
Microscopic Images Binary Classification



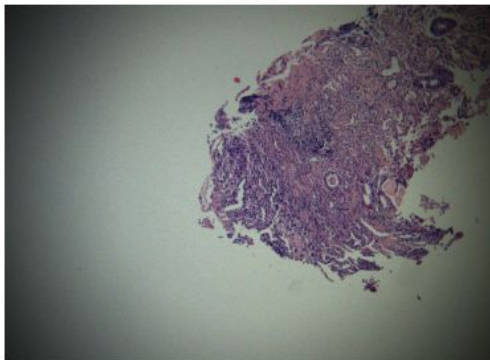
SeeGene Project Report



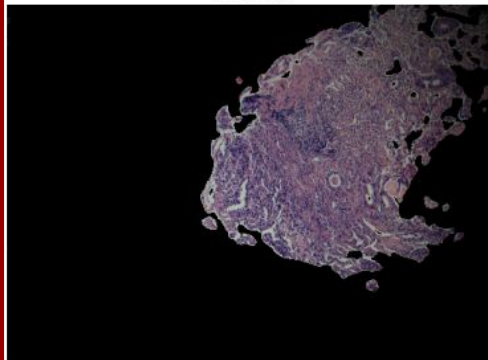
Willmer R. Quinones R.
2021.04.09

> Segmented Data

Normal



Segmented



Reversed



Accuracy

0.971 ± 0.015

0.888 ± 0.011

0.969 ± 0.022

TPR

0.948 ± 0.051

0.854 ± 0.020

0.943 ± 0.063

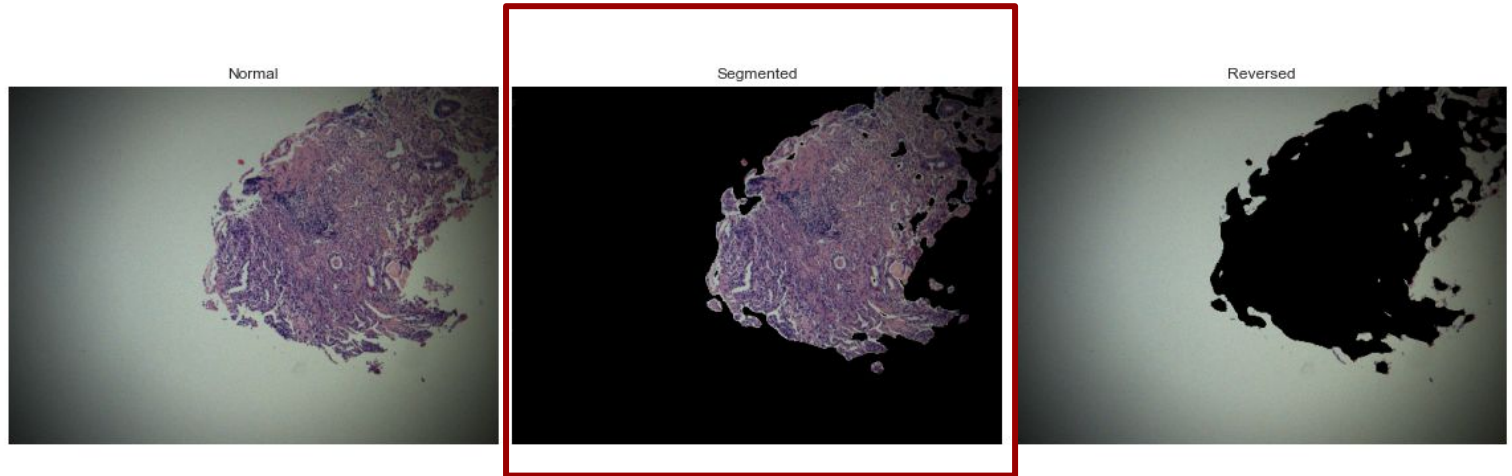
TNR

0.981 ± 0.001

0.900 ± 0.009

0.979 ± 0.007

> Data Extraction



SEGMENTED: $IMG * MASK$

MASK:

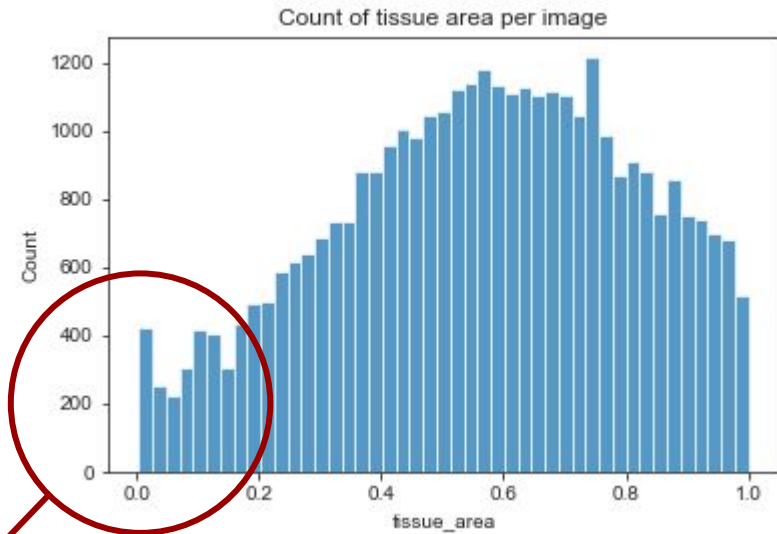
RGB \rightarrow HSV

HUE: 110 - 255 (purple, pink, ...)

```
hsv_img = cv2.cvtColor(temp, cv2.COLOR_RGB2HSV)
mask = cv2.inRange(hsv_img, (0,0,0), (110, 250, 255))
mask = np.invert(mask)
segmented = cv2.bitwise_and(img, img, mask=mask)
```

> Data Extraction

```
Tissue_area:    non-zeroes pixels  
Noise:         tissue_area < 0.05  
  
Discard:       695/35638 = 1.95%  
Used:         34,943/35,638
```



> Data Extraction

Subset	Class	Sample	# Images
train	M	130	8574
	N	130	9208
test	M	58	5256
	N	146	11905

* From *train*, 30 samples (for each class) are extracted for validation

> Model Selection

ResNet18

batch_size: 64
max_epochs: 15
training_size: 100%

Overall Accuracy: 0.822

Confusion Matrix:

	Pred M	Pred N
True M	4468	788
True N	2272	9633

ResNet50

batch_size: 128
max_epochs: 15
training_size: 100%

Overall Accuracy: 0.859

Confusion Matrix:

	Pred M	Pred N
True M	4696	560
True N	1860	10045

ResNet101

batch_size: 128
max_epochs: 15
training_size: 100%

Overall Accuracy: 0.860

Confusion Matrix:

	Pred M	Pred N
True M	4533	723
True N	1670	10235

ResNet158

batch_size: 128
max_epochs: 15
training_size: 100%

Overall Accuracy: 0.851

Confusion Matrix:

	Pred M	Pred N
True M	4684	572
True N	1985	9920

> Model Selection

ResNet50

batch_size: 128
max_epochs: 15
training_size: **50%**

Overall Accuracy: 0.8562

Confusion Matrix:

	Pred M	Pred N
True M	4693	563
True N	1904	10001

ResNet50

batch_size: 128
max_epochs: 15
training_size: **75%**

Overall Accuracy: 0.8594

Confusion Matrix:

	Pred M	Pred N
True M	4700	556
True N	1856	10049

ResNet50

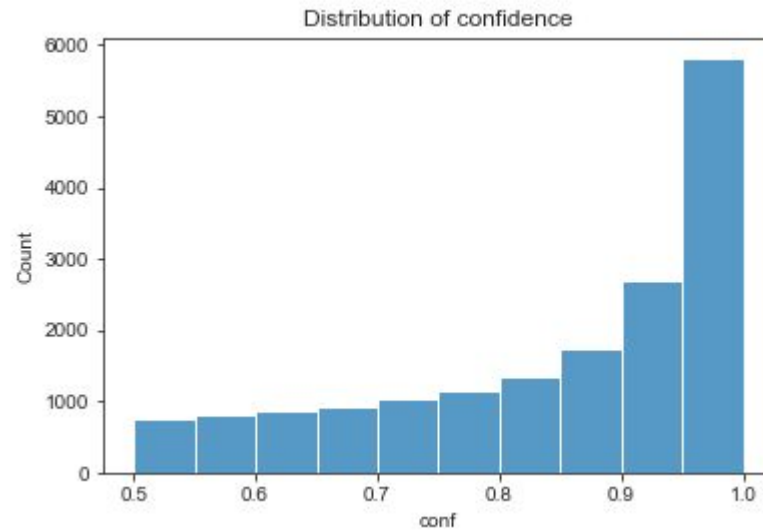
batch_size: 128
max_epochs: 15
training_size: **100%**

Overall Accuracy: 0.859

Confusion Matrix:

	Pred M	Pred N
True M	4696	560
True N	1860	10045

> Confidence Analysis



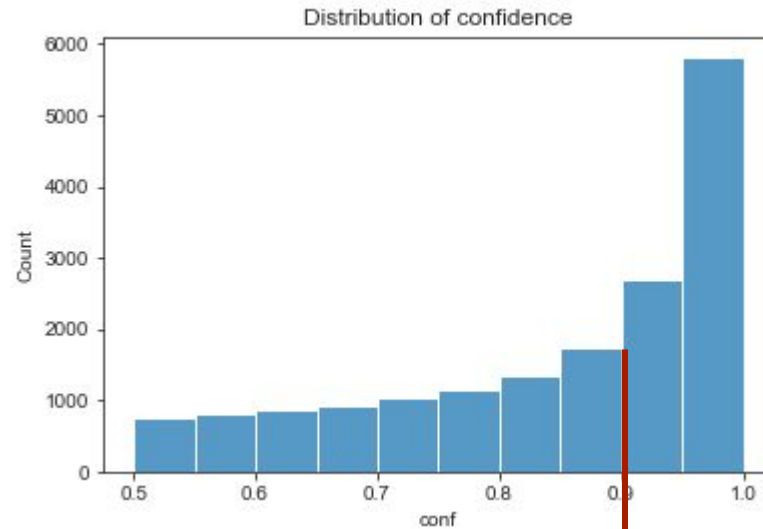
ResNet50

Overall Accuracy: 0.859

Confusion Matrix:

	Pred M	Pred N
True M	4696	560
True N	1860	10045

> Confidence Analysis



ResNet50

Overall Accuracy: 0.859

Confusion Matrix:

	Pred M	Pred N
True M	4696	560
True N	1860	10045

50.48% of test set

Overall Accuracy: 0.755

Confusion Matrix:

	Pred M	Pred N
True M	2128	522
True N	1603	4410

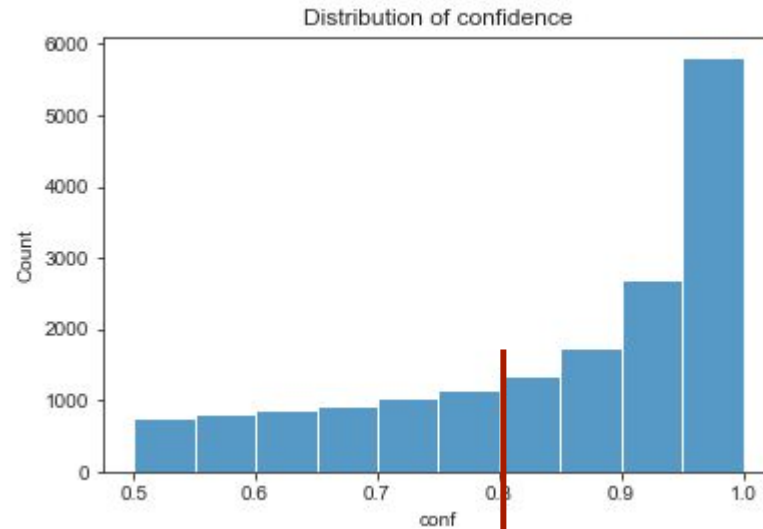
49.52% of test set

Overall Accuracy: 0.965

Confusion Matrix:

	Pred M	Pred N
True M	2568	38
True N	257	5635

> Confidence Analysis



ResNet50

Overall Accuracy: 0.859

Confusion Matrix:

	Pred M	Pred N
True M	4696	560
True N	1860	10045

32.34% of test set

Overall Accuracy: 0.692

Confusion Matrix:

	Pred M	Pred N
True M	1186	449
True N	1262	2653

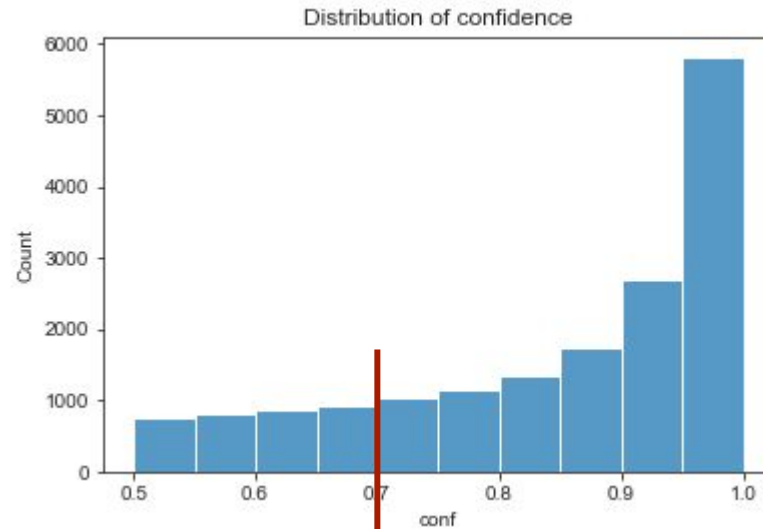
67.66% of test set

Overall Accuracy: 0.939

Confusion Matrix:

