

# Slides That are used as screenshots in the github/statmike/vertex-ai-mlops repository

Notes:

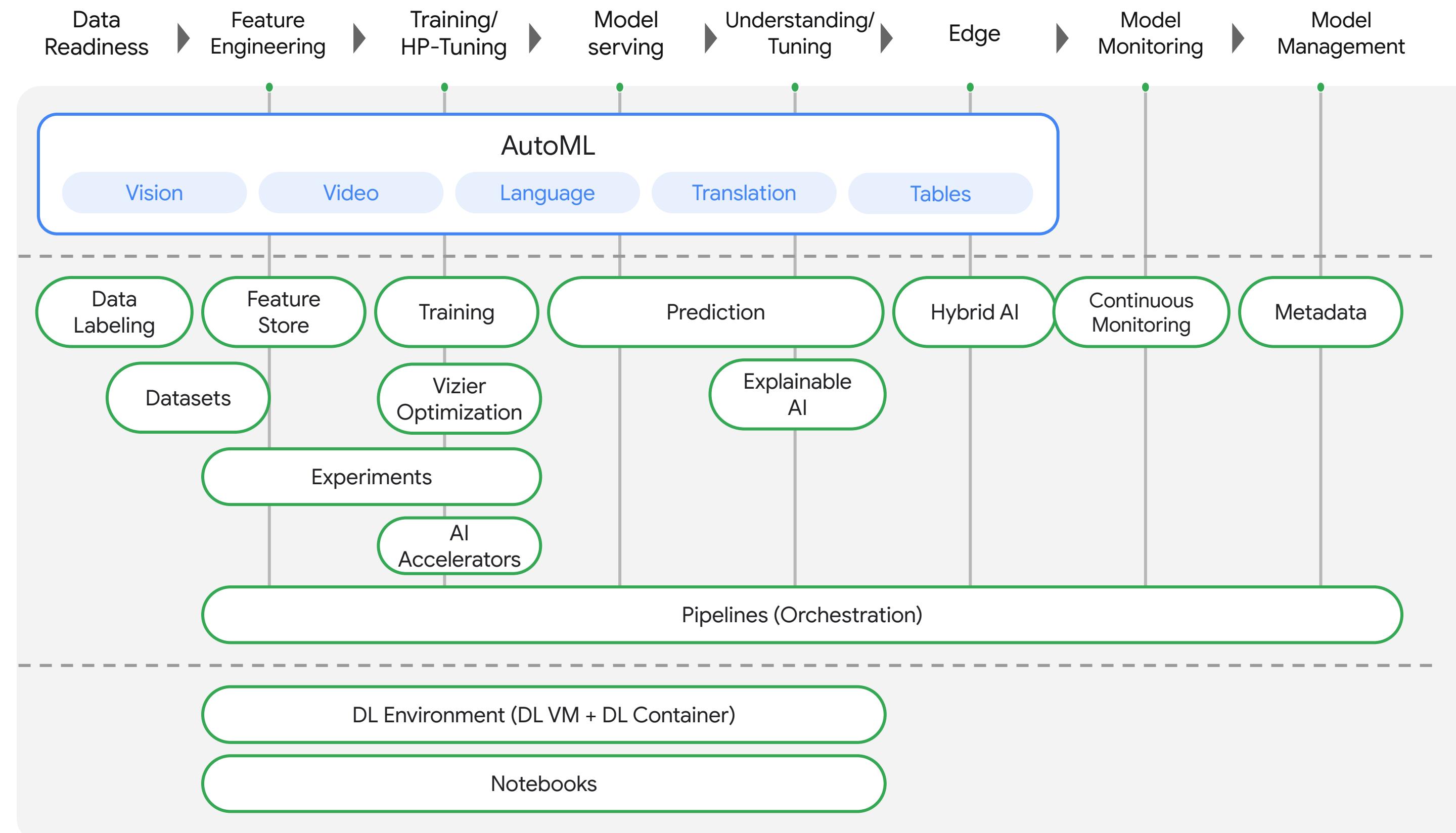
- Do not insert new slides or reorder without updating the notebooks. The slides are exported to numbered .png files that are referenced in the notebooks

