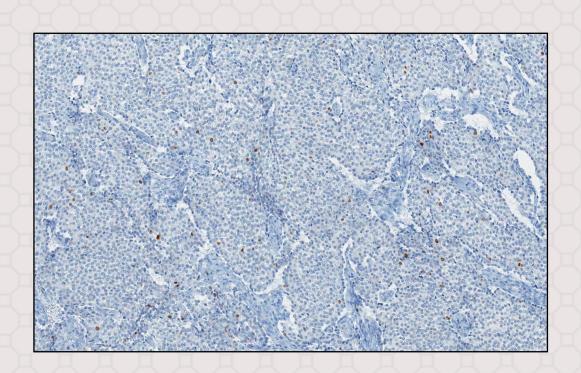
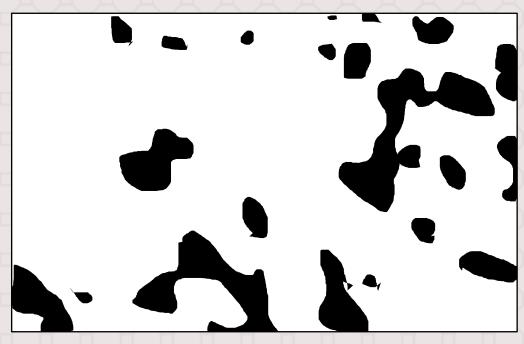
# NAML Project

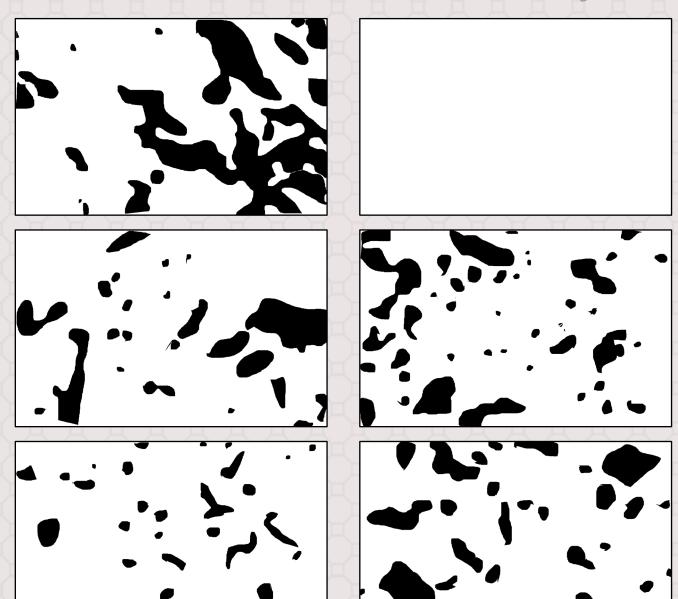
Luca Olivieri Tommaso Giordano



Dataset
Input-output

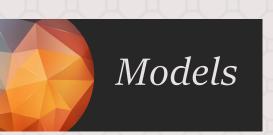






Dataset challenges

- Very unbalanced (1 to 10)
- Only testing data present



#### AlexNet

Fine-tuning

Layer Type	Input Dimension	Output Dimension
Linear	4096	1000
Linear	1000	512
Linear	512	128
Linear	128	32
Linear	32	2

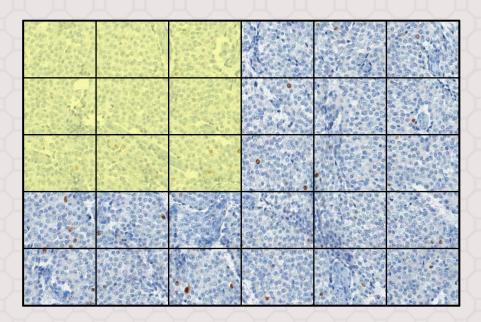
### **Inception V3**

Transfer-learning

Layer Type	Input Dimension	Output Dimension
Linear	2048	512
Linear	512	128
Linear	128	32
Linear	32	2

ID	Model	Optimiser	Loss function	Batch size	Epochs
A1	AlexNet	$Adam(lr = 10^{-4})$	XEn	100	5
A2	AlexNet	AdamW(lr = $10^{-4}$ , $\lambda = 0.1$ )	XEn	100	5
I1	IncV3	$Adam(lr = 5 \cdot 10^{-4})$	$FL(\alpha=1,\gamma=2)$	100	5
I2	IncV3	$AdamW(lr = 5 \cdot 10^{-4})$	XEn	100	5

