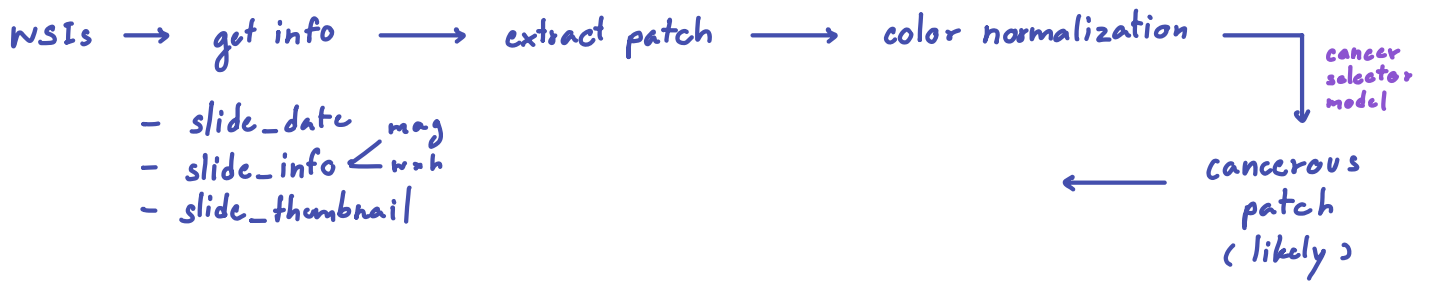
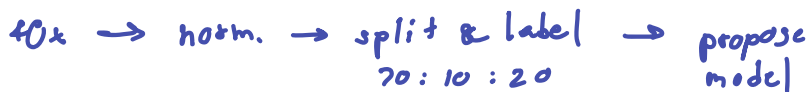


# CNN\_BreakHis\_Logbook

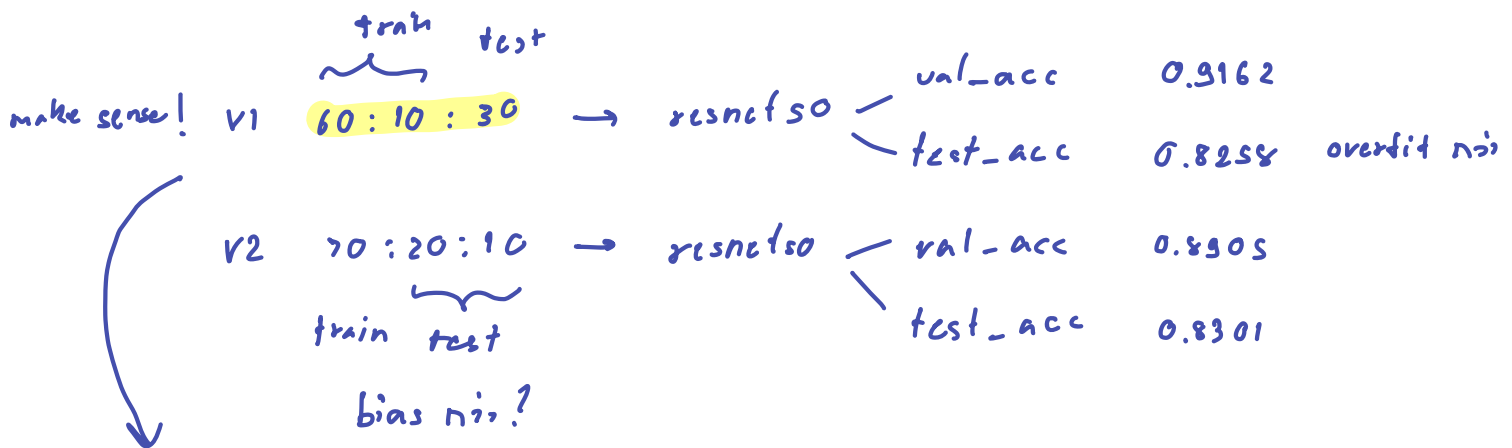
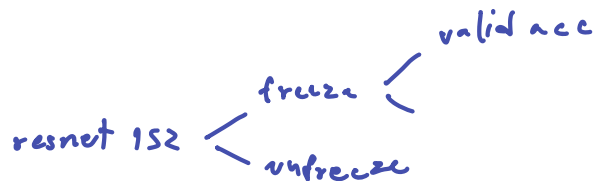


valid WSIs



resnet50

70:10:20



add dropout and weight decay

as	val_acc	0.9113
	test_acc	0.8425

60:10:30

resnet50 pretrained freeze

best valid accuracy : 0.9557

test accuracy : 0.8442 ← overfit!