	Pred M	Pred N
True M	3510	111
True N	598	7392

> Confidence Analysis



ResNet50

Overall Accuracy: 0.859

Confusion Matrix:

	Pred M	Pred N
True M	4696	560
True N	1860	10045

19.59% of test set

Overall Accuracy: 0.627

Confusion Matrix:

	Pred M	Pred N
True M	603	333
True N	921	1504

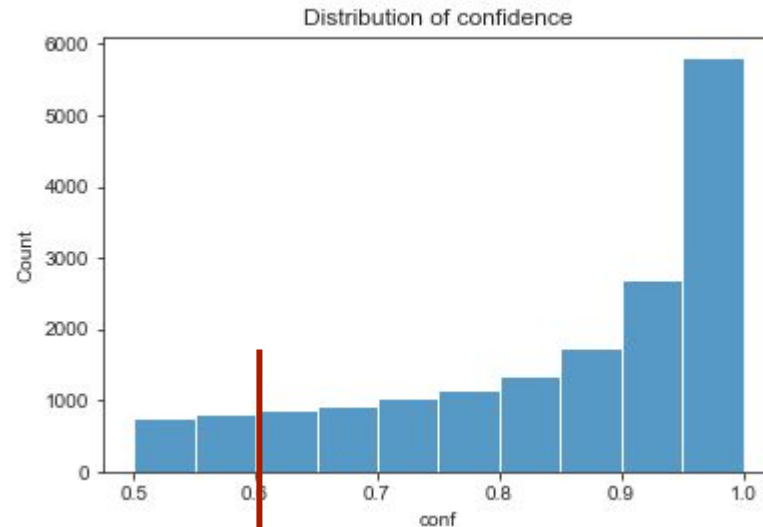
80.41% of test set

Overall Accuracy: 0.916

Confusion Matrix:

	Pred M	Pred N
True M	4093	227
True N	939	8541

> Confidence Analysis



ResNet50

Overall Accuracy: 0.859

Confusion Matrix:

	Pred M	Pred N
True M	4696	560
True N	1860	10045

9.21% of test set

Overall Accuracy: 0.5481

Confusion Matrix:

	Pred M	Pred N
True M	239	191
True N	523	627

90.79% of test set

Overall Accuracy: 0.891

Confusion Matrix:

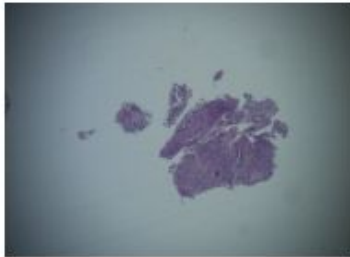
	Pred M	Pred N
True M	4457	369
True N	1337	9418

