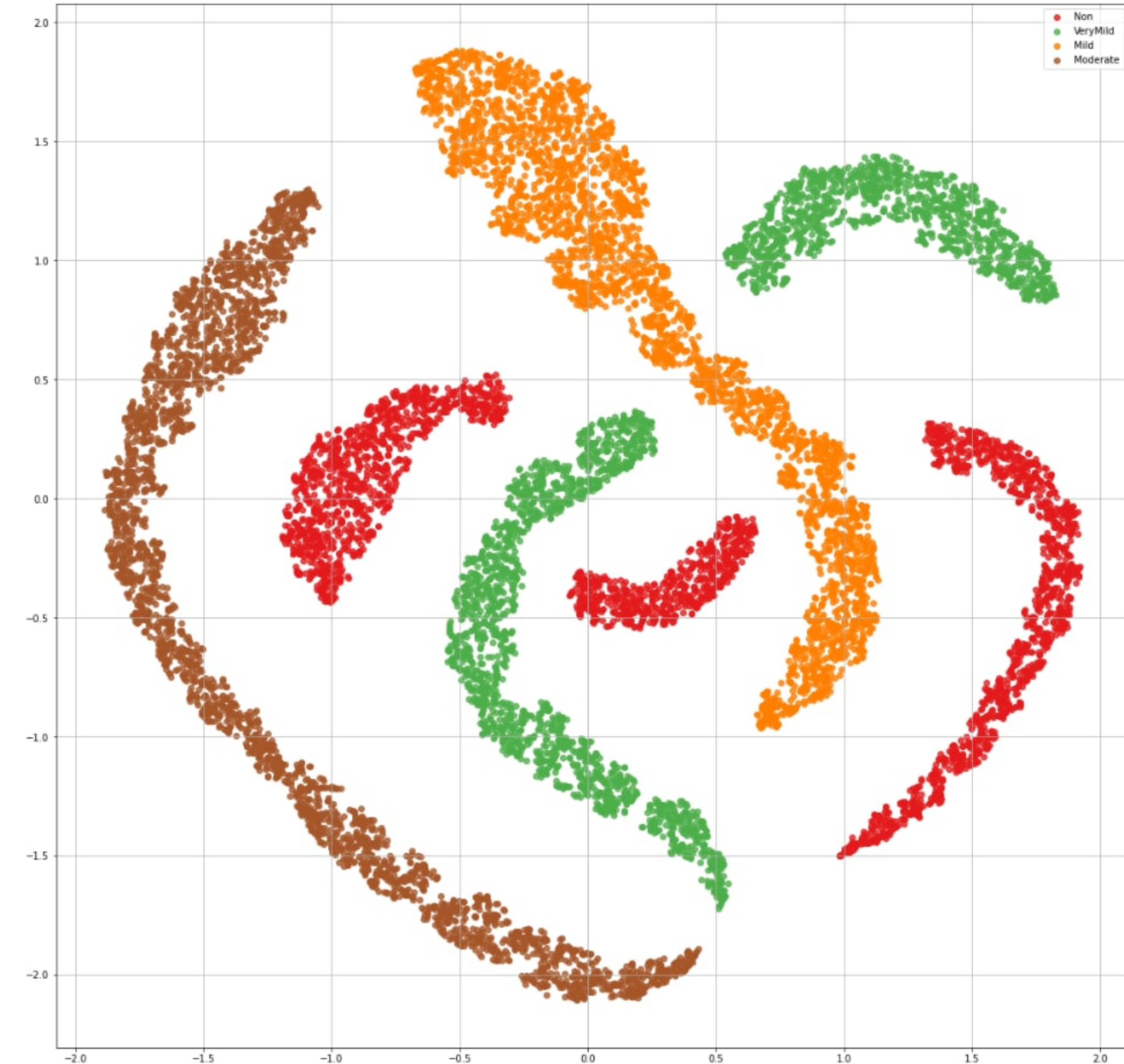


Gardariki-Hack

Alzheimer's MRI Image Analysis

Nikita Baranov, Dani El-Ayyass, Anastasiya Tabalina, Irina Garanina



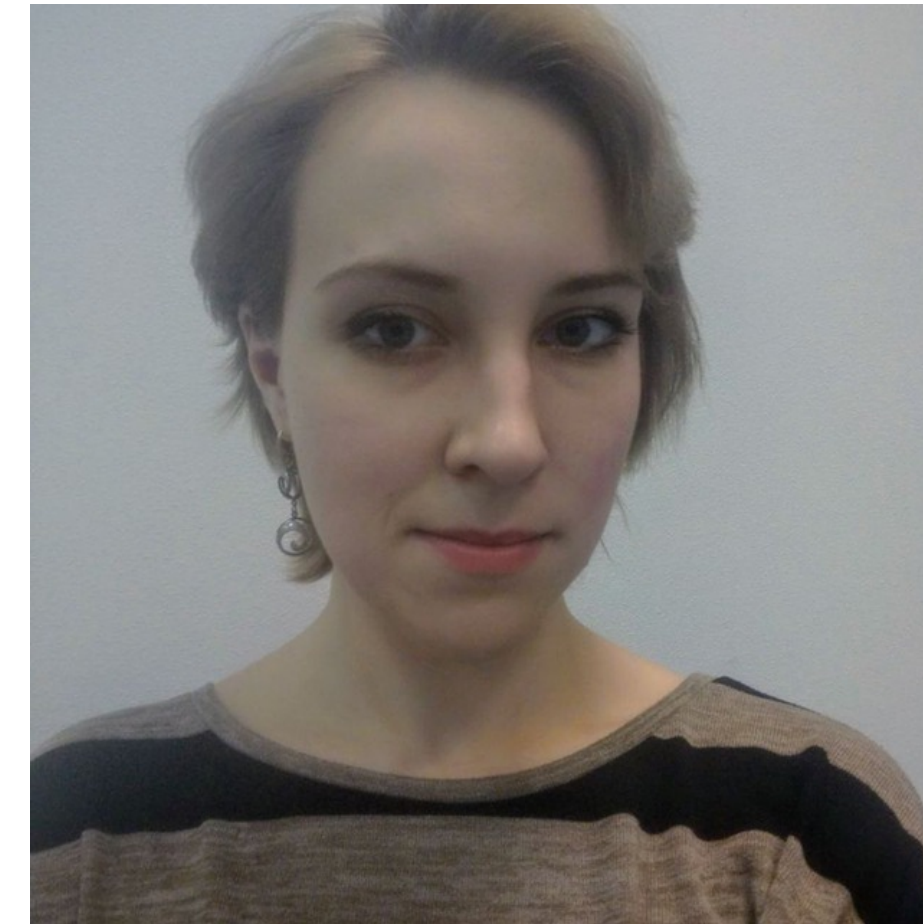
Our team



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Problem statement and data pre-processing

Train datasets: RealDataset, SyntheticDatasetV3

Test dataset: RealTestDataset

Labels: binarized («disease» and «non-disease»)

We try to resolve several tasks:

- synthetic train / synthetic validation
- real train / real validation
- synthetic train / real validation

NN architectures: CustomCNN, ResNet

- custom CNN (~170k params)
- pretrained / non-pretrained ResNet18 (~11M params)

synthetic train / synthetic validation

train accuracy: 0.9741

train metrics				
	precision	recall	f1-score	support
0	0.96	0.94	0.95	2391
1	0.98	0.99	0.98	7209
accuracy			0.97	9600
macro avg	0.97	0.96	0.97	9600
weighted avg	0.97	0.97	0.97	9600

val accuracy: 0.9917

val metrics				
	precision	recall	f1-score	support
0	0.98	0.98	0.98	656
1	0.99	0.99	0.99	1744
accuracy			0.99	2400
macro avg	0.99	0.99	0.99	2400
weighted avg	0.99	0.99	0.99	2400

real train / real validation

train accuracy: 0.9932

train metrics				
	precision	recall	f1-score	support
0	0.99	0.99	0.99	2049
1	0.99	0.99	0.99	2047
accuracy			0.99	4096
macro avg	0.99	0.99	0.99	4096
weighted avg	0.99	0.99	0.99	4096

val accuracy: 0.9785

val metrics				
	precision	recall	f1-score	support
0	0.96	1.00	0.98	511
1	1.00	0.96	0.98	514
accuracy			0.98	1025
macro avg	0.98	0.98	0.98	1025
weighted avg	0.98	0.98	0.98	1025

synthetic train / real validation

train accuracy: 0.9984

train metrics				
	precision	recall	f1-score	support
0	1.00	1.00	1.00	2391
1	1.00	1.00	1.00	7209
accuracy			1.00	9600
macro avg	1.00	1.00	1.00	9600
weighted avg	1.00	1.00	1.00	9600