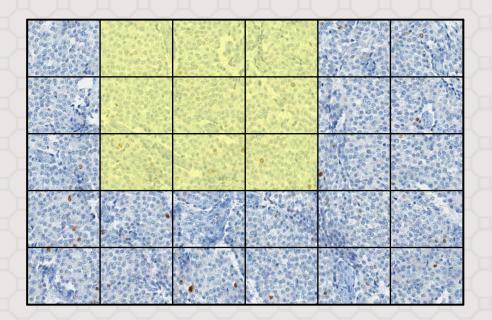
# Inference



Prediction: 1

1	1	1	
1	1	1	
1	1	1	Ö-Ö-Ö-Ö-Ö-
55	85		
	95	56	

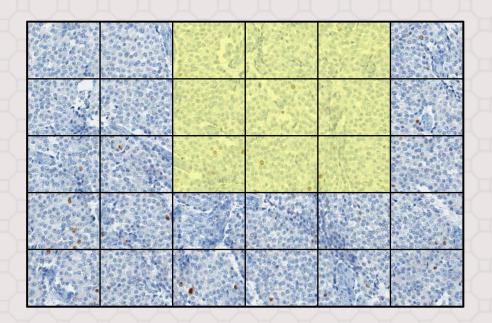
# Inference



1	2	2	1	
1	2	2	1	
1	2	2	1	
55				555
		56	55	

Prediction: 1

# Inference



1	2	2	1	0	
1	2	2	1	0	
1	2	2	1	0	
	88				55
	95	58	56		

Prediction: o

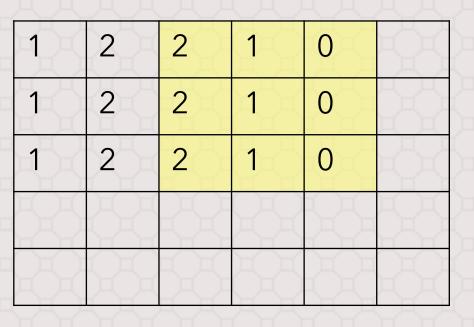
### 30 images

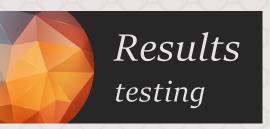
- 10-fold cross validation
- 1 image reserved for testing

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Prediction: o

### Inference



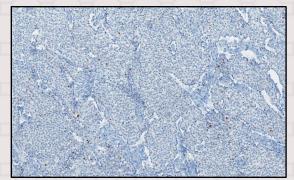


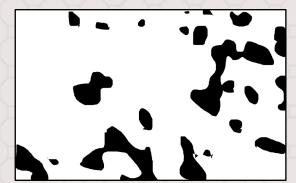
	<b>A</b> 1	<b>A2</b>	I1	I2
Acc.	$0.9125 \pm 0.0044$	$0.9172 \pm 0.0031$	$0.8966 \pm 0.0058$	$0.9041 \pm 0.0048$
Prec.	$0.9100 \pm 0.0071$	$0.8948 \pm 0.0064$	$0.9138 \pm 0.0066$	$0.9122 \pm 0.0069$
Spec.	$0.6084 \pm 0.0163$	$0.5458 \pm 0.0102$	$0.6549 \pm 0.0156$	$0.6590 \pm 0.0106$
Sens.	$0.9552 \pm 0.0069$	$0.9822 \pm 0.0015$	$0.9338 \pm 0.0068$	$0.9449 \pm 0.0042$
IoU	$0.8929 \pm 0.0063$	$0.9019 \pm 0.0043$	$0.8762 \pm 0.0075$	$0.8854 \pm 0.0062$
Dice	$0.9414 \pm 0.0037$	$0.9471 \pm 0.0025$	$0.9320 \pm 0.0044$	$0.9377 \pm 0.0036$

