

# DCA0305 Machine Learning Based Systems Design

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## A Long Pathway

#### **Vector & Matrices**

Matrices & Vector Arithmetics Types, Operations Factorization

#### Calculus

Derivatives

@ivanovitchm/imd0033\_2019\_1

### Exploratory Data Analysis

Measurements of Centrality (mean, mode, median, variance, std, z-score)

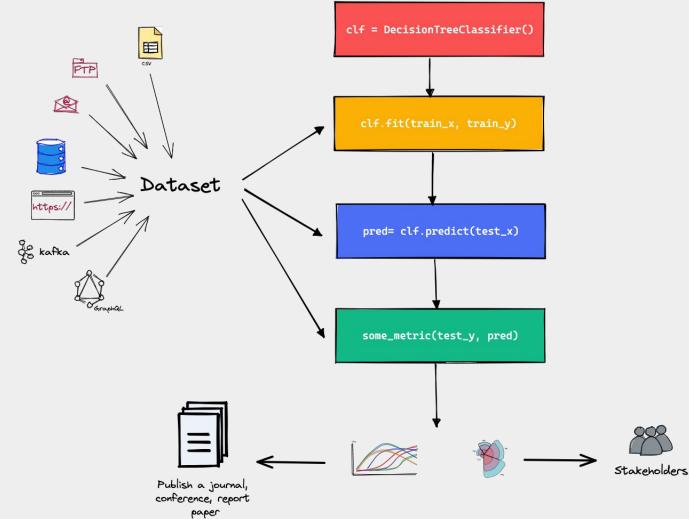
### **Data Pipeline**

Collect, clean, preparation, model, analysis, interpretation, viz

 ${\it Deploy}, monitoring \ solution \\ {\it @ivanovitchm/ppgeecmachinelearning 2020.2}$ 

Linear Algebra & Math	Probability & Statistics	Data Science	Machine Learning	Deep Learning
	Probability Conditional Probability Distributions Bayesian Probability  Statistics Data Viz, Central Limit Theorem Hypothesis Tests, Correlation Resampling Methods	@ivanovitchm/datascience2020.6	http Supervised Learning KNN, Linear regression, Logistic Regression, Decision Tree, Random Forest, Ensemble, XGBoost, MLP Unsupervised Learning K-Means, PCA	Fundamentals of Deep Learning Better Generalization vs Better Learning Hyperparameter tuning Batch normalization Convolutional Neural Networks Transfer Learning





A typical ML workflow







# when you write very long code



## NAMING VARIABLES



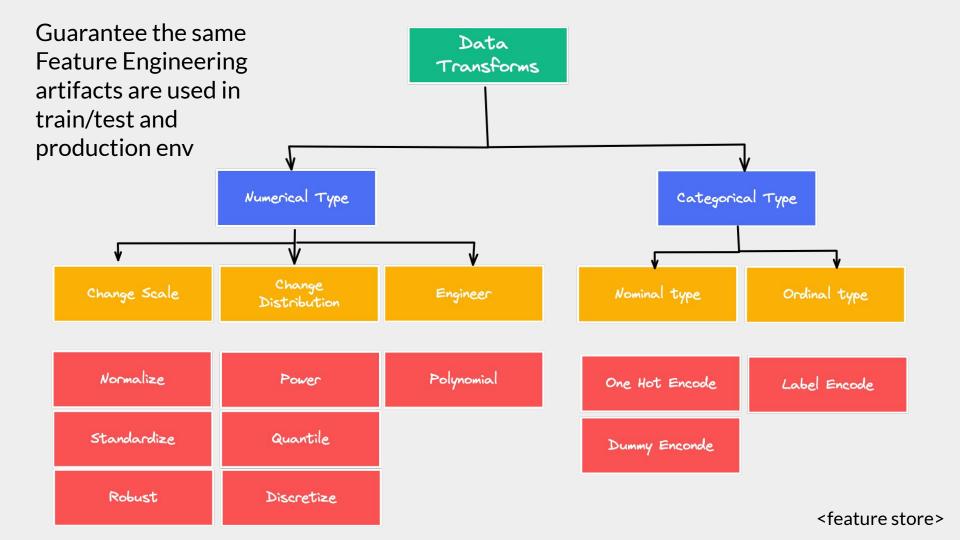
Giving them meaningful names, according to their use.