Process

- Save as PDF
- Copy to `github/statmike/vertex-ai-mlops/architectures/slides`
- Convert PDF to PNG images
  - Use Notebook: `/architectures/Create Images.ipynb`
  - OUTPUT:
    - To `/architectures/slides`

# **README**

# Vertex AI Overview



## Vertex AI

## Dashboard

## Dashboard

## Datasets

## Features

## Labeling tasks

## Notebooks

## Pipelines

## Training

## Experiments

## Models

## Endpoints

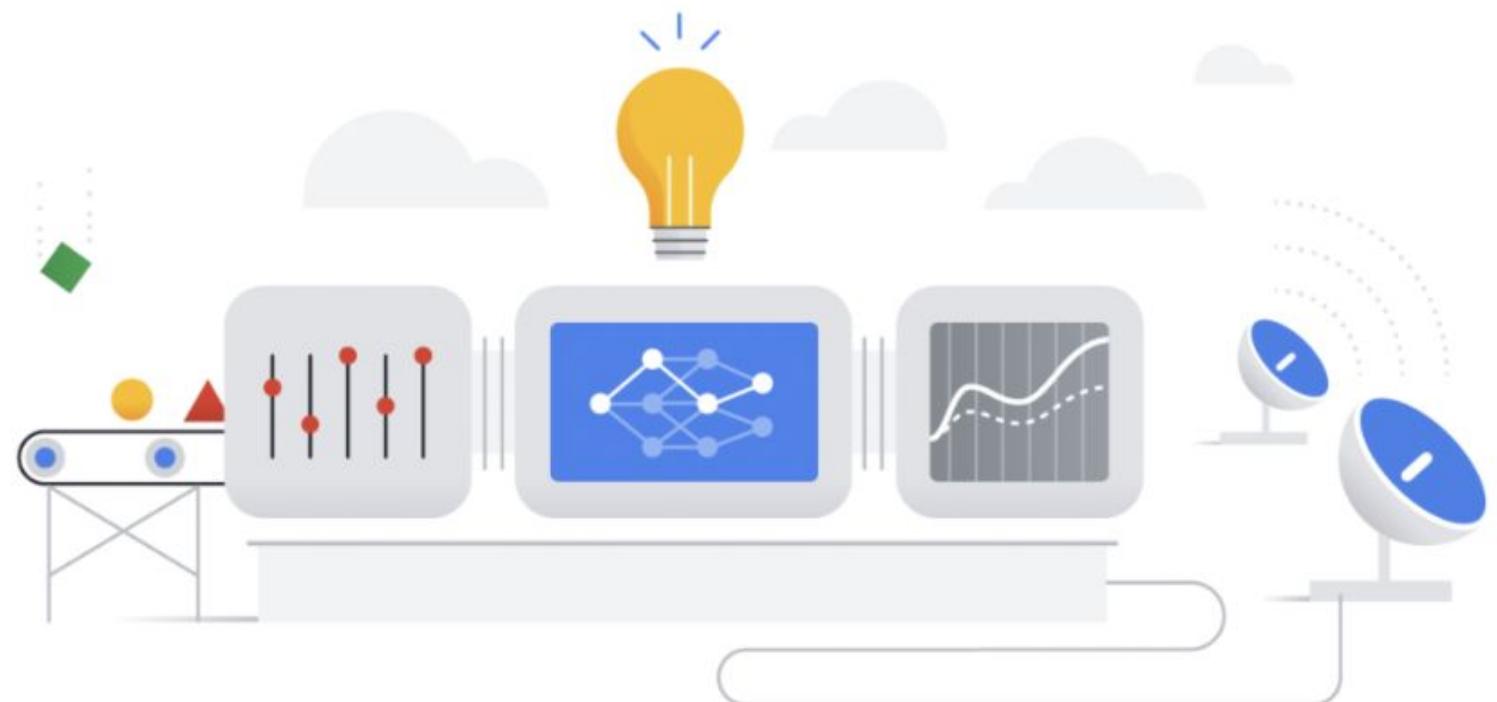
## Batch predictions

## Metadata

## Marketplace

## Get started with Vertex AI

Vertex AI empowers machine learning developers, data scientists, and data engineers to take their projects from ideation to deployment, quickly and cost-effectively. [Learn more](#)