resnet50 pretrained unfreeze Adam no scheduler

best valid accuracy : 0.9803

test accuracy : 0.8760 ← overfit

resnet50 pretrained unfreeze Adam lr scheduler ReduceLROnPlateau  
mode: 'min'  
(patience: 5, factor 0.1)

best valid accuracy : 0.9754

test accuracy : 0.8811

freeze  
resnet152 dropout 0.5 x 1

↑  
Σ 0.50

freeze, dropout  
unfreeze, no dropout

val acc 0.921  
test acc 0.881

freeze  
resnet152 dropout 0.5 x 2

val acc 0.926  
test acc 0.883

freeze  
resnet152 dropout 0.5 x 3

val acc 0.926  
test acc 0.876

Adam  $\begin{cases} \text{val acc} & 0.926 \\ \text{test acc} & 0.883 \end{cases}$

AdamW  $\begin{cases} \text{val acc} & 0.926 \\ \text{test acc} & 0.887 \end{cases}$

SGD  $\begin{cases} \text{val acc} & 0.680 \\ \text{test acc} & 0.719 \end{cases}$

Step LR  $\begin{cases} \text{val acc} & 0.926 \\ \text{test acc} & 0.887 \end{cases}$   
.step()

$\begin{cases} \text{val acc} & 0.921 \\ \text{test acc} & 0.886 \end{cases}$   
.step(val\_loss)

Reduce on Plateau  $\begin{cases} \text{val acc} & 0.921 \\ \text{test acc} & 0.889 \end{cases}$   
.step(val\_loss)

Exponential LR  $\begin{cases} \text{val acc} & 0.936 \\ \text{test acc} & 0.881 \end{cases}$   
.step()

OneCycle LR  $\begin{cases} \text{val acc} & 0.921 \\ \text{test acc} & 0.884 \end{cases}$   
.step()

			1 <sup>st</sup>	2 <sup>nd</sup>
Multistep LR .step()	20, 40, 60	$\begin{cases} \text{val acc} & 0.921 \\ \text{test acc} & 0.898 \end{cases}$	0.921	0.926
	10, 30, 50	$\begin{cases} \text{val acc} & 0.921 \\ \text{test acc} & 0.886 \end{cases}$	0.921	0.884

Step LR  
.step()  $\begin{cases} \text{val acc} & 0.926 \\ \text{test acc} & 0.884 \end{cases}$

$\begin{cases} \text{val acc} \\ \text{test acc} \end{cases}$   
.step(val\_loss)

Reduce on Plateau  
.step(val\_loss)  $\begin{cases} \text{val acc} & 0.926 \\ \text{test acc} & 0.884 \end{cases}$

Exponential LR  
.step()  $\begin{cases} \text{val acc} & 0.680 \\ \text{test acc} & 0.719 \end{cases}$  ? drain  $\checkmark$

OneCycler LR  
.step()  $\begin{cases} \text{val acc} & 0.931 \\ \text{test acc} & 0.863 \end{cases}$

Multistep LR  
.step() 20, 40, 60  $\begin{cases} \text{val acc} & 0.921 \\ \text{test acc} & 0.889 \end{cases}$

10, 30, 50  $\begin{cases} \text{val acc} & 0.911 \\ \text{test acc} & 0.899 \end{cases}$

No scheduler  
val acc 0.926  
test acc 0.881

## Cross Entropy Loss

class weight loss

0.5	0.5	val acc	0.911	recall	0.9347
		test acc	0.899		

0.5	0.55	val acc	0.921	recall	0.9347
		test acc	0.899		

0.5	0.6	val acc	0.911	recall	0.9347
		test acc	0.894		

0.5	0.7	val acc	0.916	recall	0.9417
		test acc	0.884		

0.5	0.75	val acc	0.911	recall	0.9487
		test acc	0.894		

0.5	0.8	val acc	0.906	recall	0.9557
		test acc	0.898		

0.5	0.85	val acc	0.891	recall	0.9557
		test acc	0.811		

recheck dropout layer

1 dropout  $\begin{cases} \text{val acc} & 0.911 \\ \text{test acc} & 0.884 \end{cases}$  recall 0.9580

✓ 2 dropout  $\begin{cases} \text{val acc} & 0.906 \\ \text{test acc} & 0.894 \end{cases}$  recall 0.9487 why drop.?