Giving them the most compact names possible, for less storage usage.



Giving them random names like "ahshjdn" or "yeetus".







Article

## Predictive Models for Imbalanced Data: A School Dropout Perspective

Thiago M. Barros <sup>1,\*,†</sup>, Plácido A. Souza Neto <sup>1,†</sup> and Ivanovitch Silva <sup>2,†</sup> and Luiz Affonso Guedes <sup>2,†</sup>

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Abstract: Predicting school dropout rates is an important issue for the smooth educational system. This problem is solved by classifying students into two classes activities related statistical datasets. One of the classes must identify the students who have the tendency to persist. The other class must identify the students who have the tendency to dropout. This problem often encounters a phenomenon that masks out the obtained results. This study delves into this phenomenon and provides a reliable educational data mining technique that accurately predicts the dropout rates. In particular, the three data classifying techniques, namely, decision tree, neural networks and Balanced Bagging, are used. The performances of these classifies are tested with and without the use of a downsample, SMOTE and ADASYN data balancing. It is found that among other parameters geometric mean and UAR provides reliable results while predicting the dropout rates using Balanced Bagging classifying techniques.

**Keywords:** dropout rates; accuracy paradox; imbalanced learning; downsample; g-mean predict; mlp; decision tree; Balanced Bagging; UAR; SMOTE; ADASYN

## Concept/Data

Evasão escolar de crianças e adolescente aumenta 171% na pandemia, diz estudo

**EDUCAÇÃO** 

Levantamento da organização Todos Pela Educação mostra que 244 mil crianças de 6 a 14 anos estavam fora da escola no segundo trimestre de 2021.

lizado há 3 meses



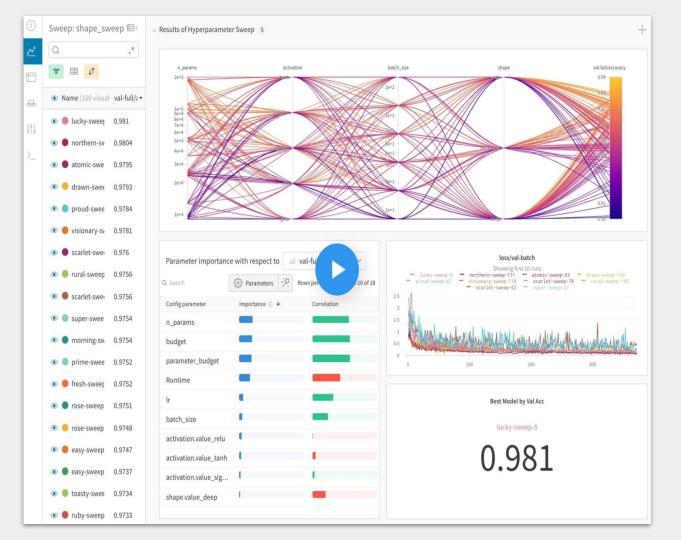
is de 650 mil crianças am da escola durante a demia

Pela primeira vez desde 2005, país registrou queda de matrículas na educação infantil

#### PERSPECTIVA 2022

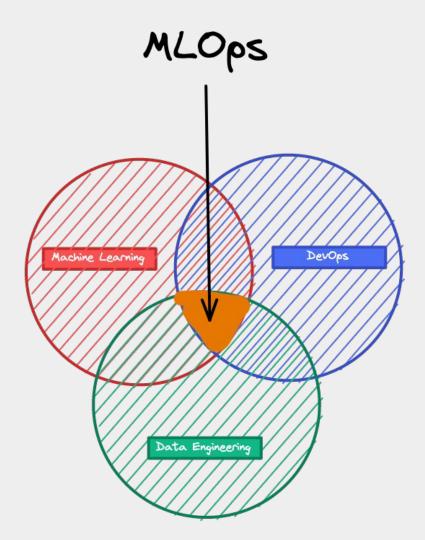
## Evasão escolar bate recordes durante a pandemia

Colégios abertos, mas sem alunos. Com cerca de 240 mil estudantes fora das salas de aula a desistência é o maior desafio de 2022. Especialistas afirmam que esse é o pior cenário em 20 anos



What settings were used in the last experiment?