## Region

us-central1 (Iowa)



## Recent datasets

- ✓ 02c\_digits\_20210919213805 16 hours ago
- ✓ 02b\_digits\_20210919205707 20 hours ago
- ✓ 02a 4 days ago
- ✓ 02b\_digits\_20210916141540 4 days ago
- ✓ 02c\_digits\_20210916004500 5 days ago

[+ CREATE DATASET](#)

## Recent models

- ✓ 05f\_digits\_20210920145828 1 hour ago
- ✓ 05e\_digits\_20210920125450 3 hours ago
- ✓ 02c\_digits\_20210919213805 12 hours ago  
Average precision: 1
- ✓ 02b\_digits\_20210919205707 19 hours ago  
Average precision: 1
- ✓ 05c\_digits\_20210919214125-model 19 hours ago

[+ TRAIN NEW MODEL](#)

## Get predictions

After you train a model, you can use it to get predictions, either online as an endpoint or through batch requests

[+ CREATE BATCH PREDICTION](#)[Show debug panel](#)



# Vertex AI



readme.md

## Vertex AI for Machine Learning Operations

I'm Mike

I want to share and enable [Vertex AI](#) from [Google Cloud](#) with you. The goal here is to share a comprehensive set of end-to-end workflows for machine learning that each cover the range of data to model to serving and managing - even automating the flow. Regardless of your data type, skill level or framework preferences you will find something helpful here.

### Considerations

#### Data Type

- Tables: Tabular, structured data in rows and columns
- Language: Text for translation and/or understanding
- Vision: Images
- Video

#### Convenience Level

- Use Pre-Trained APIs
- Automate building Custom Models
- End-to-end Custom ML with core tools in the framework of your choice

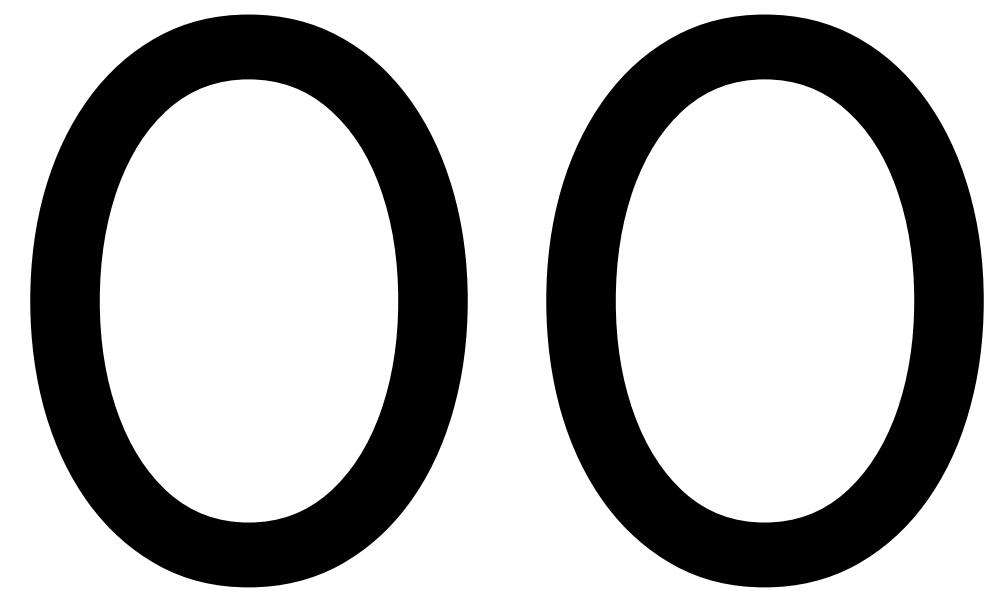
#### Framework Preferences

- [Scikit-learn](#)
- [XGBoost](#)
- [Tensorflow](#)
- [Pytorch](#)
- More!