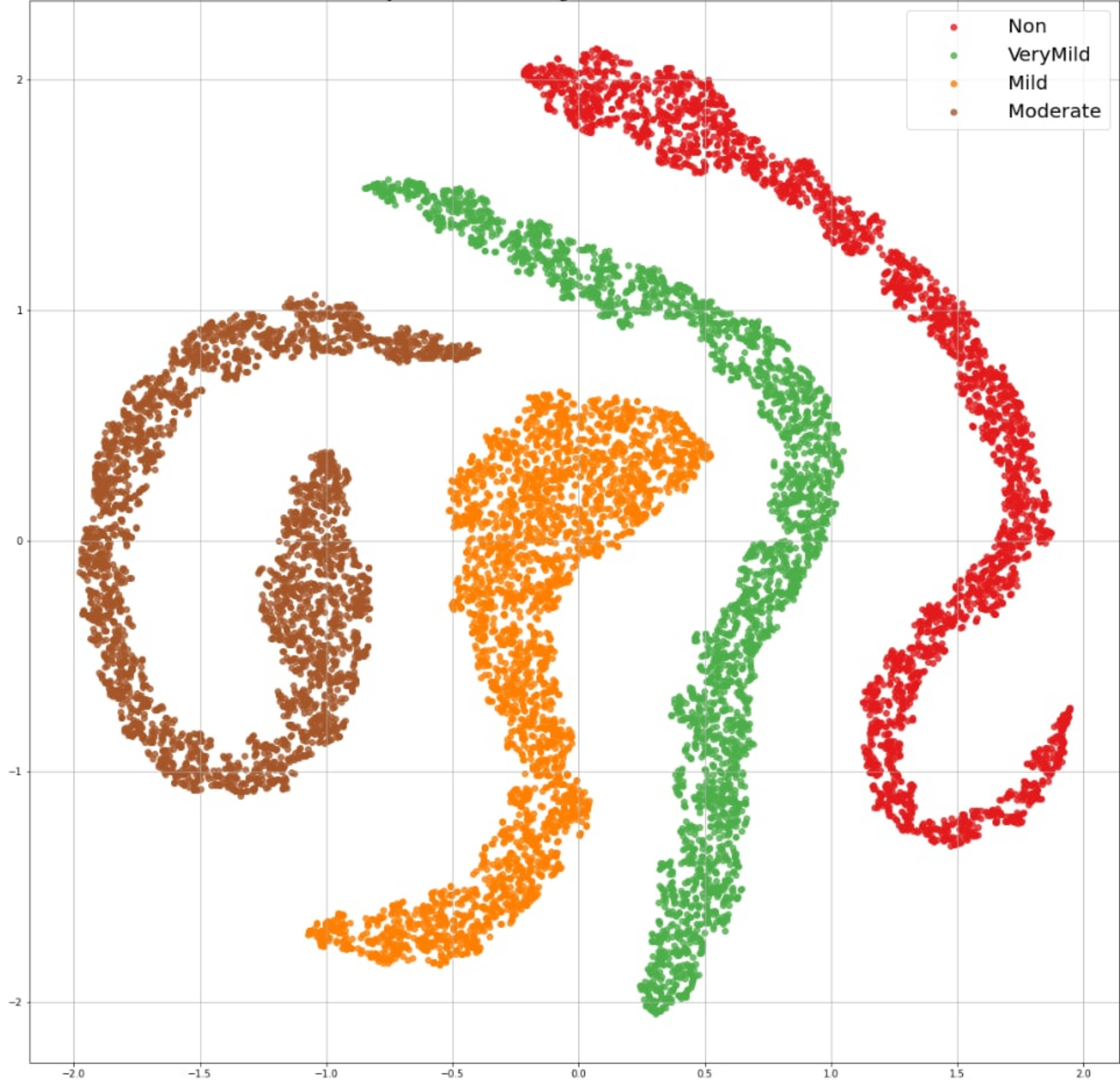
val accuracy: 0.6479

val metrics				
	precision	recall	f1-score	support
0	0.64	0.68	0.66	2049
1	0.66	0.62	0.64	2047
accuracy			0.65	4096
macro avg	0.65	0.65	0.65	4096
weighted avg	0.65	0.65	0.65	4096