> Error Analysis

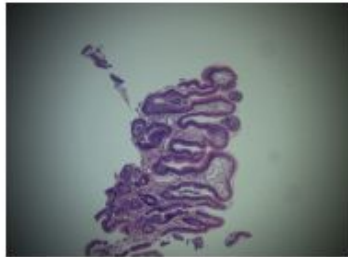
Zoom level: 0



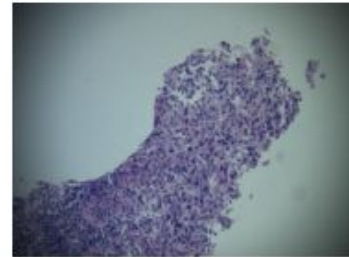
Zoom level: 1



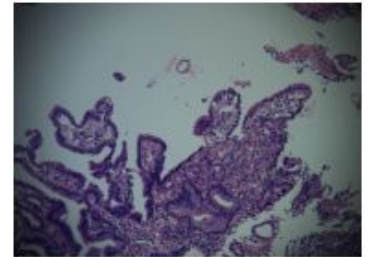
Zoom level: 2



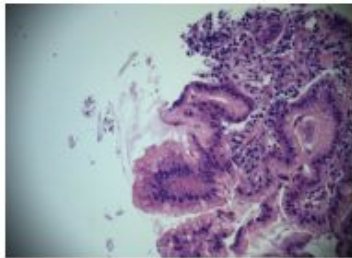
Zoom level: 3



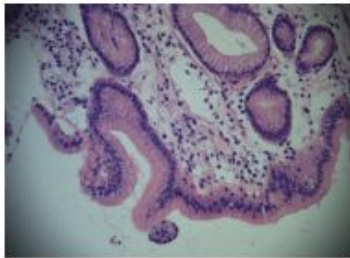
Zoom level: 4



