Pawpularity

Demi Soetens, Bente van Katwijk, Ilse Feenstra, Cass Maes







'Pawpularity' van zwerfdieren



Foto's voor asiel Maleisië

Welke doen het het beste?





Pawpularity score: hoe vaak een pagina bekeken wordt

- Tussen 0 en 100



Doel: het creëren van een model dat de Pawpularity score van foto's voorspelt





De data



9.912 foto's van dieren



12 mogelijke kenmerken van de foto's





Binaire (tabular) data

	Id	Subject Focus	Eyes	Face	Near	Action	Accessory	Group	Collage	Human	Occlusion 0	Info	Blur	Pawpularity
0	0007de18844b0dbbb5e1f607da0606e0	0	1	1	1	0	0	1	0	0	0	0	0	63
1	0009c66b9439883ba2750fb825e1d7db	0	1	1	0	0	0	0	0	0	0	0	0	42
2	0013fd999caf9a3efe1352ca1b0d937e	0	1	1	1	0	0	0	0	1	1	0	0	28
3	0018df346ac9c1d8413cfcc888ca8246	0	1	1	1	0	0	0	0	0	0	0	0	15
4	001dc955e10590d3ca4673f034feeef2	0	0	0	1	0	0	1	0	0	0	0	0	72





Pawpularity score: 14



Preprocessing van de data



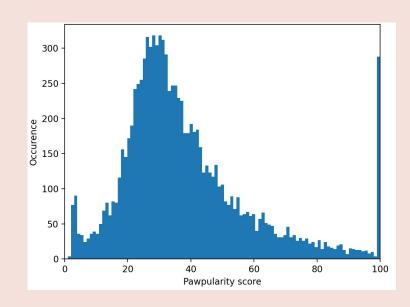
Plaatjes: 64 x 64 x 3



Image normalization

- Standaarddeviatie
- Mean centering
- **

Outliers



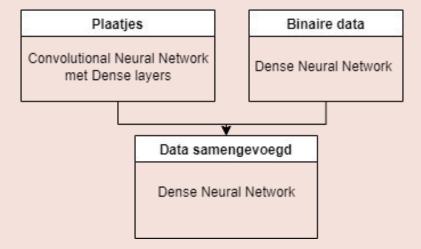
Basis model

Plaatjes: Convolutional neural network met Dense layers

🐾 Binaire data: Dense neural network

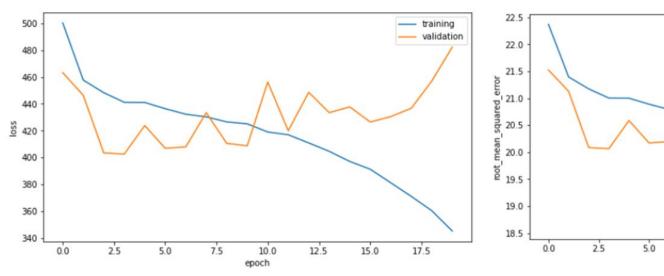
Loss: mean squared error (MSE)

Metric: root mean squared error (RMSE)

