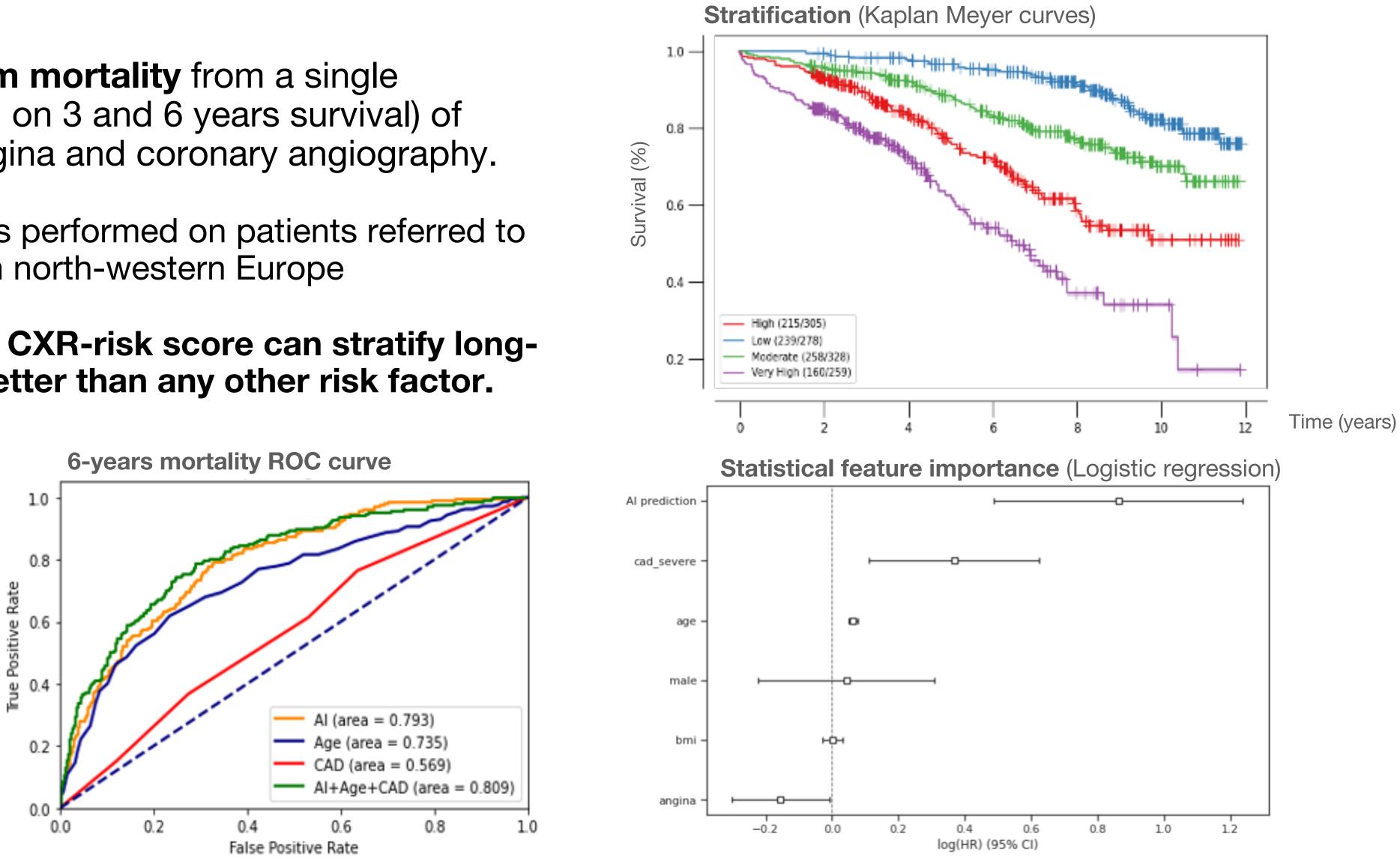


### **Artificial Intelligence to Predict Long-Term Mortality from CXRs of Patients Referred for Suspected Angina**

**Goal: predict long-term mortality** from a single projection CXR (training on 3 and 6 years survival) of patients referred for angina and coronary angiography.

- External validation was performed on patients referred to a medical Institution in north-western Europe
- The DCNN predicted CXR-risk score can stratify longterm mortality risk better than any other risk factor.

Giuseppe D'Ancona, Mattia Savardi, Mauro Massussi; Viktor van der Valk, Alberto Signoroni, Davide Farina, Hueseyin Ince, Stefano Benussi, Salvatore Curello, Fatih Arslan, "Artificial Intelligence to Predict Long-Term Mortality from Plain Chest **Radiographs of Patients** Referred for Suspected Angina", Europea Society of Cardiology, ESC Congress 2023

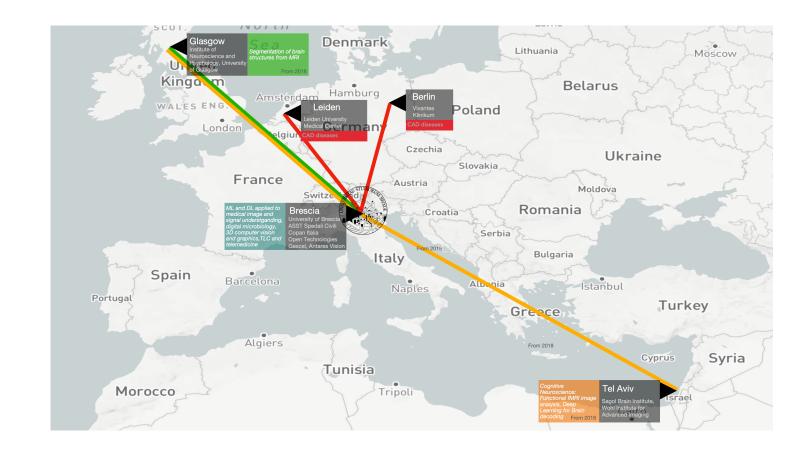


# Thank you

### Group info

- Projects
  - FISR 2020: ResponsiX
  - PRIN 2022: QT-Seed
- 3 PhD students (3 different backgrounds)
- Company links
  - Copan WASP
  - El.Co.
  - Yonder

### ... for being here and for interactions we will have in these days :-)



Collaborations

#### Facilities

- NVIDIA DGX (8 x A100 GPU 80GB)
- DELL Powerscale 270TB DATA Lake
- DELL Server (2 x NVIDIA A100 80GB)
- Group Website http ..... comig.soon.;-)