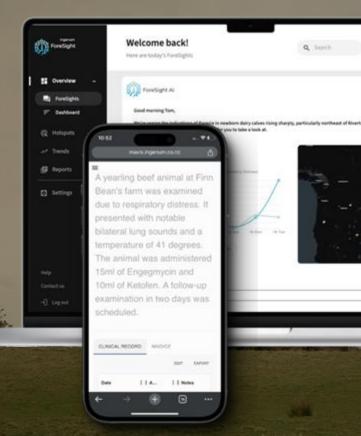


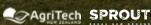
Commercial pre-trained for biological pattern detection

Worlds largest animal health dataset



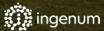












### **Ingenum platforms**

Early disease detection

Endemic disease reporting

Disease Forecasting

Live industry health scores

Welcome back

We

**Delivers INSIGHTS and ALERTS** 

**DATA and TRAINING** 



Al-enhanced clinical notes

Automatic invoice creation

Early disease detection (Foresight)

PMS and lab integrations

Practice-level insights

Data secure

Dedicated neural network, pretrained to detect biological traits in animal health and agricultural data

Problem solving LLM for animal health professionals and while delivering alerts to the frontline



### Revolutions

1.0

2.0

3.0

3.5

4.0

5.0

1780 Mechanisation

Industrial production based on machines powered by water and steam

1870 Electrification

Mass production using assembly lines

1970 Automation

Automation using electronics and computers

1980 Globalisation

Off shoring of production to low-cost economies

TODAY Digitalisation

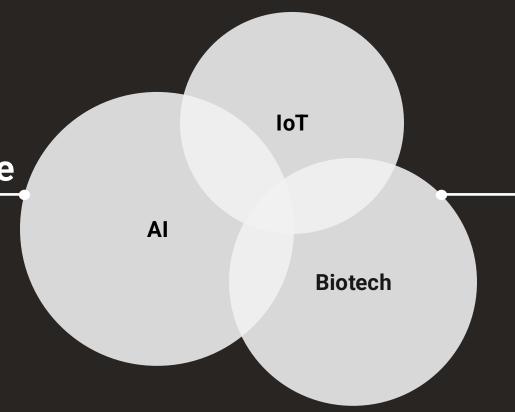
Introduction of connected devices, data, analytics and Al to further automate. FUTURE Human supported Al

Humans now a supporting role to Al powered autonomous industries

'Technological revolutions profoundly change the nature of work, occupational structures, and systems of production.' Barley, S. R. What is a Technological Revolution? Work and Technological Change, Oxford University Press, 2021.



# 4.5 - Technology Supercycle





# Machine learning is turning things (data) into numbers and finding patterns in those numbers.

The computer does this part.

How?

Code & math.

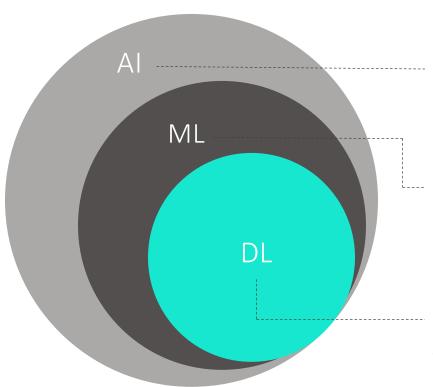
We're going to be writing the code.



# What is deep learning?



### **Artificial Intelligence: definitions**



Artificial Intelligence (AI) is the general field of creating machines that can perform tasks that would normally require human intelligence.

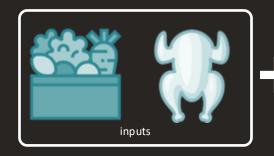
ML (Machine Learning) is a subset of AI that involves using algorithms and statistical models to analyse data, identify patterns, and make predictions or decisions based on the data without being programmed.

**DL (Deep Learning)** is a subset of ML that involves using artificial neural networks, inspired by the structure of the human brain, to analyse and learn from data.

DL algorithms automatically learn to recognize patterns and features in large datasets, without the need for human to manually specify features to look for.



