Group 21: Zeljko Antunovic (s233025), Alex Belai (s233423), Lukas Samuel Czekalla (s233561), Filip Penzar (s232452), Nándor Takács (s232458)

## Origin of the data:

- Subset of ImageNet-Dataset
- HOTDOG = chilidog & hotdog classes
- *NO-HOTDOG* = pets, furniture, people, food & frankfurter classes

## **Initial data transformation:**

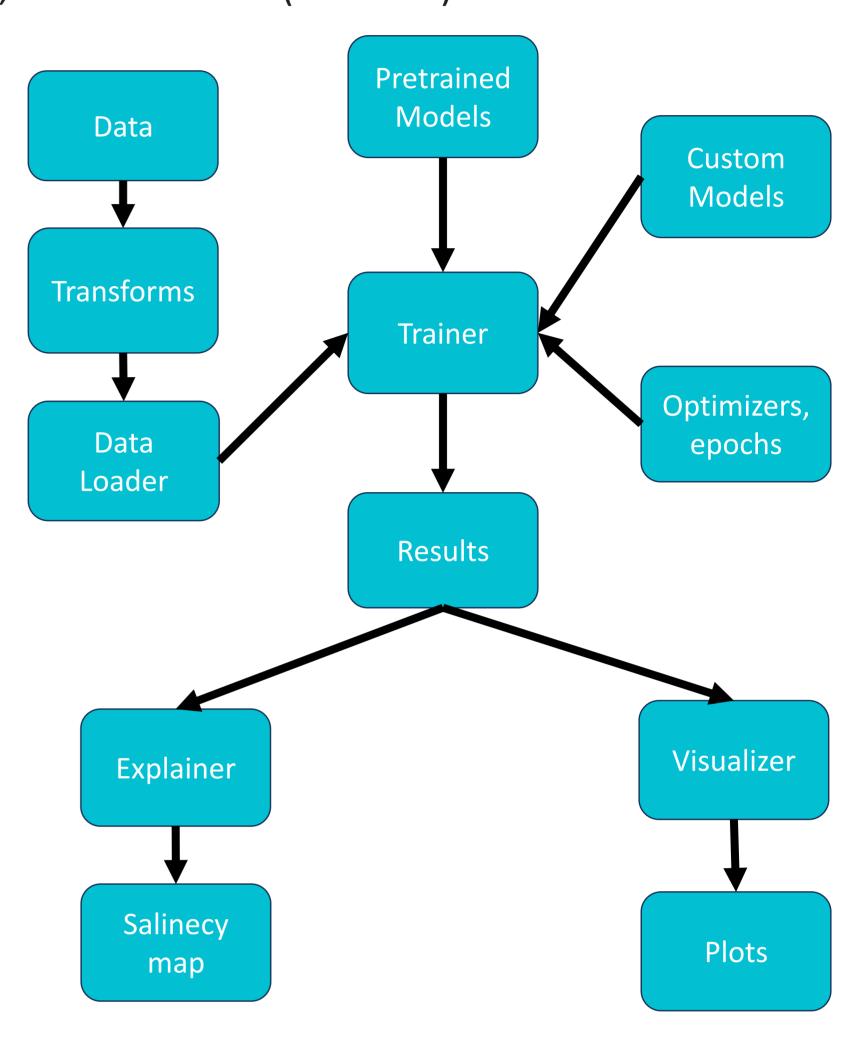
- Resizing to  $256 \times 256 px$
- Normalization w.r.t. ImageNet mean & std

## **Data Composition:**

Training-data		Test-data	
hotdog	no-hotdog	hotdog	no-hotdog
1075	972	895	967

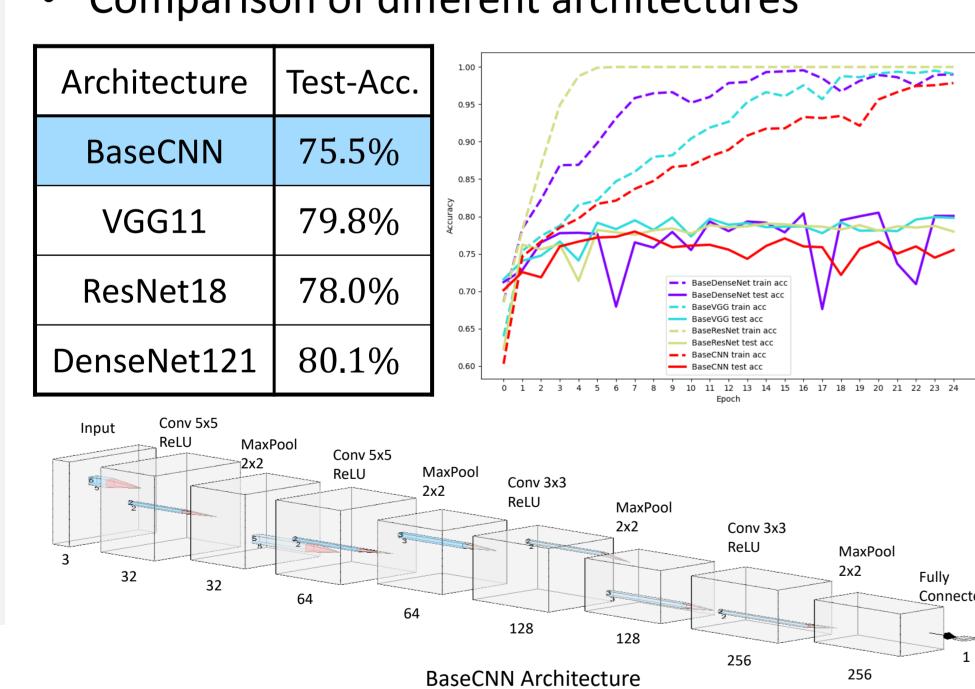
Small amount of images = risk of overfitting





