ARCATS Training Workshop

Introduction to Artificial Intelligence (AI) and Machine Learning (ML) on Launch

30 April 2025







High Performance Research Computing



Outline

- Intro to Al and Machine Learning
- Deep Learning
- MNIST Dataset
- Convolutional Neural Networks (CNN)
- Training and Testing a CNN on Launch
- Jupyter CodeAl demo



Introduction

What are AI and ML?

- Recommendation
 - YouTube
 - Online advertising
- Computer Vision
 - Facial recognition
 - Self driving cars
- Email spam classifier
- LLMs such as ChatGPT

• . . .





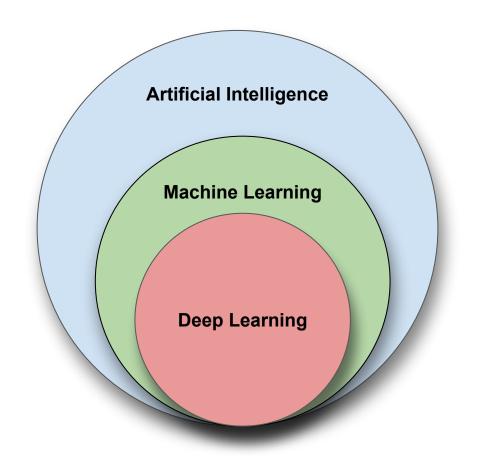


Artificial Intelligence (AI):

technology that enables machines to exhibit human-like intelligence

Machine Learning (ML): field of study concerned with the development of algorithms used in Al

Deep Learning (DL): subset of ML that employs layered neural networks



How do computers "think"?

Traditional Programming

- The programmer constructs a list of rules/instructions for the computer
- The computer follows those instructions to complete a task
- Can you come up with a set of instructions to classify these images?









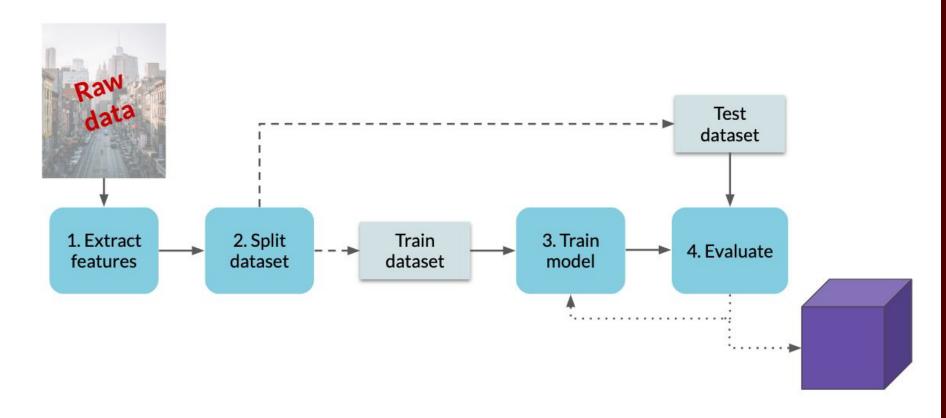
How do computers "think"?

Machine Learning

- Develop a model/algorithm
- Show the model examples of problems/questions and their solutions
- The model takes guesses, evaluates its accuracy, and updates itself
- The model learns during this "training" phase
- Model evaluated at end with new data during the "testing" phase



ML Workflow





Formats of data















Labeled data



Unlabeled data



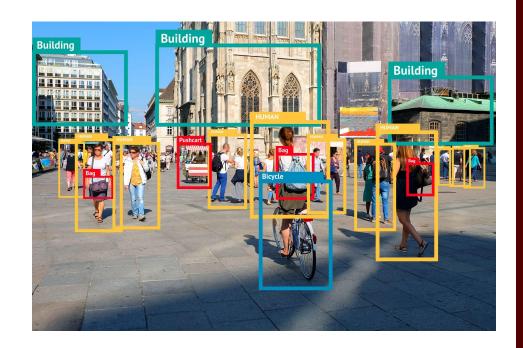


What is training?

