

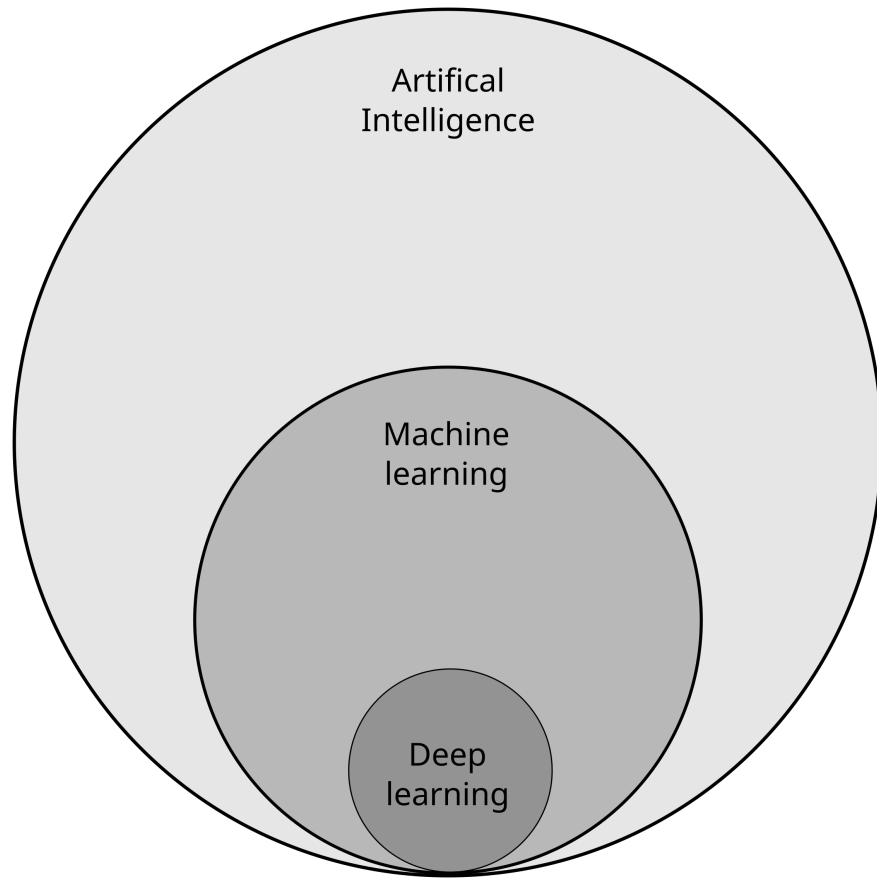
Introduction to Health Analytics

Introduction to Machine Learning for Health Analytics

Dr. Sam Burn

Today

What is machine learning?



Uses of AI in health analytics

AI is used across the healthcare system to:

Examples of AI tools used in healthcare

| Tool | Used for | Used by |
|---------------------|---|-----------------------|
| Aidoc | Facilitating early disease detection and minimizing diagnostic errors | Hospitals |
| Shift Technology | Streamlining claims processing and fraud detection | Insurance companies |
| Atomwise | Identifying potential drug candidates and predicting their efficacy | Drug development |
| BenevolentAI | Decreasing the time and expense associated with bringing new treatments to market | Drug development |
| Digital Diagnostics | Detecting conditions such as diabetic retinopathy and skin cancer from medical images | Diagnostics |
| PathAI | Achieving results comparable to those of experienced clinicians in diagnostics | Diagnostics |
| Qventus | Enhancing operational efficiency using AI-powered predictive analytics | Healthcare facilities |
| LeanTaaS | Optimizing resource allocation and reducing operational costs | Healthcare facilities |

Source: DataCamp, "AI in Healthcare"

<https://www.datacamp.com/blog/ai-in-healthcare>

What is the goal of machine learning?