#### Overview

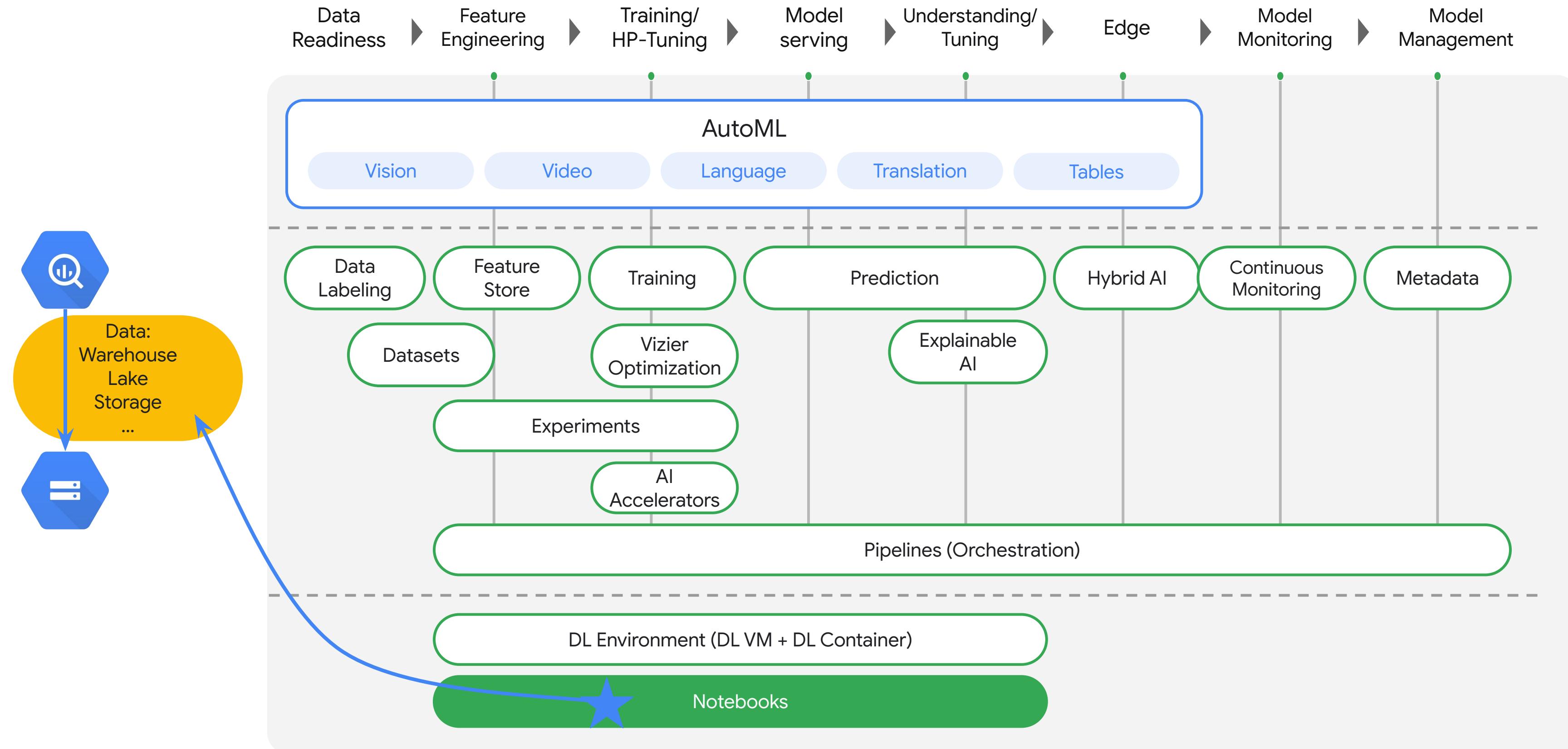
This is a series of workflow demonstrations that use the same data source to build and deploy the same machine