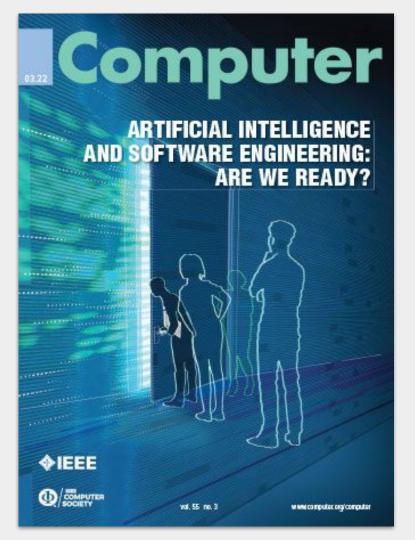
experiment tracking dataset versioning model management



## Syllabus 😊 😎 🥥

Introduction to Data Science
Clean Code Principles
Fundamentals of ML
Building Reproducible Model Workflow
Deploy a Scalable ML Pipeline in Production
ML Model Scoring and Monitoring





S. Warnett and U. Zdun, "Architectural Design Decisions for the Machine Learning Workflow" in **Computer**, vol. 55, no. 03, pp. 40-51, 2022. Doi: 10.1109/MC.2021.3134800

H. Washizaki, et al.," *Software-Engineering Design Patterns for Machine Learning Applications*" in **Computer**, vol. 55, no. 03, pp. 30-39, 2022. doi: 10.1109/MC.2021.3137227

A. Mashkoor, T. Menzies, A. Egyed and R. Ramler, "Artificial Intelligence and Software Engineering: Are We Ready?" in Computer, vol. 55, no. 03, pp. 24-28, 2022. doi: 10.1109/MC.2022.3144805

R. Sangwan, Y. Badr, S. Srinivasan and P. Mukherjee, "On the Testability of Artificial Intelligence and Machine Learning Systems" in **Computer**, vol. 55, no. 03, pp. 101-105, 2022. doi: 10.1109/MC.2021.3132710



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Active Learning



Complementary





Data Scientist With Python Data Analyst With R Data Analyst in Python Data Engineering Business Analyst



Dataquest Method

Learn with real-world data Complete exercises and get feedback Build your portfolio with projects

## 2022

#### Calendar

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Unit 02											Unit 03																		

Unit

#### Unit 01

28/03 - Planning

30/03 - Planning 04/04 - Course Outline 06/04 - DQ git and version control 11/04 - UTT1 (10% grade) - DQ Elements of CLI 13/04 - DQ Text processing CLI 18/04 - UTT2 (20% grade) - Clean Code principles - DQ Function: advanced 20/04 - Clean Code principles 25/04 - Produciton ready code 27/04 - Production ready code 02/05 - Project 04/05 - Project 09/05 - Project 11/05 - Project - UIT3 (70% grade)

#### Unit 03

27/06 - Deploy a scalable
ML Pipeline in production
- DVC
29/06 - DVC
04/07 - FastAPI, CI/CD, Heroku
06/07 - FastAPI, CI/CD, Heroku
11/07 - Final Project
13/07 - Final Project
20/07 - Final Project
- U3T1 (100% grade)

#### Unit 02

16/05 - Building a data pipeline - DQ Context managers - DQ Introduction to decorators 18/05 - Building a data pipeline - DQ Decorators: advanced 23/05 - U2T1 (20% grade) - Building a reproducible model workflow (BRW) PART I - Intro MLOps, Tools, Env, ML Pipes - MLFlow 25/05 - BRW PART I 30/05 - U2T2 (20% grade) - BRW PART II - Fundamentals of ML 01/06 - BRW PART II 06/06 - BRW PART III - ETL, Data Checks - Data Segragation 08/06 - BRW PART III 13/06 - U2T3 (20% grade) - BRW PART IV - Train, Validation - Experiment Tracking 15/06 - BRW PART IV 20/06 - BRW PART V - Final pipeline, release and deploy 22/06 - BRW PART V 27/06 - U2T4 (40% grade)

## Tools and Open Sources Solutions Adopted in this Course





## Work in Progress WiP



Second time the course is offered



The subject is new, we don't have all the answers we are all learning too!!!



We appreciate you:

- a) enthusiams for trying out new things
- b) patience bearing with things that don't quite work
- c) feedback to improve the course