Training and testing data

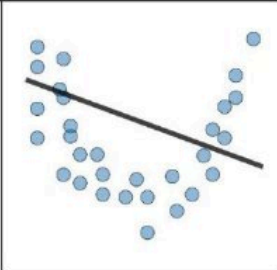

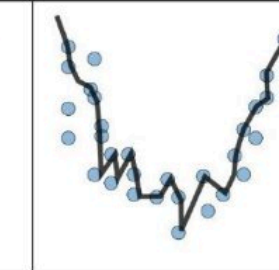
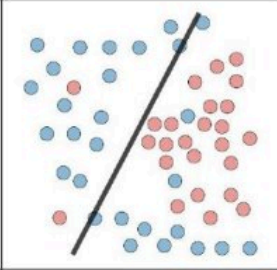
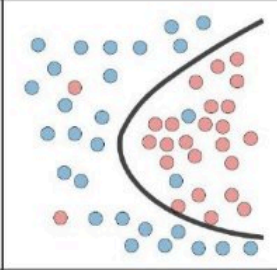
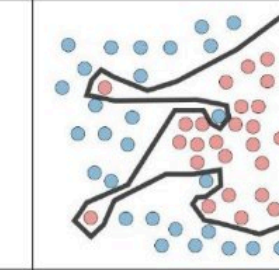
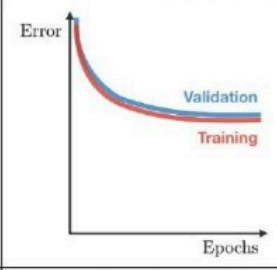
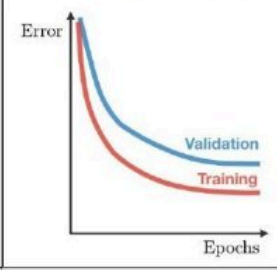
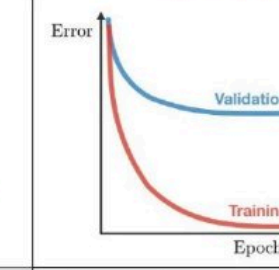
Training