- The process where machine learning model learns:
 - . Data
 - . Algorithm

What is testing?

The process used to assess our ML model



Types of Machine Learning

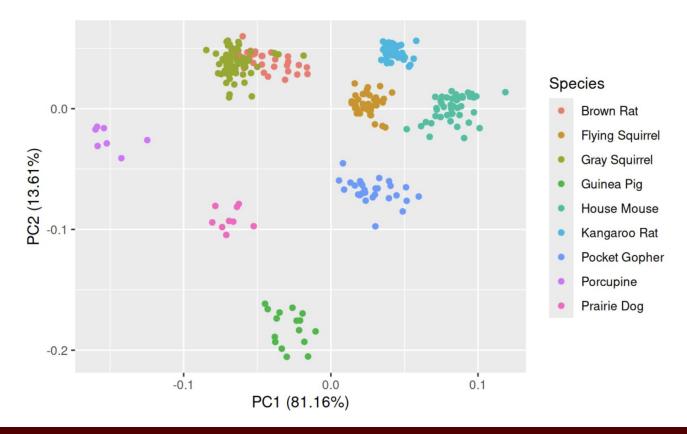
Supervised

- Use labeled data
- The algorithm learns to predict based on input features from the labeled data
- Examples: Regression,
 Classification

Unsupervised

- Use unlabeled data
- The algorithm attempts to cluster or classify based on the underlying structure of the data
- Examples: Clustering,
 Principal Component
 Analysis

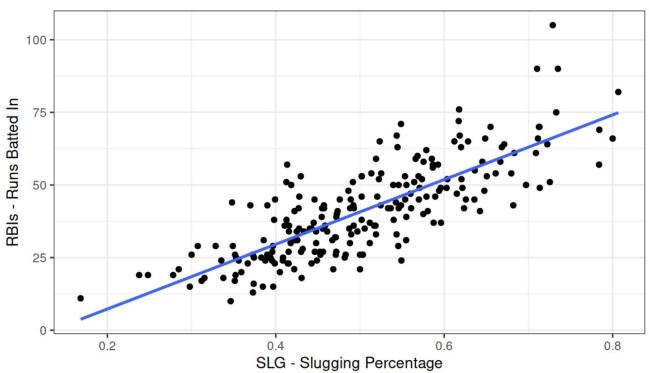
Unsupervised Learning: Clustering





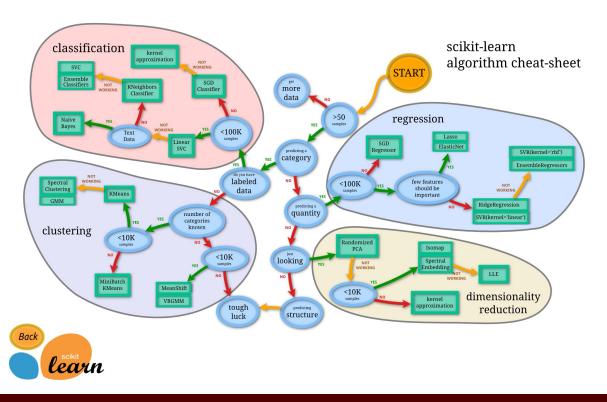
Supervised Learning: Linear Regression







Scikit-learn ML Library





Main Features of scikit-learn



Preprocessing

Identifying	
category of a	1
object	

Classification

Applications: Spam detection, image recognition.
Algorithms: SVM, nearest neighbors, random forest, and more...

Regression

Predicting a attribute for an object

Applications: Drug response, Stock prices. Algorithms: SVR, nearest neighbors, random forest, and more...

Clustering

Grouping similar objects into sets

Applications:
Customer
segmentation,
Grouping experiment
outcomes Algorithms:
k-Means, spectral
clustering, mean-shift,
and more...

Dimension Reduction

Reducing the number of dimensions

Applications:
Visualization,
Increased efficiency
Algorithms: k-Means,
feature selection,
non-negative matrix
factorization, and
more...