### Traditional programming

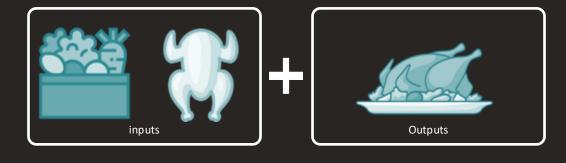


- 1. Cut vegetables
- 2. Season chicken
- 3. Preheat oven
- 4. Cook chicken for 30-minutes
- 5. Add vegetables

makes



### ML/DL approach



figures out

- 1. Cut vegetables
- 2. Season chicken
- 3. Preheat oven
- 4. Cook chicken for 30-minutes
- 5. Add vegetables



# Why use machine learning (or deep learning)?





Good reason: Why not?

Better reason: For complex problems where you can't imagine all the rules



(maybe not very simple...)

# 'If you can build a simple rule-based system that doesn't require machine learning, do that.'

Rule #1 Google Machine Learning Handbook



## Deep learning – the good reasons

- Problems with a long list of rules
  Where traditional approaches fail, ML/DL may help
- Continually changing environments
   DL can adapt (learn) new scenarios
- Discovering insights within large, collections of unstructured data

Imagine crafting rules for all detecting subtle signs of disease in a array of agricultural data?



## Deep learning – the less-good reasons

- When you need explainability
  Patterns learned by DP are typically abstract and uninterpretable by humans
- When the traditional approach is better
- Refer to Rule #1
- When errors are unacceptable Outputs of DL systems are not always predictable
- When you don't have much data

  Deep learning models require large amounts of data to produce good results



### ML vs. DL

Random forest



- Gradient boosted models
- Naive Bayes
- Nearest neighbour
- Support vector machine etc.

(common algorithms)

- Fully connected neural network
- Convolutional neural network
- Recurrent neural network
- Graph neural network
- Generative Pretrained Transformers etc.

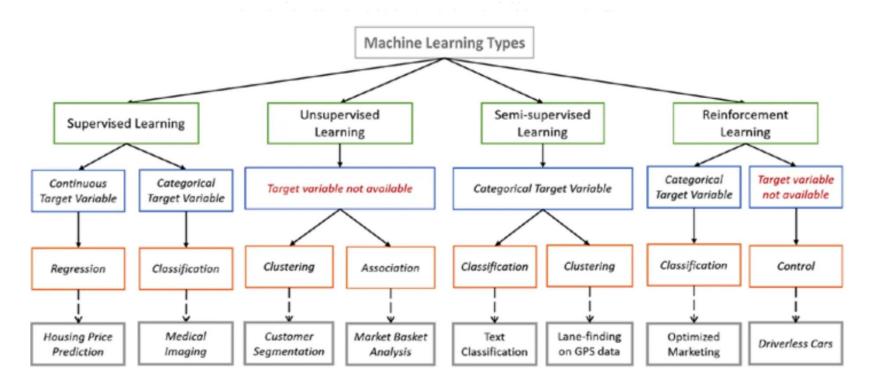
depending how you represent your problem, many algorithms can be used for both

Structured data

Unstructured data

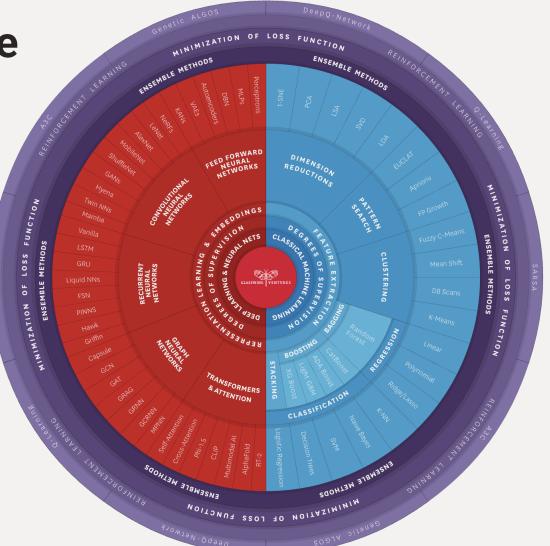


### Family tree of ML/DL





Family tree of ML/DL





### What are neural networks?



### What are neural networks?

Define real world objects by their connections to other things.