# Introduction



# Notebook: 00

# Vertex AI Overview







# Vertex AI

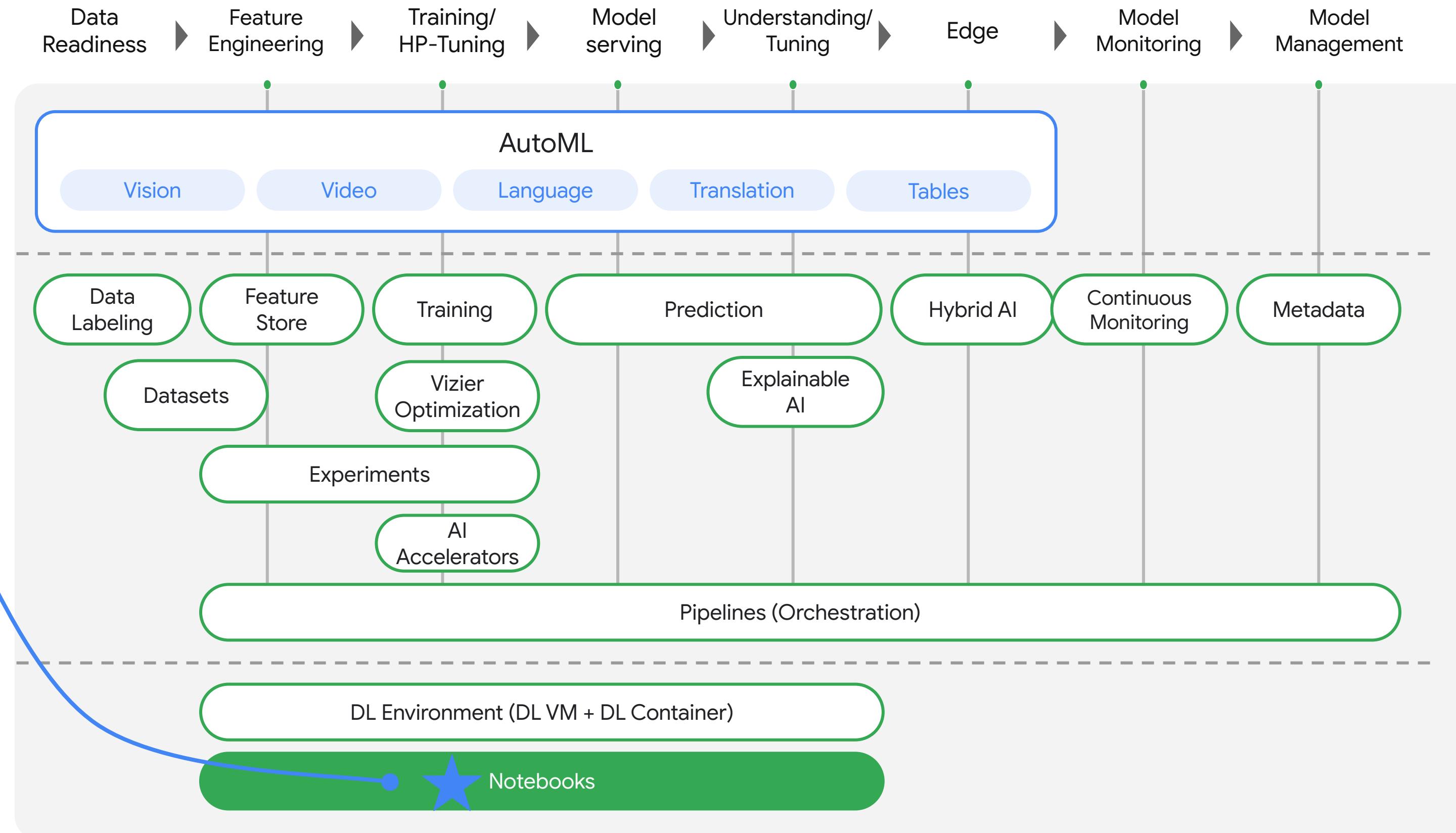