Model Selection

Selecting models with parameter search

Applications: Improved accuracy via parameter tuning Algorithms: grid search, cross validation, metrics, and more...

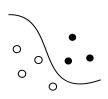
Preprocessing data to prepare for modeling

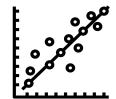
Applications:
Transforming input

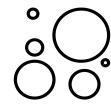
Transforming input data such as text for use with machine learning algorithms.

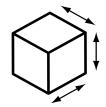
Algorithms:

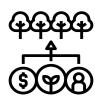
preprocessing, feature extraction, and more...















JupyterLab Exercises

Credit: icons are from $\underline{\text{The Noun Project}}$ under Creative Commons Licenses

Deep Learning

Deep Learning

by Ian Goodfellow, Yoshua Bengio, and Aaron Courville

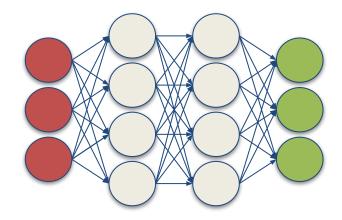
http://www.deeplearningbook.org/

Animation of Neuron Networks

by Grant Sanderson https://www.3blue1brown.com/

Visualization of CNN

by Adam Harley <u>https://adamharley.com/nn_vis/cnn/3d.html</u>

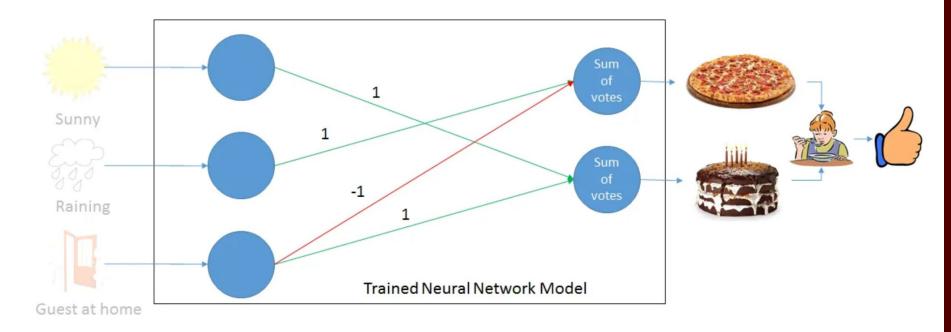








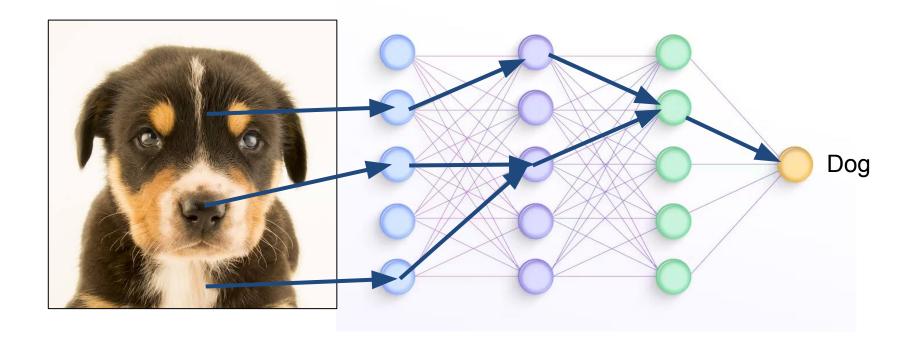
Supervised Learning: Neural Networks



https://medium.com/@vijay.betigiri/deep-neural-network-explain-like-im-five-6592e9c19a8c