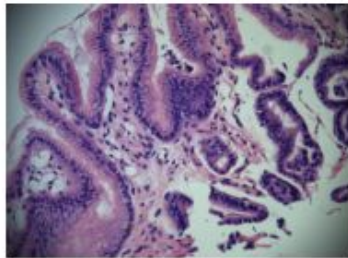
Zoom level: 5



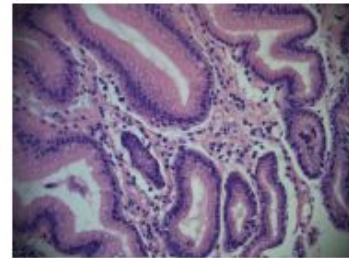
Zoom level: 6



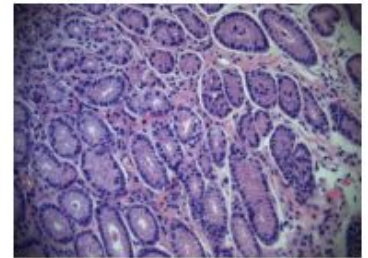
Zoom level: 7



Zoom level: 8

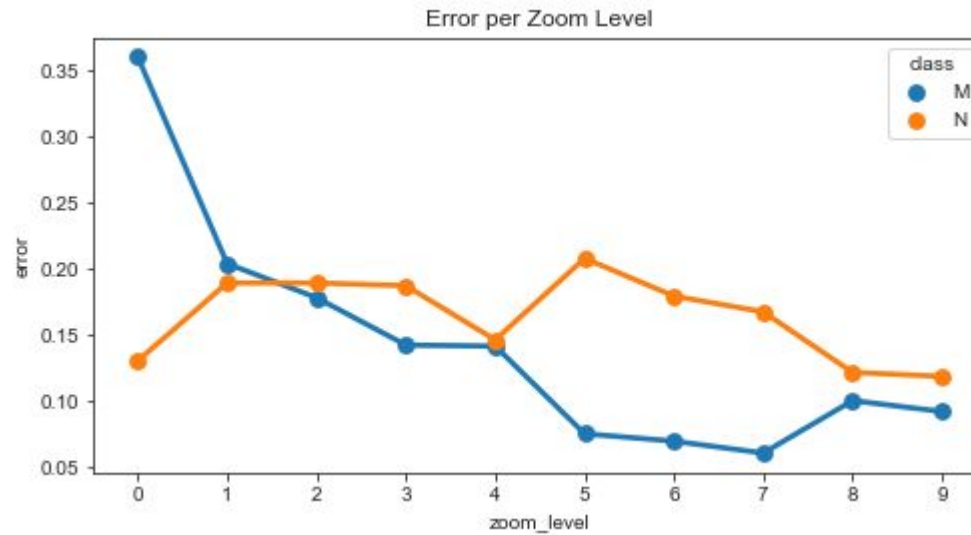


Zoom level: 9

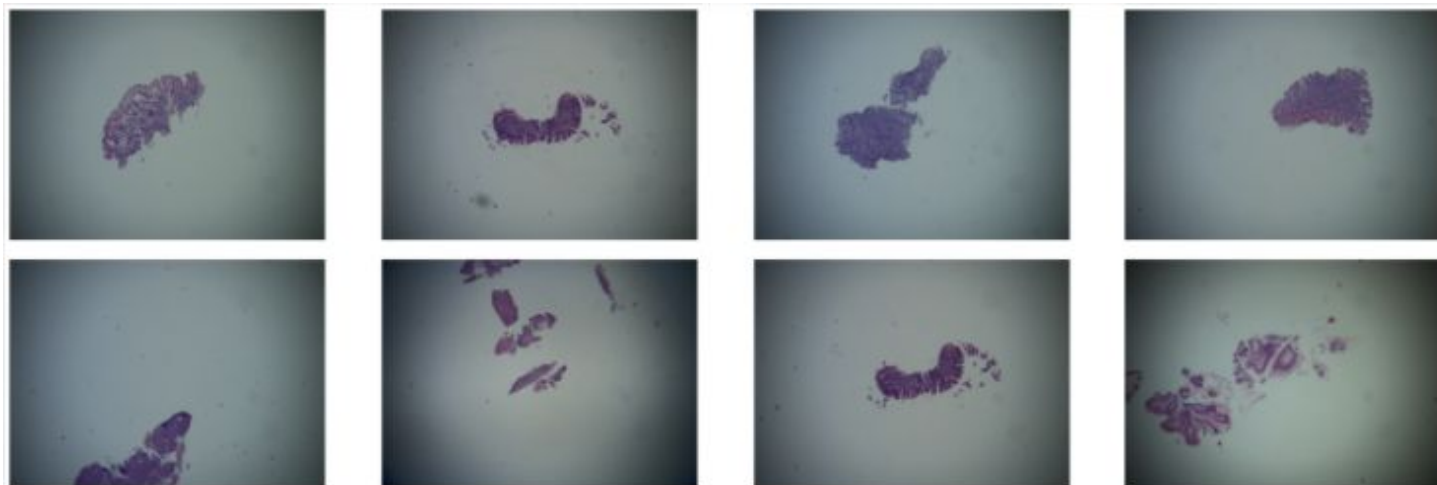
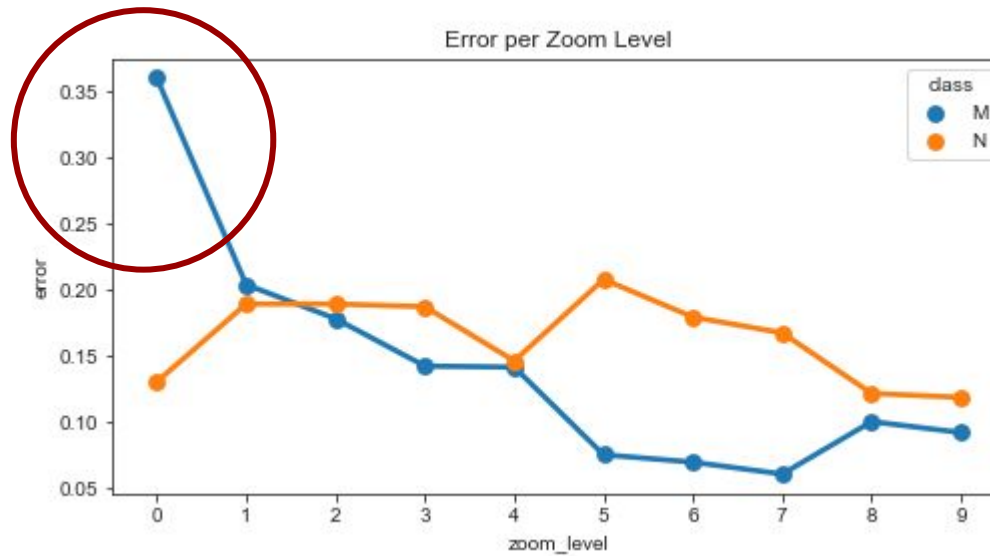