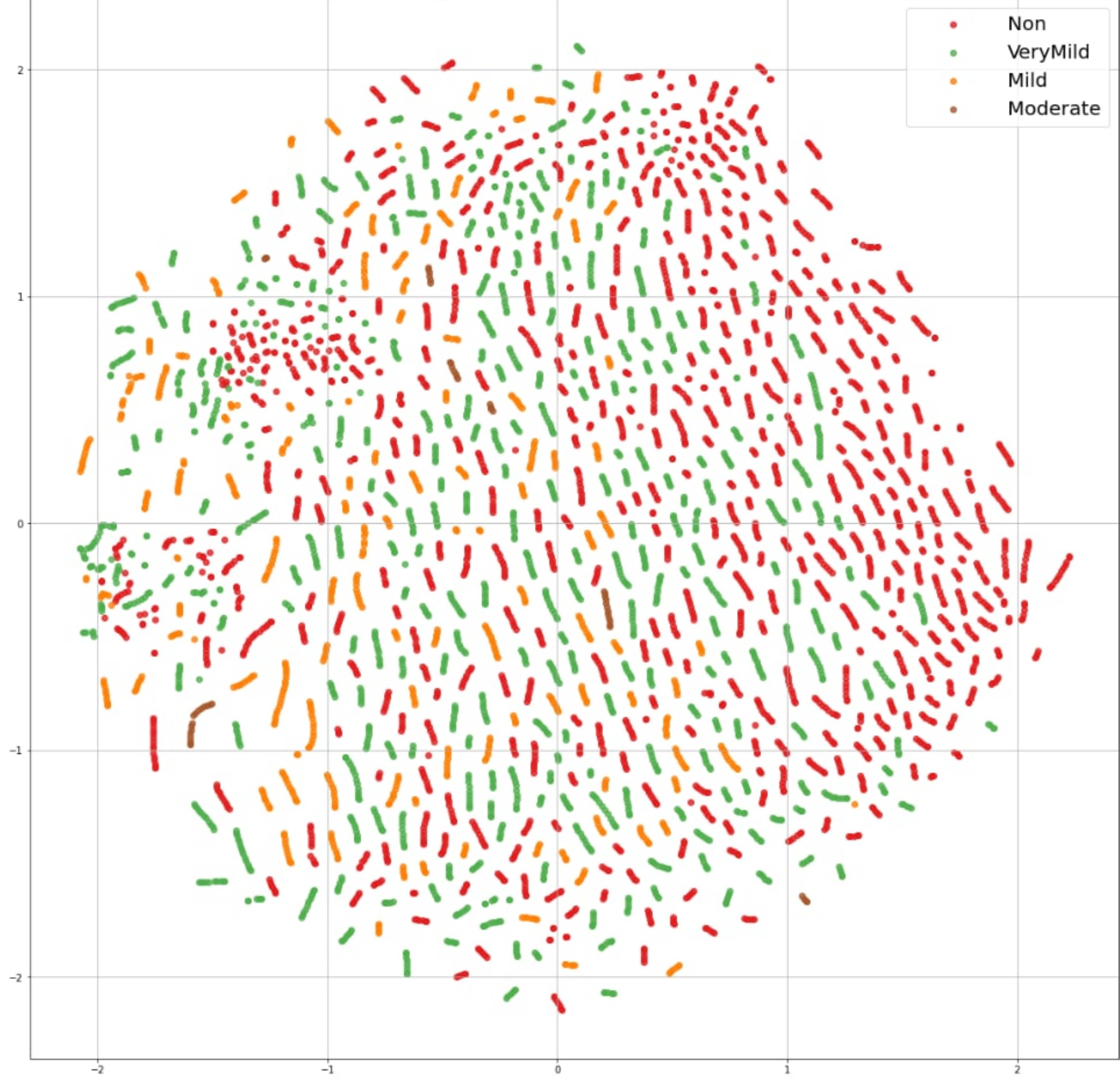
What is the reason for this difference in metrics?