## **Baseline setup**

- One output neuron with sigmoid
- Loss Function = Binary Cross Entropy
- Optimizer = Adam with  $l_r = 10^{-4}$
- No X-Val. Or 3<sup>rd</sup> validation set
- Training for 25 epochs
- Comparison of different architectures



## Regularization

Modification of BaseCNN architecture

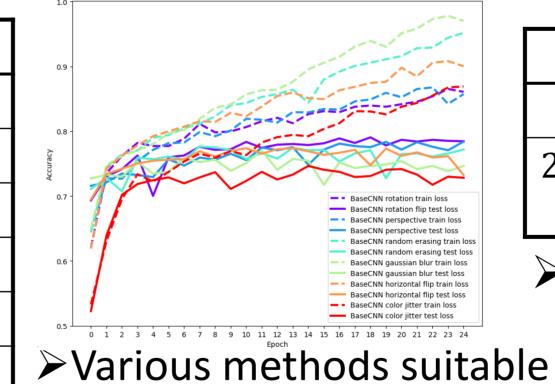
	J. 2000	1.0
Method	Test-Acc.	
Dropout $p = 0.05$	75.4%	0.9 -
Dropout $p = 0.2$	76.6%	≥ 0.8 -
Batchnorm	74.8%	Accuracy Acc
$WD w = 10^{-3}$	74.0%	0.7 - MoreDropoutCNN train  MoreDropoutCNN test  DropoutCNN test acc  DropoutCNN train acc  BatchNormCNN train a
$WD W = 10^{-4}$	74.0%	BatchNormCNN test ac  BaseCNN wd=1e-5 test  BaseCNN wd=1e-3 trai  BaseCNN wd=1e-3 trai  BaseCNN wd=1e-3 test
$WD W = 10^{-5}$	75.1%	BaseCNN wd=1e-4 trai BaseCNN wd=1e-4 trai BaseCNN wd=1e-4 tesi  0 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22 23  Epoch

## **Data Augmentation**

➤ Dropout is promising

Using BaseCNN architecture & randomness

ſ	N 4 - 1	Table Asse
	Method	Test-Acc.
	Horizontal Flip	73.2%
	Rotation	78.5%
	Perspective	78.4%
	Color Jitter	72.8%
d	Gaussian Blur	74.7%
	Random Erasing	77.2%



**Transfer Learning** 

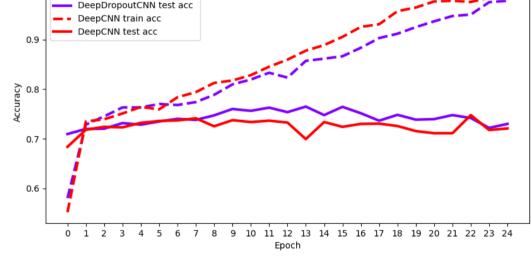
- Pretrained classifiers on ImageNet-data
- Convolutional layers are frozen
- Retraining of fully-connected layers

		1.0 -
Model	Test-Acc.	0.9 - /
VGG11	91.6%	Curacy
ResNet18	88.6%	0.7 - FrozenPretrainedVGG11 train acc FrozenPretrainedVGG11 test acc
DenseNet121	90.3%	0.6 - FrozenPretrainedDenseNet121 train a FrozenPretrainedDenseNet121 test ac FrozenPretrainedResNet18 train acc FrozenPretrainedResNet18 test acc
		0 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22 23 24

- ResNet & DenseNet don't show overfitting Increase depth of model
- BaseCNN with  $2 \times$  amount of conv. layers

Method	Test-Acc.	1.0 - DeepDropoutCNN train acc DeepDropoutCNN test acc DeepCNN train acc DeepCNN test acc
$2 \times \text{conv. layers}$	72.1%	0.9
2 × conv. layers + dropout	73.0%	0.7 -
Stronger ove	0.6	

**Smoothgrad Saliency Map** 



Stronger overnitting

## Archite

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# Final CNN Architecture

## **Architecture Considerations**

- Convolutional layers increasing channels  $\times$  2
- Kernel size in conv. layers:  $5 \times 5$  and  $3 \times 3$
- Max-Pooling  $(2 \times 2)$  reduces spatial dim. by  $\times 2$
- Dropout (0.1) & weight-decay ( $10^{-5}$ ) against overfitting
- One fully-connected layer

## Re Ø

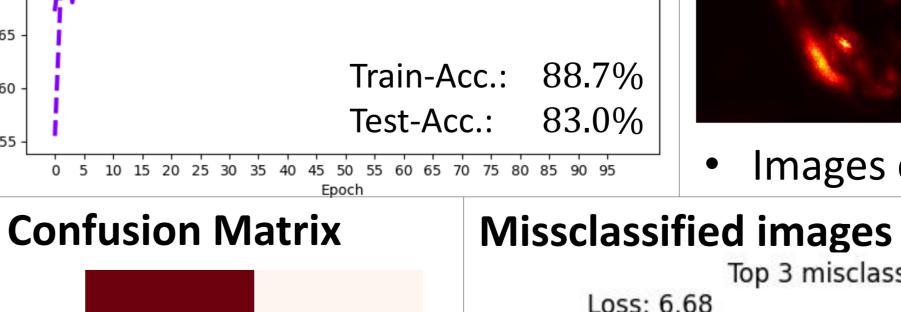
## Training results of final arch. - Marining Marining | Train-Acc.: Test-Acc.:

768

189

Hotdog

Predicted Label



127

778

No Hotdog



Top 3 misclassified images with highest loss Loss: 7.04

Images classified as hotdog



Tar: Hotdog, Pred:No Hotdog

Tar: Hotdog, Pred:No Hotdog