Testing your ML pipelines

Applied ML days 2020

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"You can't test 'machine learning' because of its stochastic nature"

Random

"The engineer can do the production readiness things like testing"

Random

Testing pyramid

ML Validation

Integration tests

Unit tests

Unit testing

"It's a system for testing your thoughts against the universe, and seeing whether they match"

Isaac Asimov.

Unit testing

Replacing / Formatting values

Products of other features

Balancing classes

Wrapping ML libraries

Unit testing



Ensures data is cleaned as expected



Helps split the code



Documents the cleaning process



Helps debugging

Integration testing

Because "The unclouded eye was better, no matter what it saw."

Frank Herbert

Integration testing



Checks that cleaning results in expected input to model



Can data be consumed by the model config?



Helps refactor

Use case validation

Why? "To exhibit the perfect uselessness of knowing the answer to the wrong question."

Ursula K. Le Guin.

Use Case Validation

A model alone is not the product



Ensure that it helps solve the problem that the product needs



Documents
business
decisions
around model



Can use to promote model



Provides visibility

In the wild: Monitoring

After all "Magic's just science that we don't understand yet"

Arthur C. Clarke.