We guess that the reason is in the synthetic/real data structure

tSNE plot on SyntheticDataset



tSNE plot on RealDataset



Find the most important regions of the brain for prediction

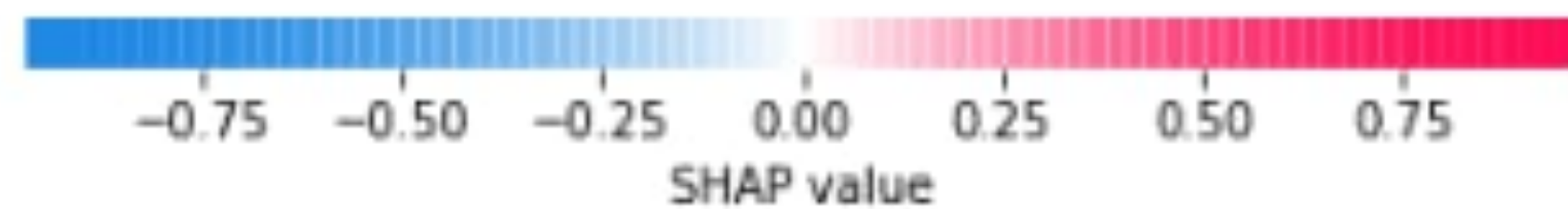
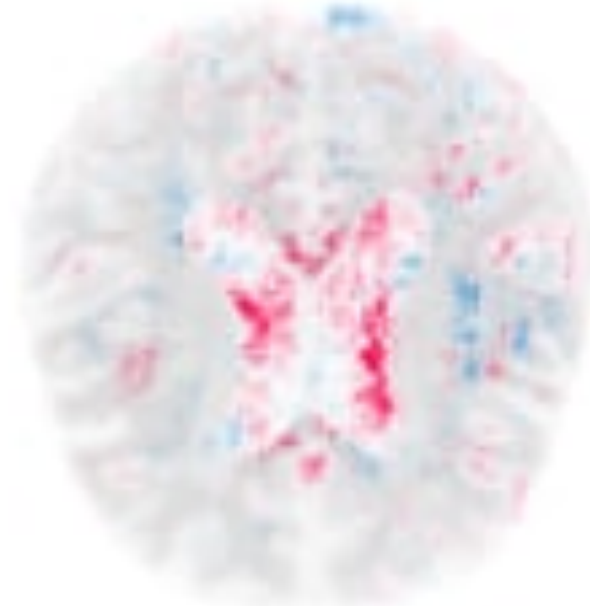
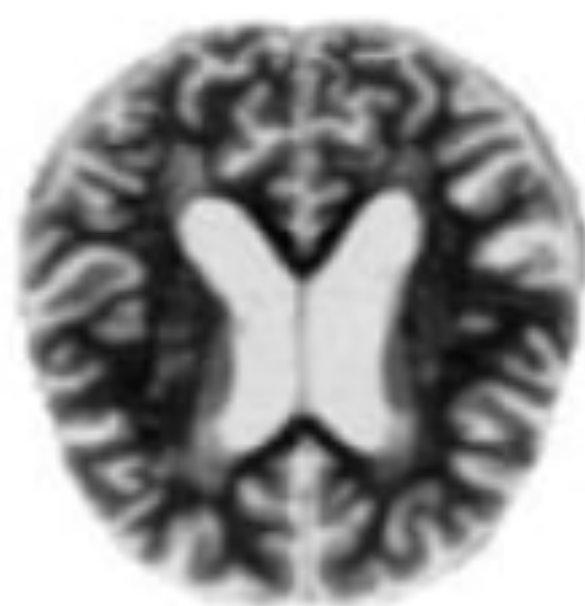
Our hypothesis: GAN failed to transmit the microstructure of the brain

We assume that some information about the microstructure of the brain is lost in the synthetic data

Model trained on real data

Real label : 1.0

Predicted label : 1.0



Model trained on synthetic data

Real label : 1.0

Predicted label : 1.0



Adversarial validation

Train a model that will distinguish the synthetic data from the real one

train accuracy: 1.0000					
train metrics					
	precision	recall	f1-score	support	
0	1.00	1.00	1.00	9629	
1	1.00	1.00	1.00	4067	
accuracy			1.00	13696	
macro avg	1.00	1.00	1.00	13696	
weighted avg	1.00	1.00	1.00	13696	
val accuracy: 0.9997					
val metrics					
	precision	recall	f1-score	support	
0	1.00	1.00	1.00	2371	
1	1.00	1.00	1.00	1054	
accuracy			1.00	3425	
macro avg	1.00	1.00	1.00	3425	
weighted avg	1.00	1.00	1.00	3425	

Trying to improve the model

Select those synthetic data that are most similar to real ones

Model score

train accuracy: 0.9922				
train metrics				
	precision	recall	f1-score	support
0	0.99	0.99	0.99	2100
1	0.99	0.99	0.99	3900
accuracy			0.99	6000
macro avg	0.99	0.99	0.99	6000
weighted avg	0.99	0.99	0.99	6000
val accuracy: 0.6717				
val metrics				
	precision	recall	f1-score	support
0	0.68	0.66	0.67	2560
1	0.67	0.69	0.68	2561
accuracy			0.67	5121
macro avg	0.67	0.67	0.67	5121
weighted avg	0.67	0.67	0.67	5121

Final test on RealTestDataset

final accuracy: 0.4855				
final metrics				
	precision	recall	f1-score	support
0	0.48	0.11	0.17	653
1	0.49	0.88	0.63	626
accuracy			0.49	1279
macro avg	0.48	0.49	0.40	1279
weighted avg	0.48	0.49	0.40	1279

Thanks for your attention!