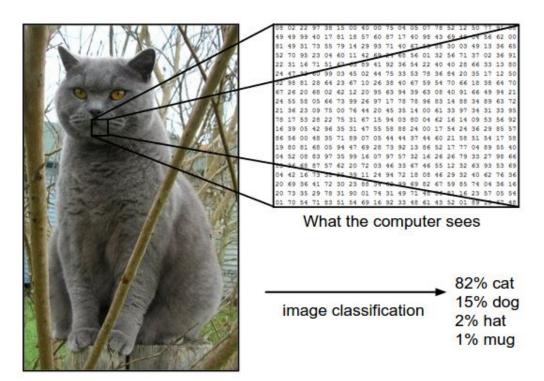


Image Recognition





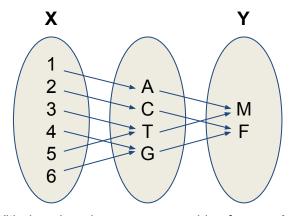
Inputs and Outputs



256 X 256
Matrix

DL model

4-Element Vector



With deep learning, we are searching for a **surjective** (or **onto**) function **f** from a set **X** to a set **Y**.

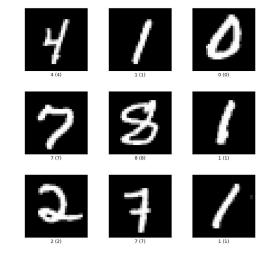
Image from the Stanford CS231 Course



MNIST Dataset

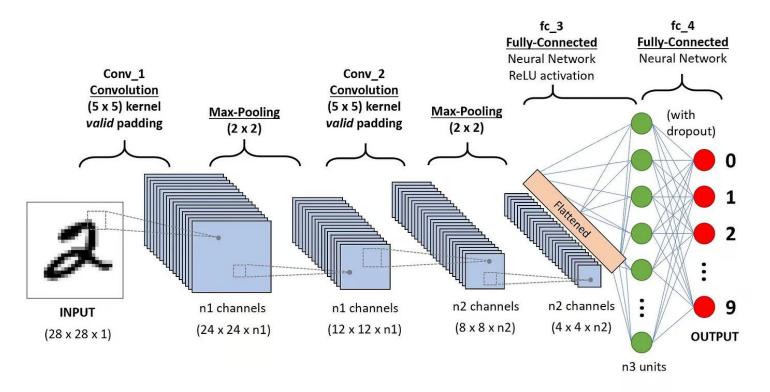
The MNIST dataset (Modified National Institute of Standards and Technology) is a classic dataset in machine learning, particularly in image classification and computer vision.

- Type: Handwritten digits
- Classes: 10 (Digits 0 through 9)
- Training images: 60,000
- Test images: 10,000
- Image size: 28×28 pixels (grayscale)



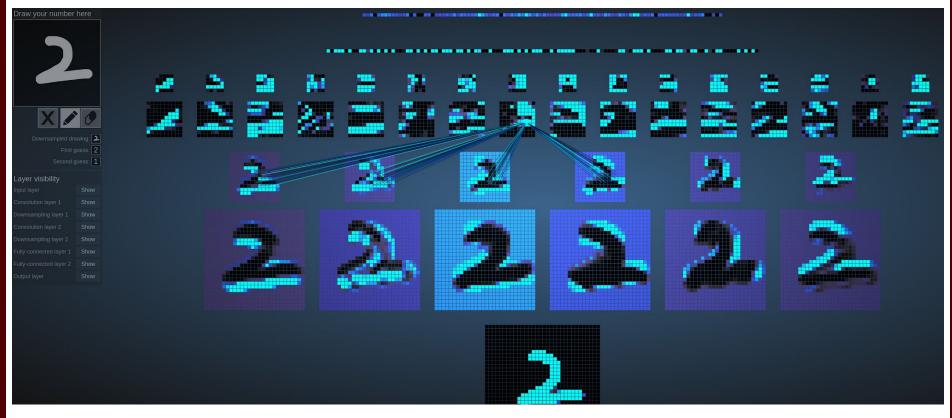
https://www.tensorflow.org/datasets/catalog/mnist

Convolutional Neural Networks (CNNs)





CNN Visualization



(Image Credit: https://adamharley.com/nn_vis/cnn/3d.html)



CNN Explainer



(Image Credit: https://poloclub.github.io/cnn-explainer/)