Used for
model
development

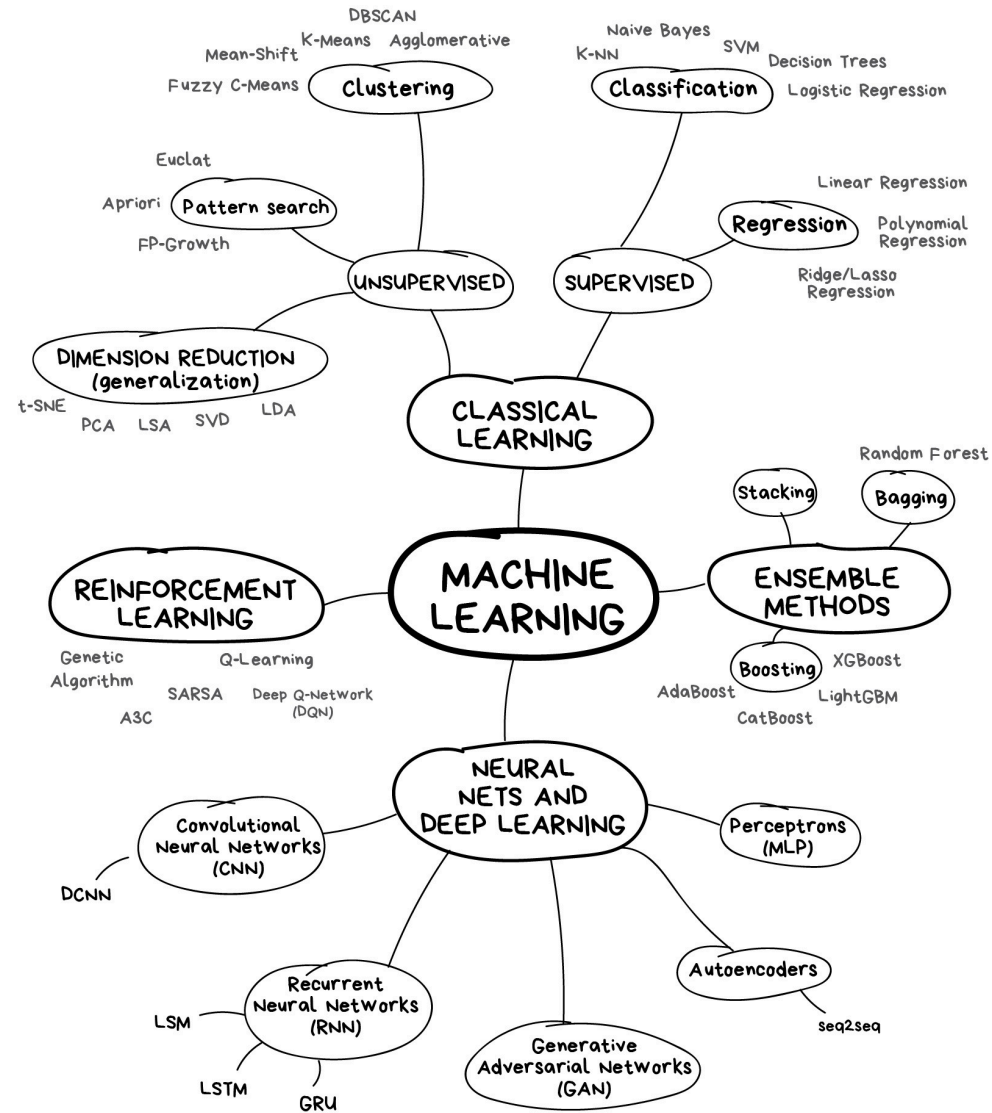
Testing

Used to
evaluate final
model

The problem of overfitting

| | Underfitting | Just right | Overfitting |
|----------------|--|---|--|
| Symptoms | <ul style="list-style-type: none"> - High training error - Training error close to test error - High bias | <ul style="list-style-type: none"> - Training error slightly lower than test error | <ul style="list-style-type: none"> - Low training error - Training error much lower than test error - High variance |
| Regression |  |  |  |
| Classification |  |  |  |
| Deep learning |  |  |  |
| Remedies | <ul style="list-style-type: none"> - Complexify model - Add more features - Train longer | | <ul style="list-style-type: none"> - Regularize - Get more data |