### Inputs







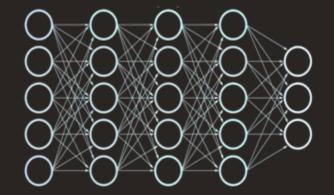


Numerical encoding

[[116, 78, 15], [117, 43, 96], [125, 87, 23],

Before data gets used by a neural network it needs to be converted into numbers

Learns representations (patterns, features, weights)



Each of these nodes is called a "hidden unit" or "neuron".

Choose appropriate one for your pattern Representation outputs

[[0.983, 0.004, 0.013], [0.110, 0.889, 0.001],[0.023, 0.027, 0.985],

Understandable to us!



1. Cut veg...

**Outputs** 

Hey Siri, what's the weather today?

Ramen spagetti

## Anatomy of neural networks

# Deep neural network Multiple hidden layers Input layer Output layer

Each layer is a usually a combination of linear and/or non-linear functions

Input layer (# units/neurons = 5) Hidden layer(s)
Learns patterns in data
(# units/neurons = [5, 3]

Output layer
Learned representations
or prediction
probabilities
(# units/neurons = 3



### Deep Learning: model training

Deep learning model training approaches







#### Task Driven

- Makes machine learn explicitly
- Data with clearly defined outputs is given
- Direct feedback is given
- Predicts outcome/future
- Resolves classification and regression problems

#### **Data Driven**

- Machine understands the data (identifies pattern and structures)
- Evaluation is qualitative or indirect
- Does not predict or find anything specific

### Learning from mistakes

- · Reward based learning
- Machine learns how to act in a certain environment
- Maximises rewards



# New toolbox for epidemiologists?







Prediction and inference

Clustering (segmentation)

Anomaly detection



# What are we going to cover?



### How?



Github

Repository where course content is stored and available



Python

Computer language in which today's course is run



Gemini

 $\bigcirc$ 

Google Colab

Open-source
Jupyter notebook
that contains course
code
and Google Gemini
LLM

Pytorch

Python library that supports neural networks

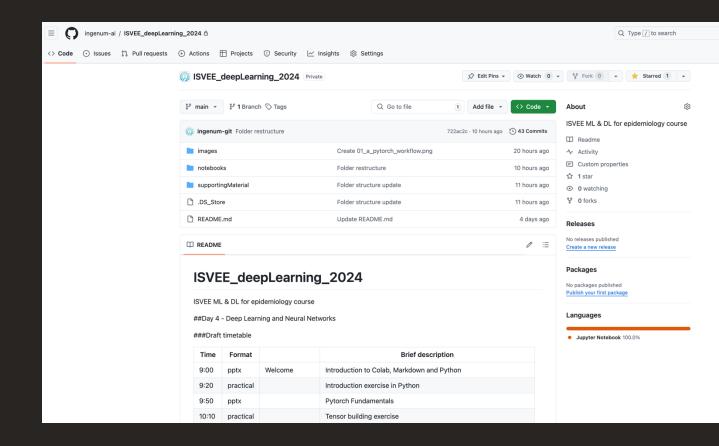




Web-based platform for version control and collaboration

Built in Git (distributed version control system)

Hosts, manages and shares files in repositories (repo's)







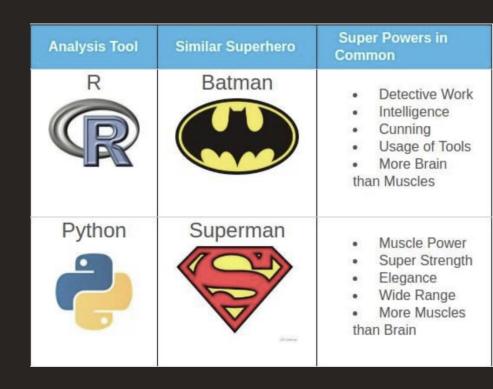
Python is a general-purpose programming language for data analysis and scientific computing.