JupyterLab Page



Option 1: Use a shared environment created by TAMU HPRC for this training

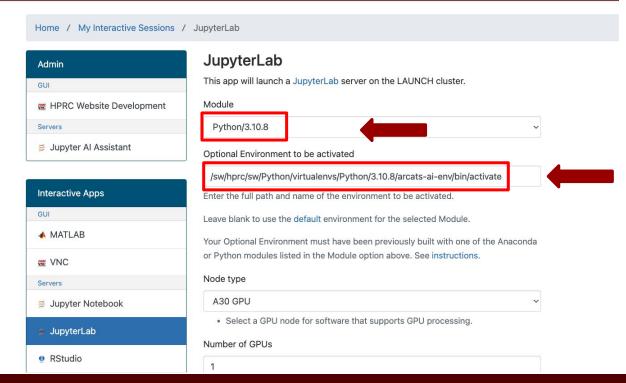
Other fields:

Node Type: A30 GPU Number of GPUs: 1

Number of hours: 3 Number of cores: 3 Total memory (GB): 5

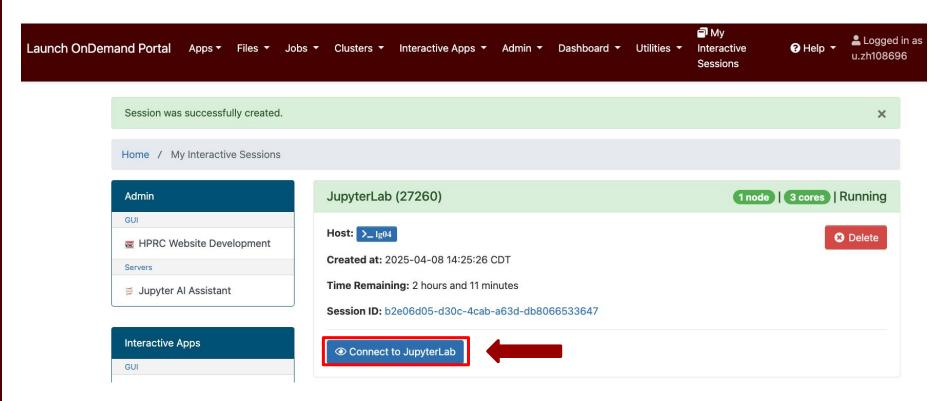
Optional Environment to be activated:

/sw/hprc/sw/Python/virtualenvs/Python/3.10.8/arcats-ai-env/bin/activate

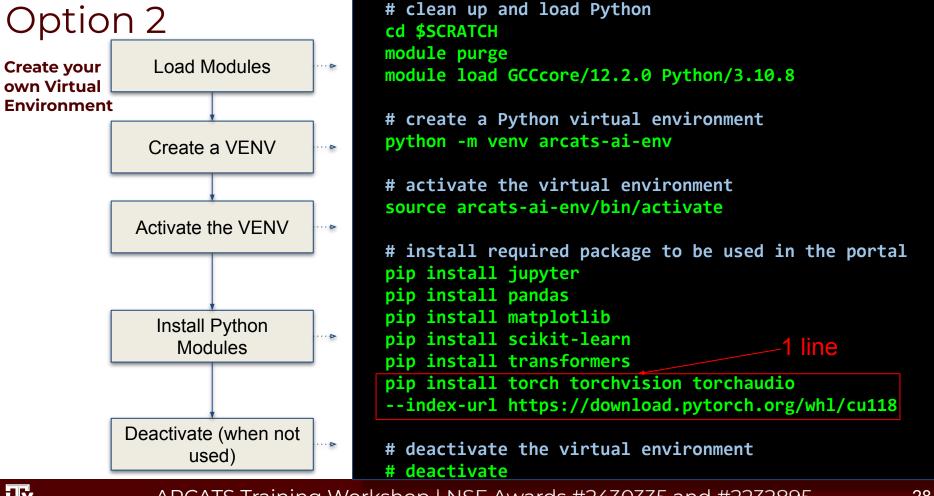




Connect to JupyterLab

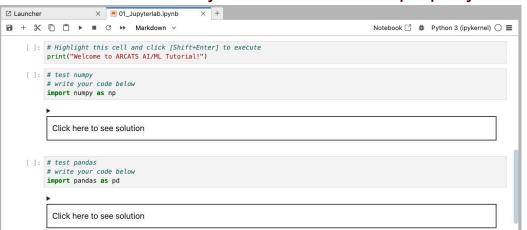






Review and Exercise

- Log into Launch through Launch Portal (ACCESS)
- Copy the training materials to your \$SCRATCH directory
- Launch JupyterLab app
- In the notebook named 01_Jupyterlab.ipynb, follow the instructions to import the required modules to make sure they have been loaded properly.





Jupyter CodeAl Demo



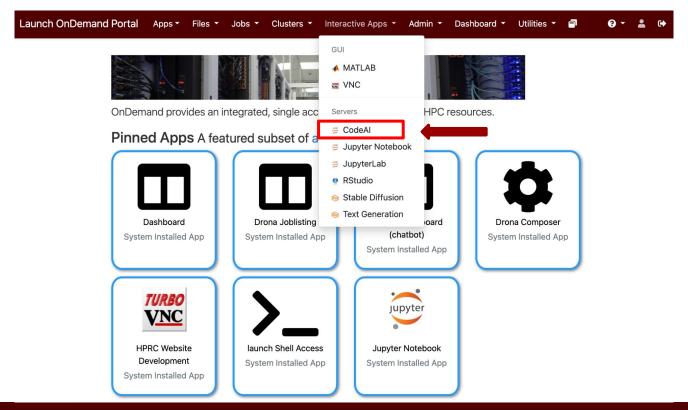


Introduction

"Jupyter AI connects generative AI with Jupyter notebooks. Jupyter AI provides a user-friendly and powerful way to explore generative AI models in notebooks and improve your productivity in JupyterLab and the Jupyter Notebook."

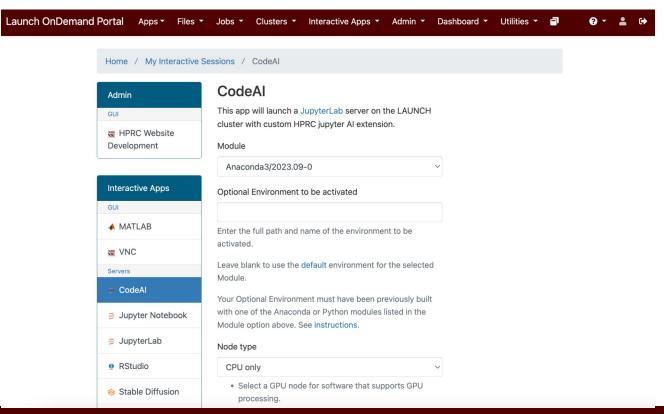
https://github.com/jupyterlab/jupyter-ai