Machine learning methods

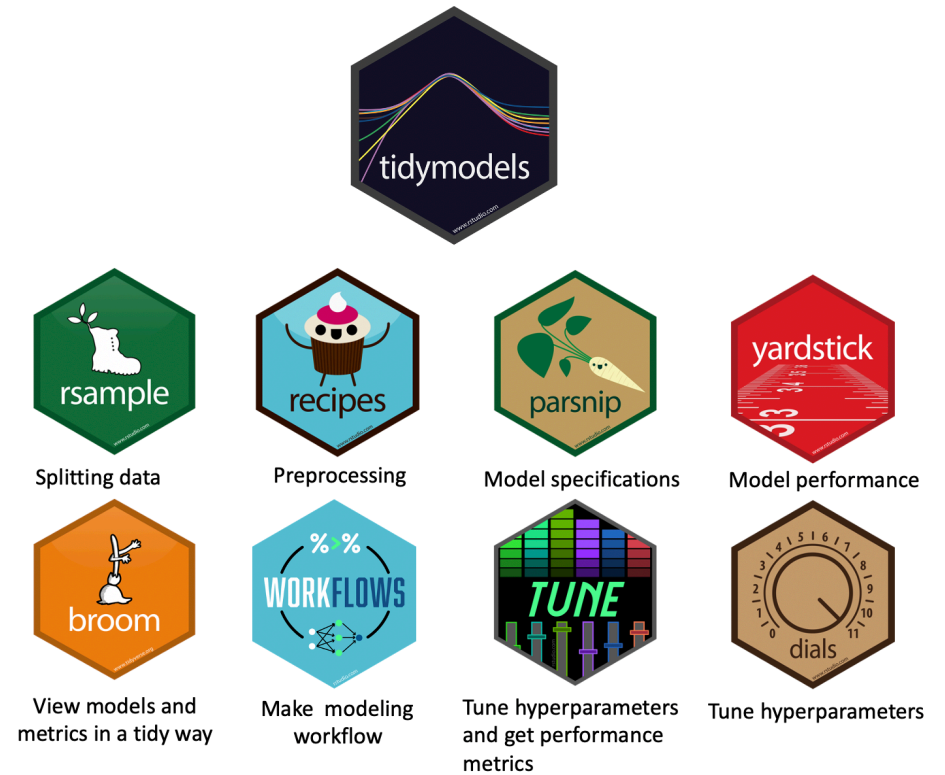


Source: https://vas3k.com/blog/machine_learning/

A basic typology of machine learning methods

A note on terminology

Machine learning in R: {tidymodels}



Source: rpubs.com/chenx/tidymodels_tutorial

Recipe and workflow



Exercise: Exploratory data analysis and standard logit

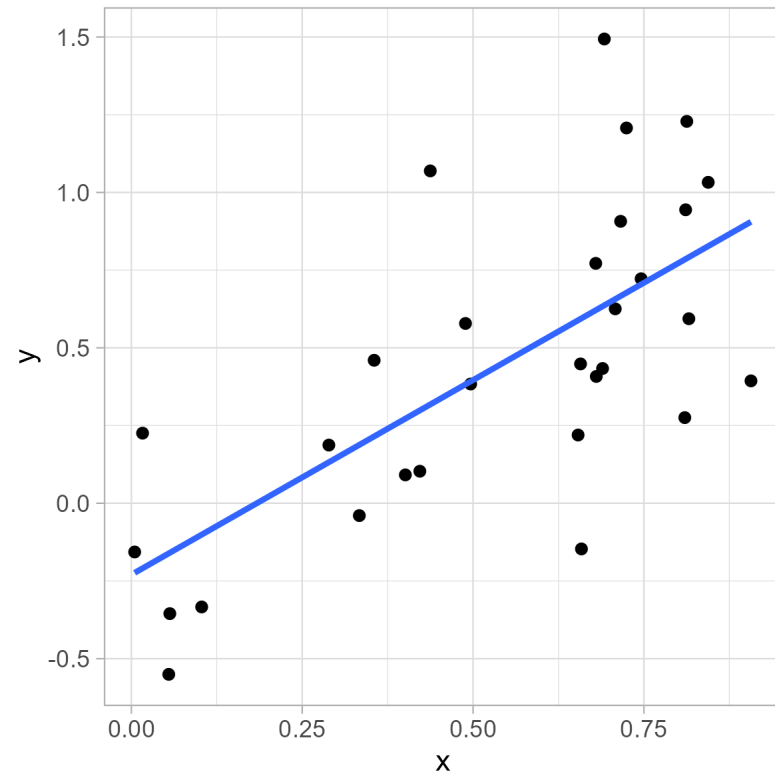
10:00

LASSO regression

Linear and logistic regression models

Linear regression

```
1 lm(y ~ x, data = model_data)
```



LASSO regression

LASSO regression

Hyperparameters

Evaluating model fit

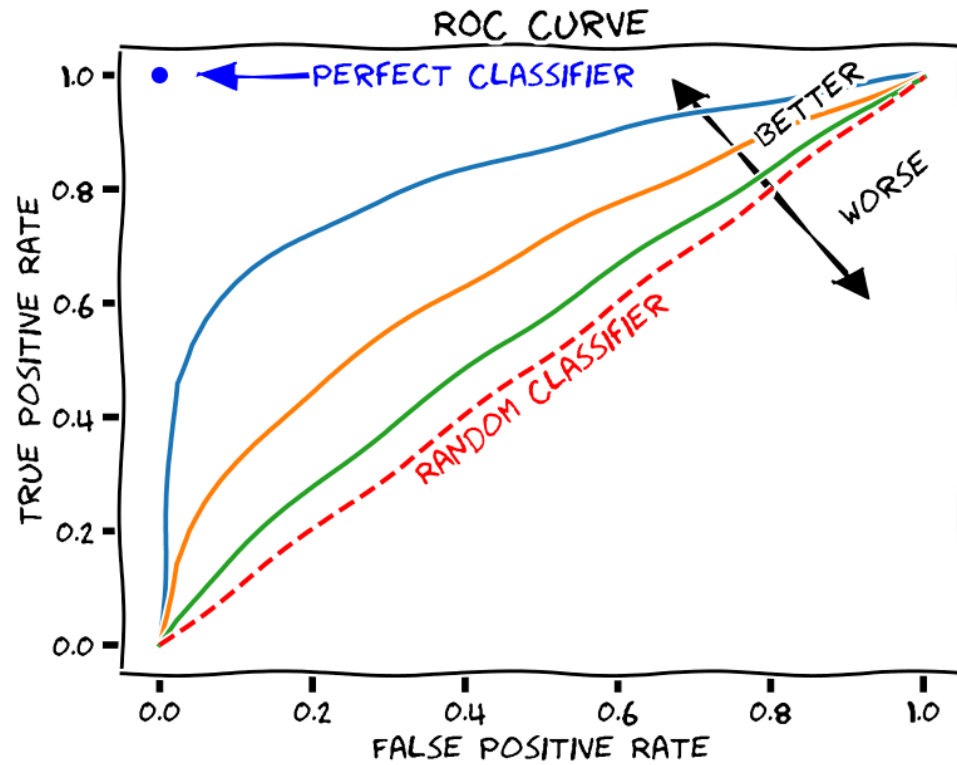
Evaluating model fit

Confusion matrix

| | Predicted 1 | Predicted 0 |
|-----------------|---------------------|---------------------|
| Actual 1 | True Positive (TP) | False Negative (FN) |
| Actual 0 | False Positive (FP) | True Negative (TN) |