Once installed on your computer or server it can be run from command lines/terminal (just like R)

General purpose EDA is done on Jupyter notebooks

More simple code structure than R

Suited to large deep learning models (i.e. Tesla, Microsoft etc)





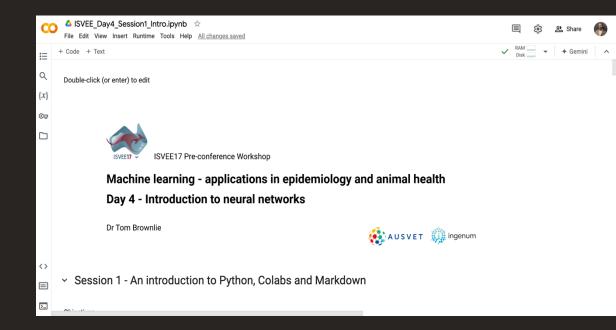
## CO Colab



Google Colab, or "Colaboratory", is a version of a Jupyter notebook that allows you to write and execute Python in your browser, with

- No configuration required
- Access to GPUs free of charge
- Access to Google Gemini (Googles LLM fine tuned to assist with code script)







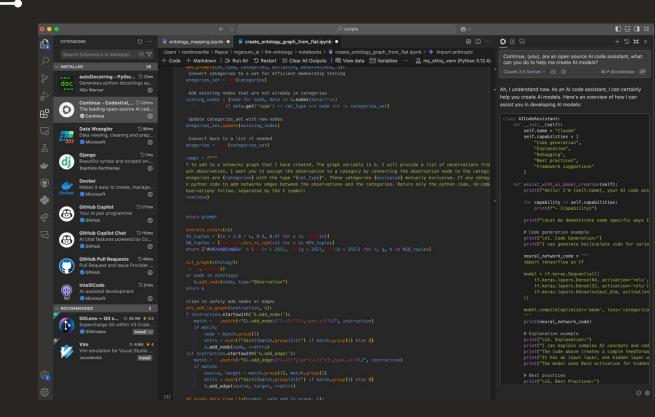
### **CO** Alternatives

Ingenum use (MS) VS Studio

Other options include PyCharm and Spyder for notebooks

Or simply Notepad++ or Sublime can support python structure

In production environments, python can be 'containerised' (via Dockers) to avoid notebooks









	Python	R
General	general-purpose programming language for data analysis and scientific computing.	Functional programming environment and language for statistical computing and graphics.
Objective	Data Science, Web Development, Embedded Systems	Data Science & Statistical Modeling
IDE	iPython, Pycharm, Jupyter Notebook, Spyder	RStudio, R GUI, R KWard
Data Collection	Supports CSV files, SQL, JSON, and web scraping with BeautifulSoup.	Can also import CSV files with built-in readr library. R's library RCurl provides a simple way to make API requests, similar to Python's requests package.
Data Analysis	Organize dataframes with Pandas for filtering, sorting. Python takes a more streamlined approach for data science projects.	Complex data visualization tools make the exploratory data analysis (EDA) process much more complex than Python.
Essential Packages & Libraries	Numpy, Pandas, matplotlib, scipy, scikit-learn, TensorFlow	caret, stringr, ggplot2, knitr, tidyverse, markdown, shiny, forcats, haven
Database Handling Capacity	Can easily handle large data because there are fewer constraints for memory usage.	R computes everything in memory, so its capabilities are limited by RAM size. A major downfall of R is the inability to handle massive amounts of data.
Data Visualization	Despite the capabilities of data visualization tools like Matplotlib and Seaborn, Python fails to measure up to data visualization features of R.	Developed by and for statisticians, R has complex data visualization features.
Syntax	The "zen of Python" is that there's a proper way to write code.	R doesn't have this set of rules. Also, indexing starts at 1, which can be considered unconventional for general programmers.
Learning Curve	Simple and readable code structure makes it easier for beginners to learn. It also allows for object-oriented programming. It also offers a wide range of data structures that you wouldn't expect from a general-purpose language.	R's functional syntax isn't easy for beginners, but not too challenging for those well-versed in programming. It also offers a few data structures, but fails to handle large amounts of data.







# How to approach today

### Each session will follow previous days:

- Short presentation
- Code exercise in notebook
- Questions to extend the exercise (if required)



How not to approach today



### Resources



Gemini



Course tutors

Google's in-built native LLM

https://pytorch.org/





### Deus ex machine learning



8:07 AM · Nov 18, 2020 · Twitter for iPhone



### Lets take a look at a Colab

https://github.com/ingenum-ai/ISVEE\_deepLearning\_2024/

Open Notebook 1...