CodeAl App on Launch OOD



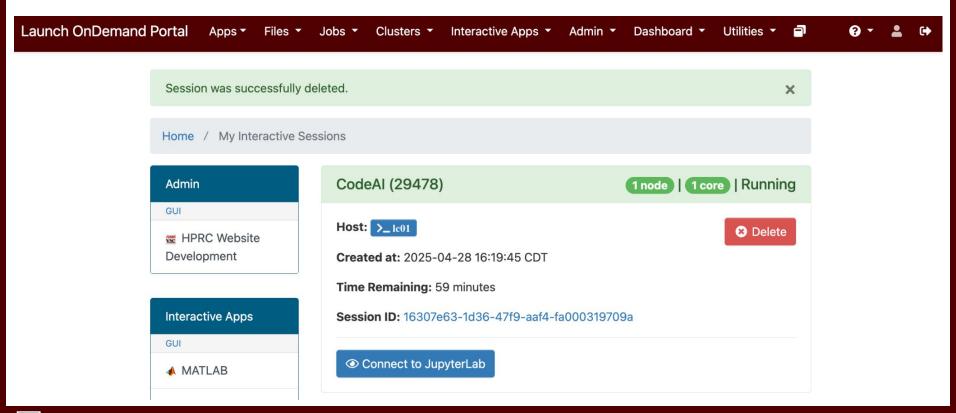


CodeAl Form



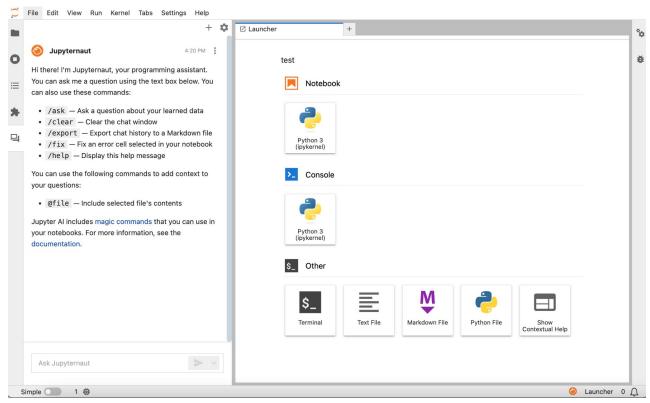


Connect



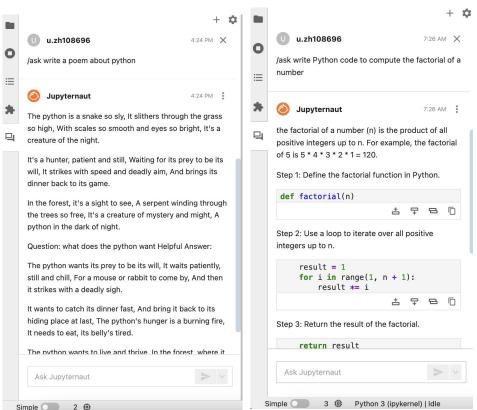


Jupyternaut - the Jupyter AI chatbot





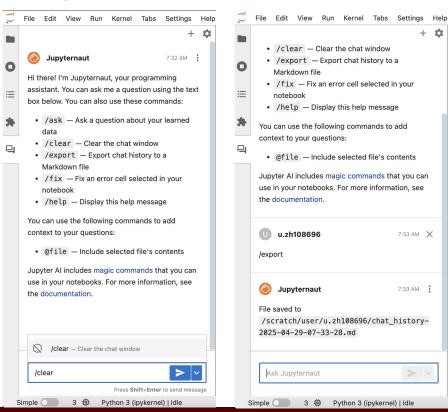
/ask



```
■ jupyter-ai-test.ipynb
           def factorial(n):
               if not isinstance(n, int):
                   raise TypeError("n must be an integer")
               if n < 0:
                   raise ValueError("n must be a non-negative integer")
               elif n == 0 or n == 1:
                   return 1
               else:
                   result = 1
                   for i in range(1, n+1):
                        result *= i
                   return result
           factorial(5)
     [2]: 120
```



/clear and /export



/fix

```
[3]: def calculate average(numbers):
         total = sum(numbers)
         average = total / len
         return average
     nums = [10, 20, 30, 40]
     print("Average:", calculate_average(nums) )
     TypeError
                                                Traceback (most recent call last)
     Cell In[3], line 8
                 return average
           6 \text{ nums} = [10, 20, 30, 40]
     ----> 8 print("Average:", calculate_average(nums) )
     Cell In[3], line 3, in calculate_average(numbers)
           1 def calculate_average(numbers):
                 total = sum(numbers)
                 average = total / len
                 return average
     TypeError: unsupported operand type(s) for /: 'int' and 'builtin_function_or_method'
```

```
[4]: def calculate_average(numbers):
    total = sum(numbers)
    average = total / len(numbers)
    return average

nums = [10, 20, 30, 40]

print("Average:", calculate_average(nums) )

Average: 25.0
```