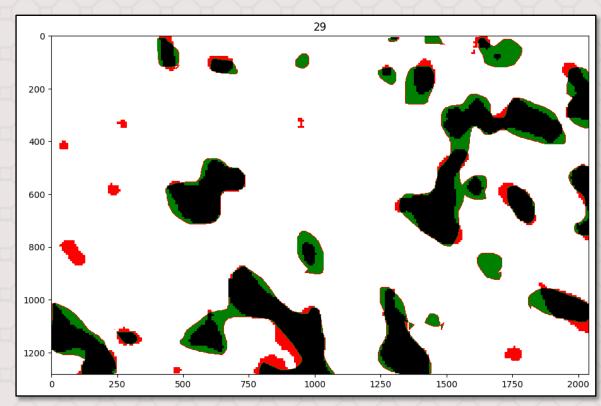
ID	Model	Optimiser	Loss function	Batch size	Epochs
A1	AlexNet	$Adam(lr = 10^{-4})$	XEn	100	5
A2	AlexNet	AdamW(lr = $10^{-4}$ , $\lambda = 0.1$ )	XEn	100	5
I1	IncV3	$Adam(lr = 5 \cdot 10^{-4})$	$FL(\alpha=1,\gamma=2)$	100	5
I2	IncV3	$AdamW(lr = 5 \cdot 10^{-4})$	XEn	100	5

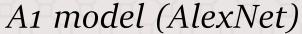


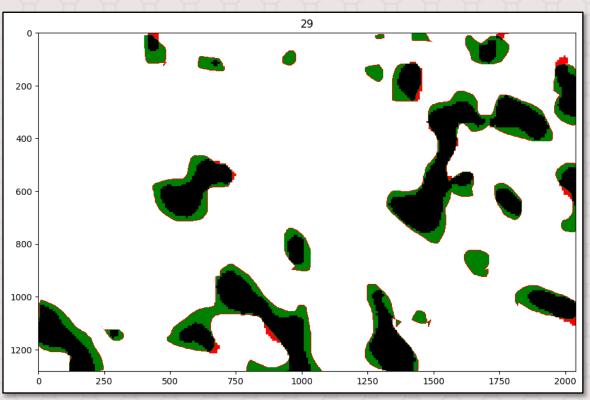
- ☐ Correct tumor
- Correct non tumor
- False positive
- False negative







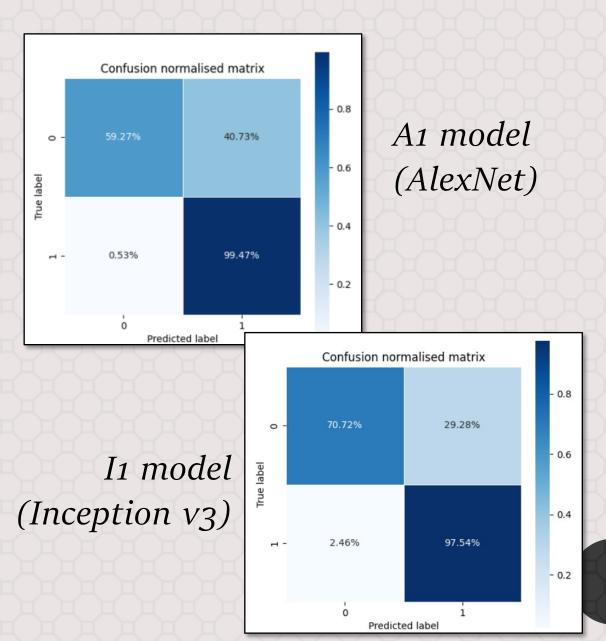


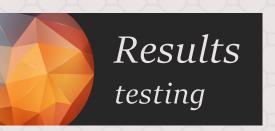


*I1 model (Inception v3)* 



	AlexNet not regularized (A1)	Inception-v3 cross entropy (I1)
Acc.	92,54%	92,92%
Prec.	92,15%	94,12%
Spec.	59.27%	70,72%
Rec.	99,47%	97,54%
loU	91,70%	91,94%
Dice	95,67%	95,80%
F1	95,67%	95,17%





#### Also tried:

- Dataset oversampling
- Data augmentation
- Image equalization
- Custom class weighting

ID	Model	Optimiser	Loss function	Batch size	Epochs
A1	AlexNet	$Adam(lr = 10^{-4})$	XEn	100	5
A2	AlexNet	AdamW(lr = $10^{-4}$ , $\lambda = 0.1$ )	XEn	100	5
I1	IncV3	$Adam(lr = 5 \cdot 10^{-4})$	$FL(\alpha=1,\gamma=2)$	100	5
I2	IncV3	$AdamW(lr = 5 \cdot 10^{-4})$	XEn	100	5

# Thank you!

Luca Olivieri Tommaso Giordano