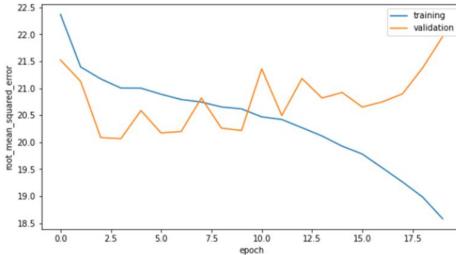


Basis model

Model loss of basic model



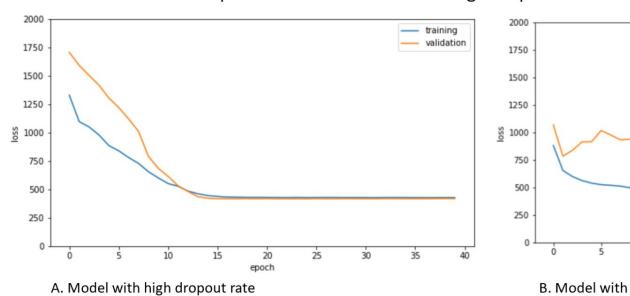
A. Mean squared error

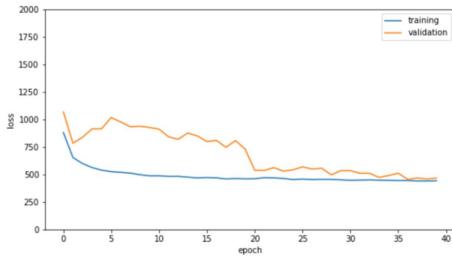


B. Root mean squared error

Dropout

Comparison of the model loss of high dropout rate vs. a reduced dropout rate

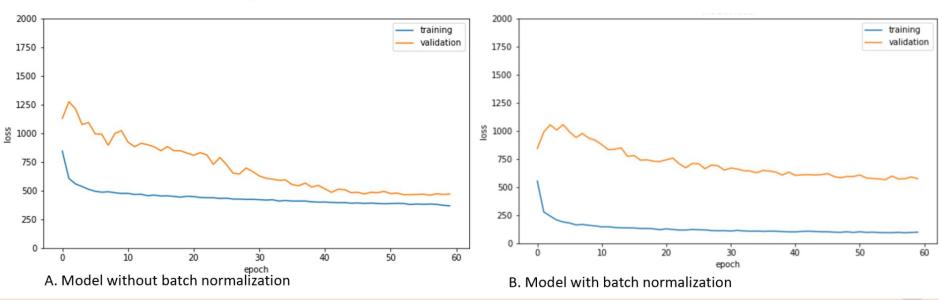




B. Model with reduced dropout rate

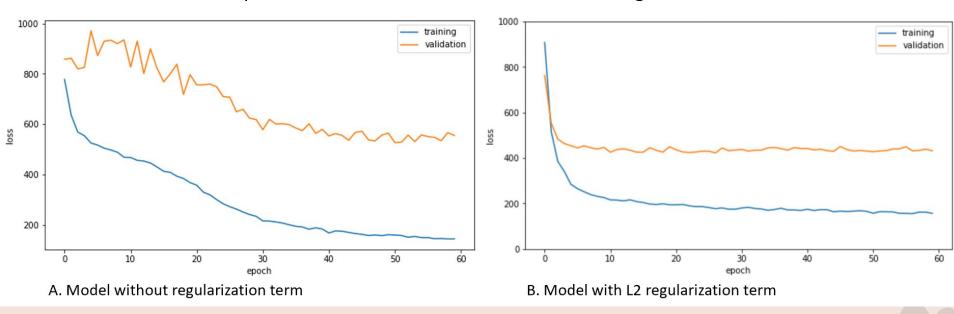
Batch normalization

Comparison of the model loss with vs without batch normalization





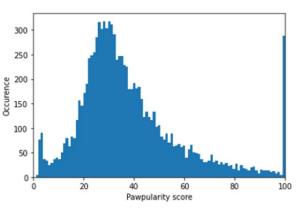
Comparison of the model loss with vs. without regularization term



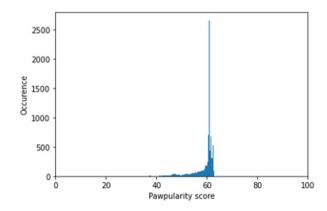


Outliers

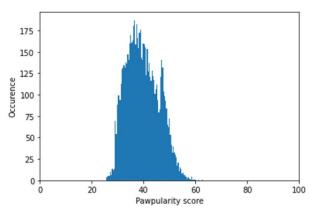
Comparison of the real vs predicted data distributions