* based on the amount of 'tissue' in the image

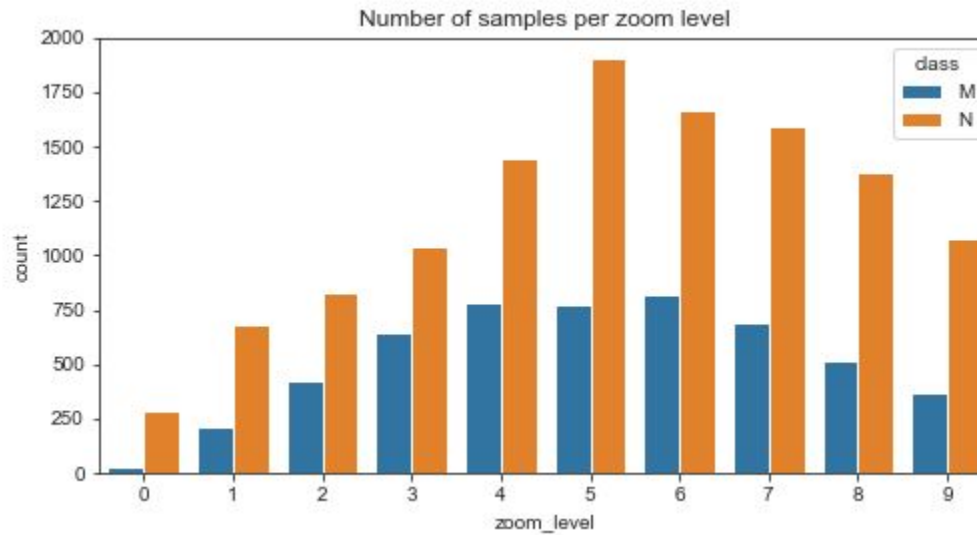
> Error Analysis



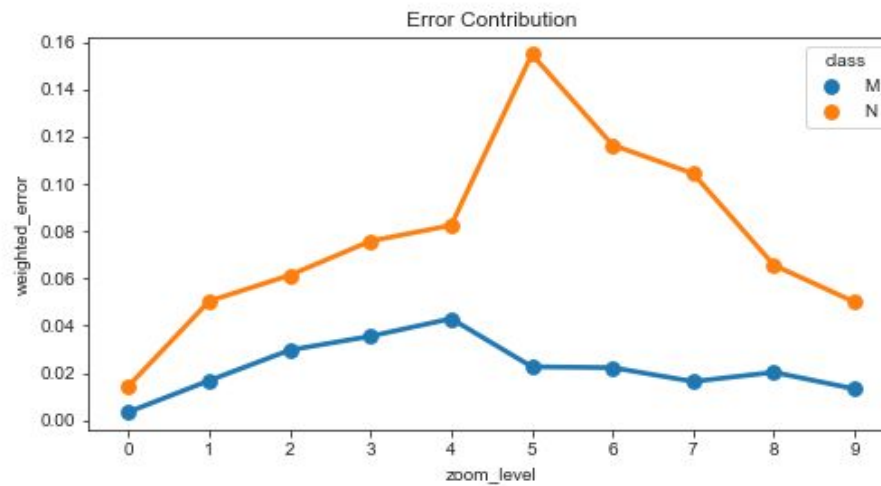
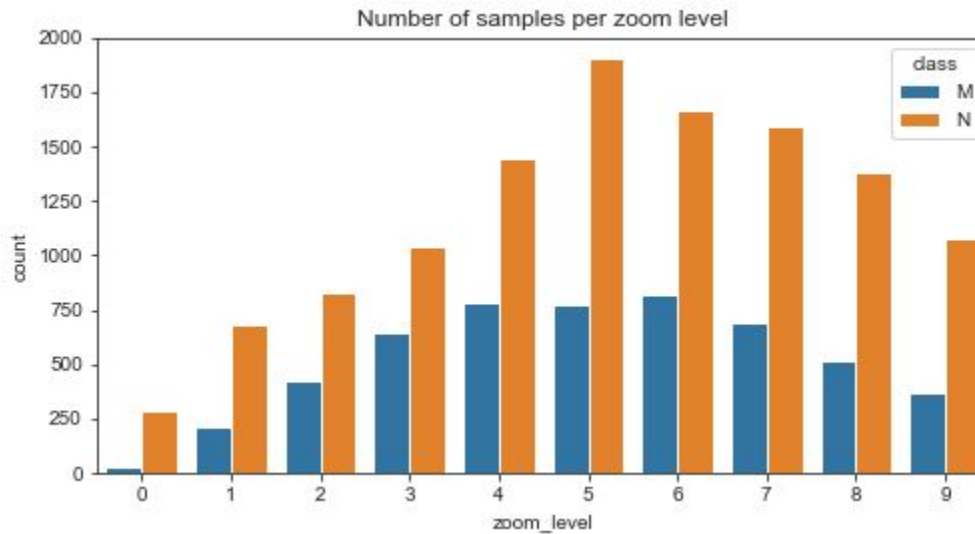
> Error Analysis



