

Neural Decision Forests and *multree*¹

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¹<https://github.com/DavidRdgz/multree>

Outline

Background

Related Work

Neural Network Review

Neural Trees with rNets

Neural Decision Forests

Conclusion

Bonus (time permitting)

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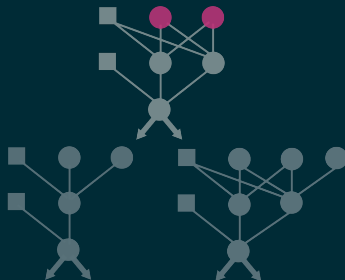
Conclusion

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Net Inputs

Feed Forward:

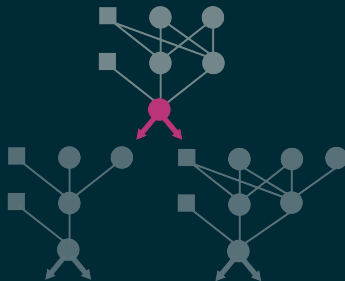
- Inputs: x, y .
- Flow to Output.



Net Output

Feed Forward:

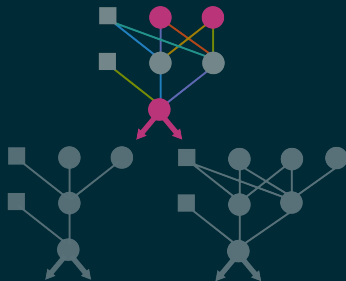
- ▶ Output Activation
 $f(x) = [1 + e^{-x}]^{-1}$
- ▶ Binary Class Separation.



Net Training

Training:

- ▶ L_2 Regularization.
- ▶ Done, divide.



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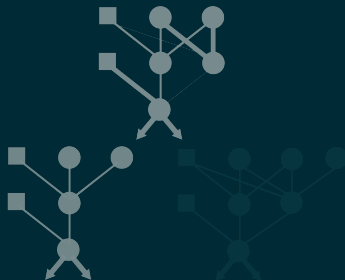
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Randomized Nets

Randomized Nets:

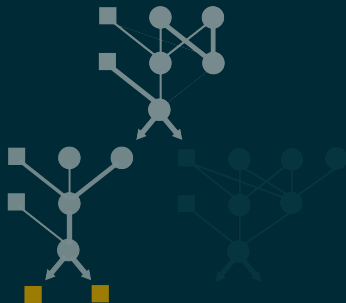
- ▶ Input - random.
- ▶ Hidden layer - random.
- ▶ Output - binary.



Leaves

Leaf:

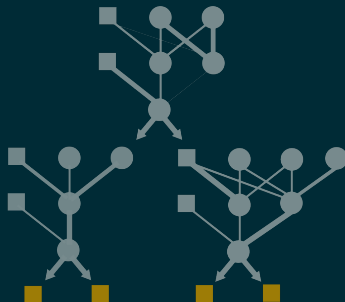
- ▶ Child subset - 1 class.



Greedy Trees

Iter:

- till all leaves.



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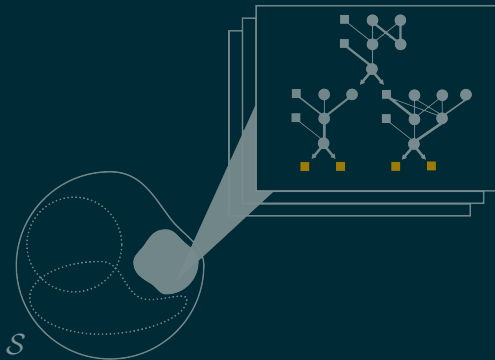
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Ensemble Predictors

Forest:

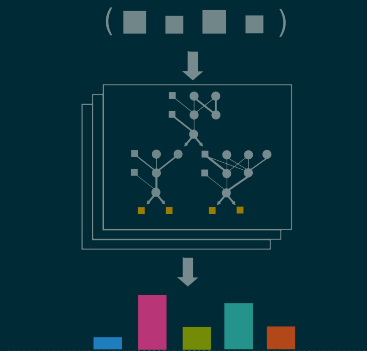
- ▶ Bootstrap Aggregating.



1-Vote, Popular Vote

Prediction:

- ▶ Histogram.
- ▶ Predict pink.



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Neural decision forests

Prevent Overfitting

Using ensemble with low bias + low variance = low error.

Embedded Variable Selection

Embedded at each rNet.

Signal Processing

Windowing techniques.

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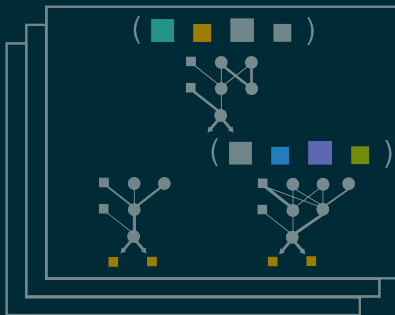
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Signal Processing

Window:

- ▶ Sample sequence.

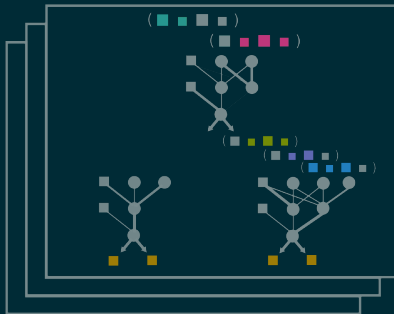


Signal Processing



Random Window:

- ▶ N-Sampled sequences

- ▶ rNet 1: 2 samples.
- ▶ rNet 2: 3 samples.



For Further Reading I

-  S. Rota Bulo and P. Kotschieder, *Neural decision forests for semantic image labelling*, Computer Vision and Pattern Recognition (CVPR), 2014 IEEE Conference on, June 2014, pp. 81–88.
-  J. Stromberg, J. Zrida, and Alf Isaksson, *Neural trees-using neural nets in a tree classifier structure*, Acoustics, Speech, and Signal Processing, 1991. ICASSP-91., 1991 International Conference on, Apr 1991, pp. 137–140 vol.1.