The limitation of confusion matrices

ROC curve: performance across thresholds



Source: Martin Thoma (Wikipedia)

Exercise: Estimating a LASSO logistic regression in R

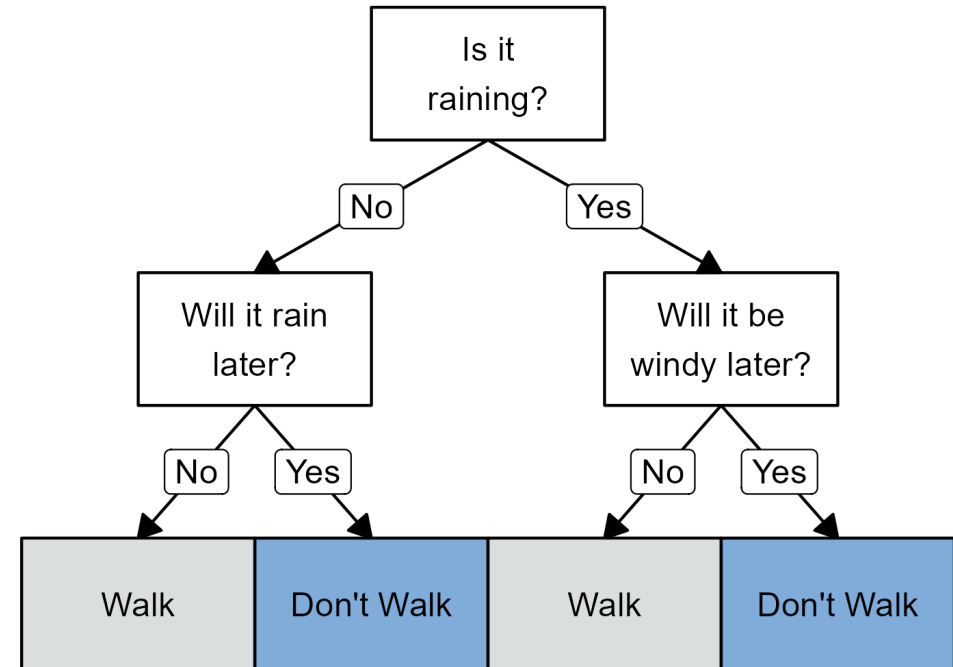
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Random Forests

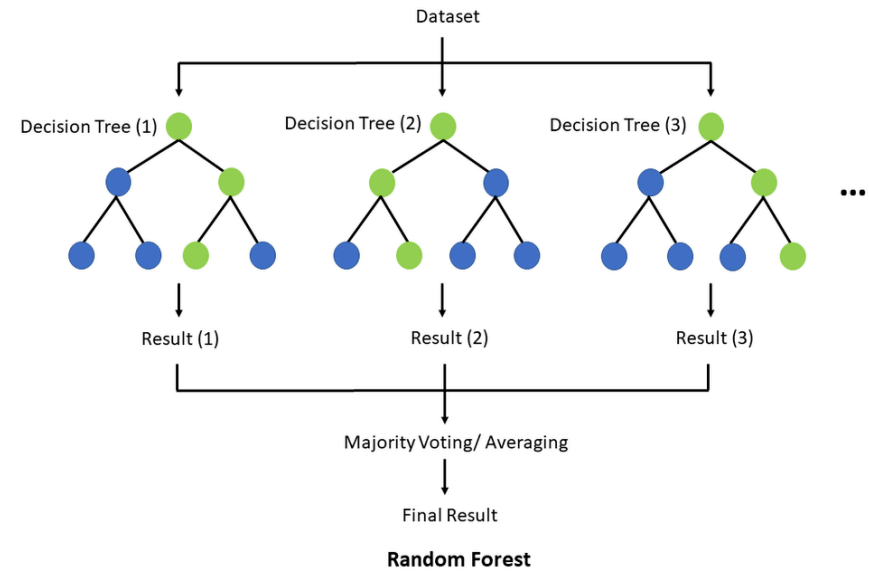
Decision trees

A tree-like model of decisions and their possible consequences.

Should I walk to work?



What are Random Forests?



Source: Tse Ki Chun (Wikimedia)

Hyperparameters for random forests

Exercise: Random Forests in {tidymodels}

10:00

Takeaways

Thank you