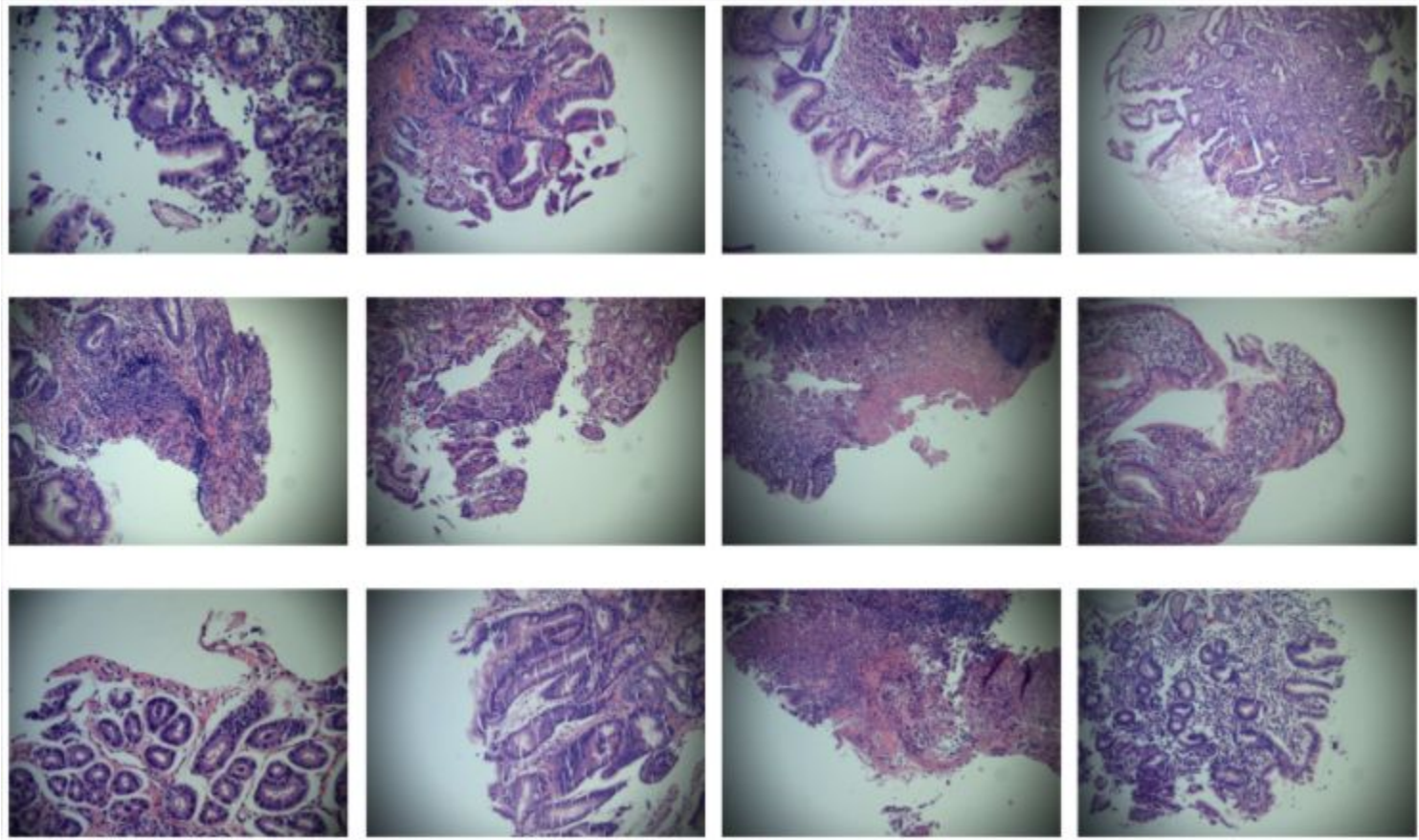
> Error Analysis



> Error Analysis



> Error Analysis

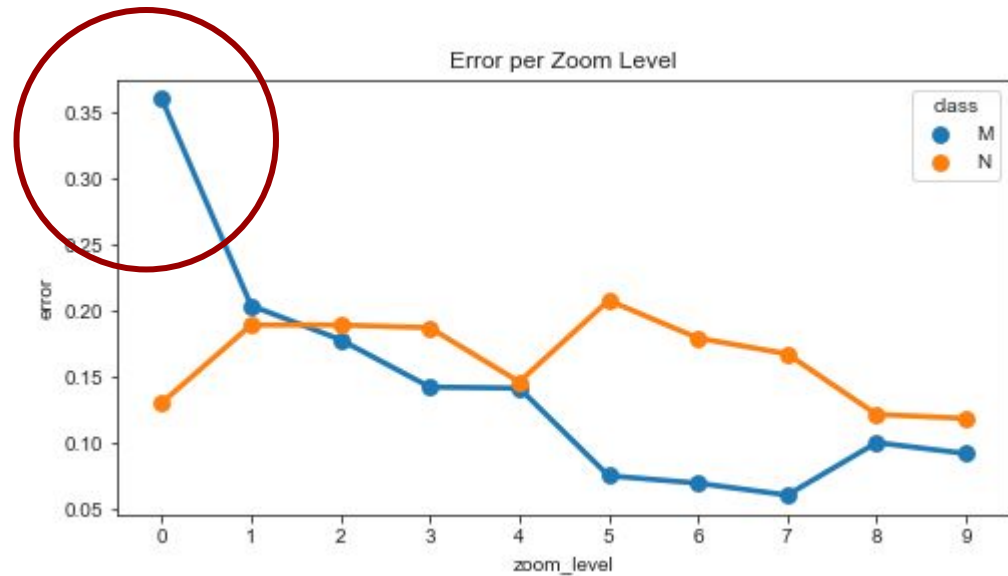


Normal images predicted as Malignant

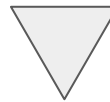
> Requirements?



Do zoom-out images matter?



> Requirements?



Model A (resnet50)

Acc: 0.859

TPR: **0.894**

TNR: 0.844

Confusion Matrix:

	Pred M	Pred N
True M	4696	560
True N	1860	10045

vs.

Model B (resnet101)

Acc: 0.860

TPR: 0.862

TNR: **0.860**

Confusion Matrix:

	Pred M	Pred N
True M	4533	723
True N	1670	10235

~ THANK YOU ~