A. Distribution of Pawpularity score



B. Distribution of predicted Pawpularity score



C. Distribution of predicted Pawpularity score after removal outliers



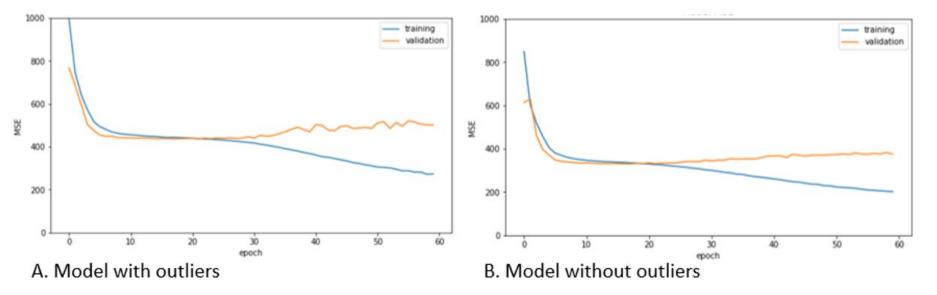


Outliers verwijderen



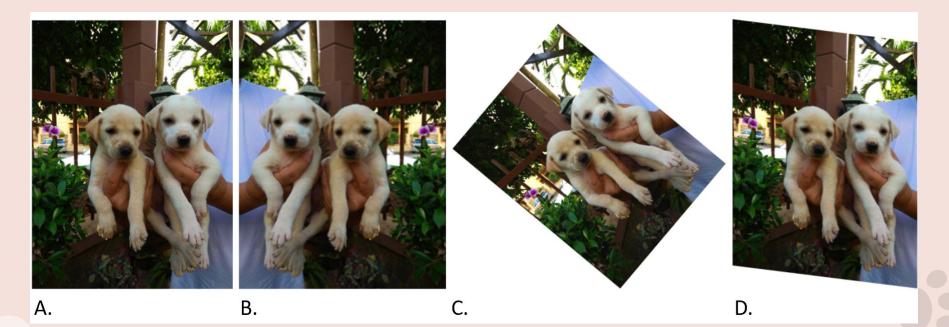
Outliers bij Pawpularity score 100

Comparison of model with and without outliers



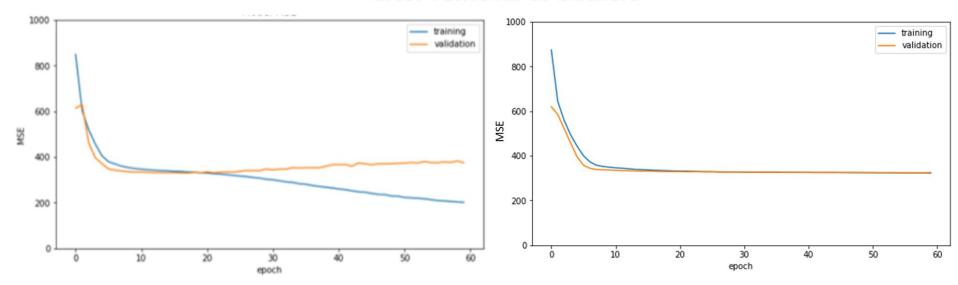
Data augmentation

Horizontal flip, rotation range 90° en shear range 20%



Data augmentation

Comparison of the model loss with vs without data augmentation after removal of outliers

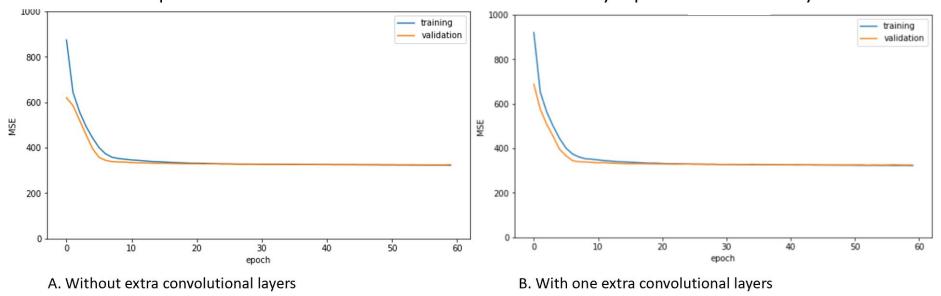


A. Without data augmentation

B. With data augmentation

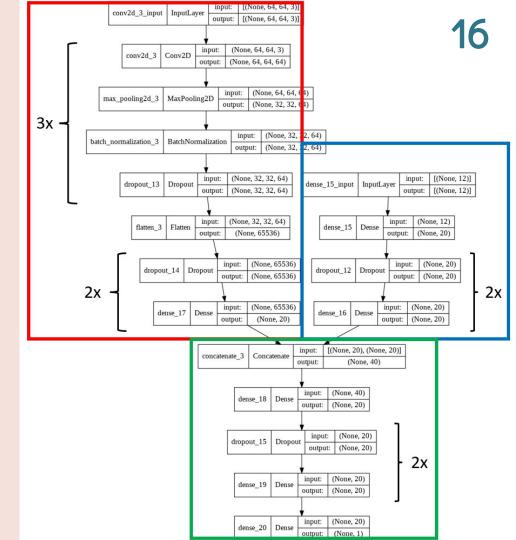
Extra convolutional lagen

Comparison of model loss with and without one extra layer per convolutional layer