3 dropout  $\begin{cases} \text{val acc} & 0.897 \\ \text{test acc} & 0.891 \end{cases}$

resnet 2048 ~~→~~ 1000 →

$\underbrace{1000 \rightarrow 512 \rightarrow 128 \rightarrow 2 \rightarrow \text{sigmoid}}$

vgg alexnet densenet

efficientnet

try efficientnet  $\begin{cases} \text{val acc} & 0.877 \\ \text{test acc} & 0.809 \end{cases}$   
( multistep lr

CrossEntropyLoss (10.5, 0.8)

AdamW

efficientnet freeze  $\begin{cases} \text{val acc} & 0.9310 \\ \text{test acc} & \underline{0.7940} \end{cases} \rightarrow \text{overfit!}$   
no scheduler

CrossEntropyLoss (0.5, 0.5)

AdamW

efficientnet unfreeze  $\begin{cases} \text{val acc} & 0.9709 \\ \text{test acc} & \underline{0.8860} \end{cases} \rightarrow \text{overfit}$   
no scheduler

CrossEntropyLoss (0.5, 0.5)

AdamW

Второй слой  $2048 \rightarrow 1000$  и  $2048 \rightarrow 2$  и т.д.

No scheduler, Adam, Crossentropyloss (0.5, 0.5)

resnet  $2048 \rightarrow 1000 \rightarrow 2$   $\begin{cases} \text{val acc} & \sim 0.84 \\ \text{test acc} & \sim 0.84 \end{cases}$

MultistepLR, AdamW, Crossentropy (0.5, 0.5)

resnet  $2048 \rightarrow 1000 \rightarrow$

$\underbrace{1000 \rightarrow 512 \rightarrow 128 \rightarrow 2 \rightarrow \text{sigmoid}}$

$\begin{cases} \text{val acc} & 0.906 \\ \text{test acc} & 0.894 \end{cases}$  recall 0.9987

MultistepLR, AdamW, Crossentropy (0.5, 0.8)

resnet 2048 → 1000 → 512 → 128 → 2 → sigmoid  
|  
get pretrained

freeze { val acc 0.9014  
          test acc 0.8927 } recall 0.9394

unfreeze { val acc 0.9802  
           test acc 0.9078 } recall 0.9091 ?

No scheduler, Adam, Crossentropy loss (0.5, 0.8)

unfreeze { val acc 0.9704  
           test acc 0.8777 } recall 0.9393

∴ ได้นี้หัวข้อด้วย

resnet152

dropout 2 ชั้น layer 2048 และ 1000

dropout\_rate\_1, dropout\_rate\_2 \*

AdamW optimizer - weight decay \*  
learning rate \*

lr.scheduler ใช้ multistep - milestone [10, 30, 50] \*

gamma 0.1 \*

CrossEntropyLoss ใช้ weight 0.5, 0.8 \*



AdamW optimizer : lr 0.0001  
weight decay 0.01

```
** Model Evaluation **  
Best Valid Accuracy: 0.9064039408866995  
Test Accuracy: 0.897822445561139  
Precision: 0.9070796460176991  
Recall: 0.9557109557109557  
F1-score: 0.9307604994324631  
AUROC: 0.9523809523809523  
AUCPR: 0.9805531734516826
```

AdamW optimizer : lr 0.0001  
weight decay 0.01

$$\text{recall} = \frac{TP}{TP + FN}$$

$$\text{precision} = \frac{TP}{TP + FP}$$

ทดลองเพิ่มตัวโมเดล ทดสอบกับขนาด x resnet152 (~60m parameter)

efficientnet b7

AdamW

Reduce on Plateau lr scheduler

CrossEntropyLoss (10.5, 0.5)

freeze	val acc	0.8768	recall	0.7940
	test acc	0.7940		

unfreeze	val acc	0.9557	recall	0.8661
	test acc	0.8693		

alexnet

AdamW

Reduce on Plateau lr scheduler

CrossEntropyLoss (0.5, 0.5)

freeze	val acc	0.8424	recall	0.8275
	test acc	0.7739		
unfreeze	val acc	0.6798	recall	1.000
	test acc	0.7186		