Overzicht uiteindelijke model

- Tabular netwerk
- Convolutional netwerk
- Concatenated netwerk





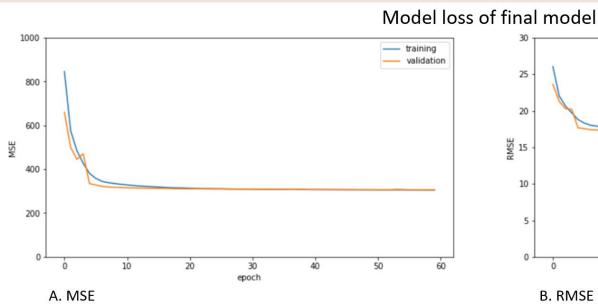
Prestatie uiteindelijke model

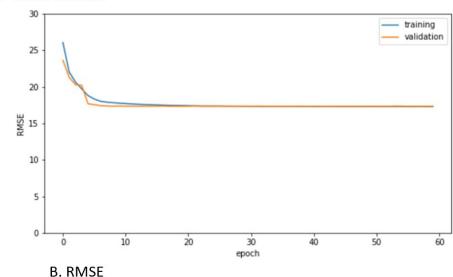


Validation MSE 302 vs 482



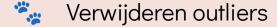
Validation RMSE 17 vs 22





Hoe krijg je het beste model?

Do's



Data augmentation

Dropout

🐾 Regularization terms

Batch normalization

Lineaire output 0 - 100

Don'ts

🐾 Verwijderen lagen in tabular netwerk

Extra convolutional lagen toevoegen

Meer hidden nodes toevoegen

Andere activatie functies

Hoe nu verder?

- Transfer network
- Ensemble of models
- Hyperparameters random kiezen



Bedankt voor jullie aandacht!

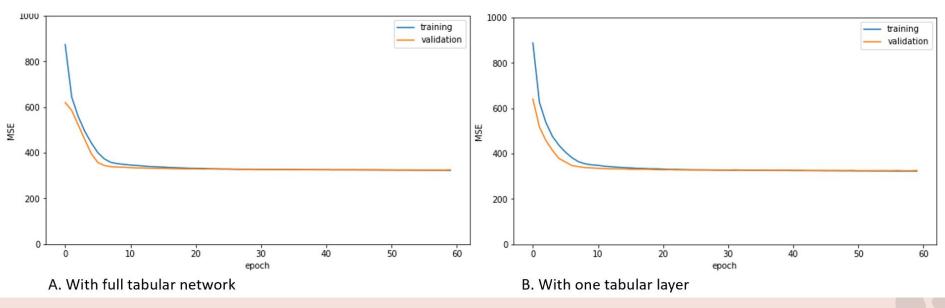
Vragen?





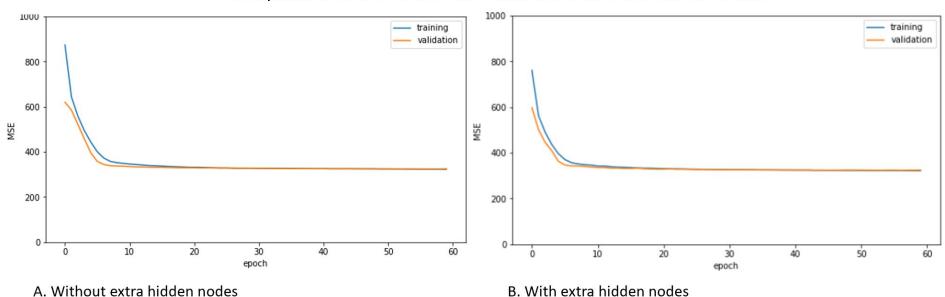
Verwijderen lagen

Comparison of model loss with full tabular network vs simple tabular network



Extra hidden nodes

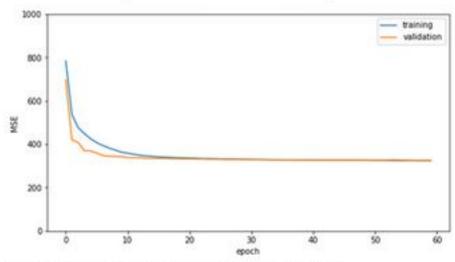
Comparison of model loss with and without extra hidden nodes



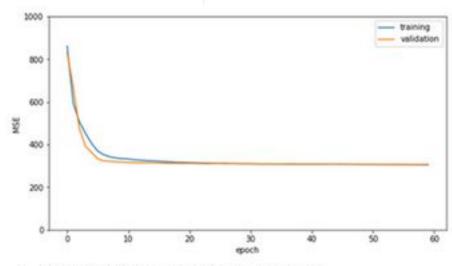


Removal lower outliers

Comparison of the model performance with and without lower outliers removed



A. Model without lower outliers removed



B. Model with lower outliers removed