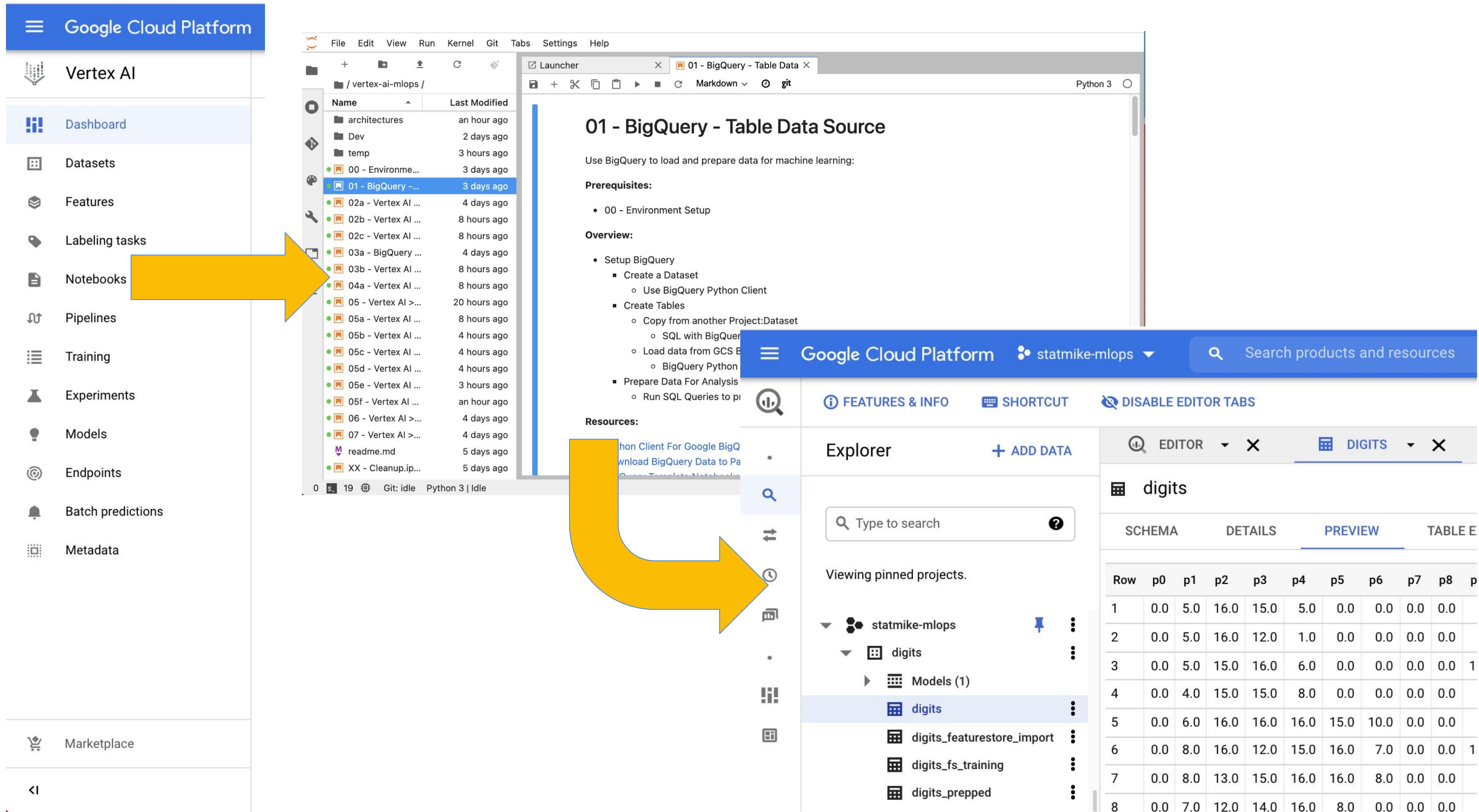
## Environment Setup

01

# Notebook: 01

# Vertex AI Overview







# Vertex AI

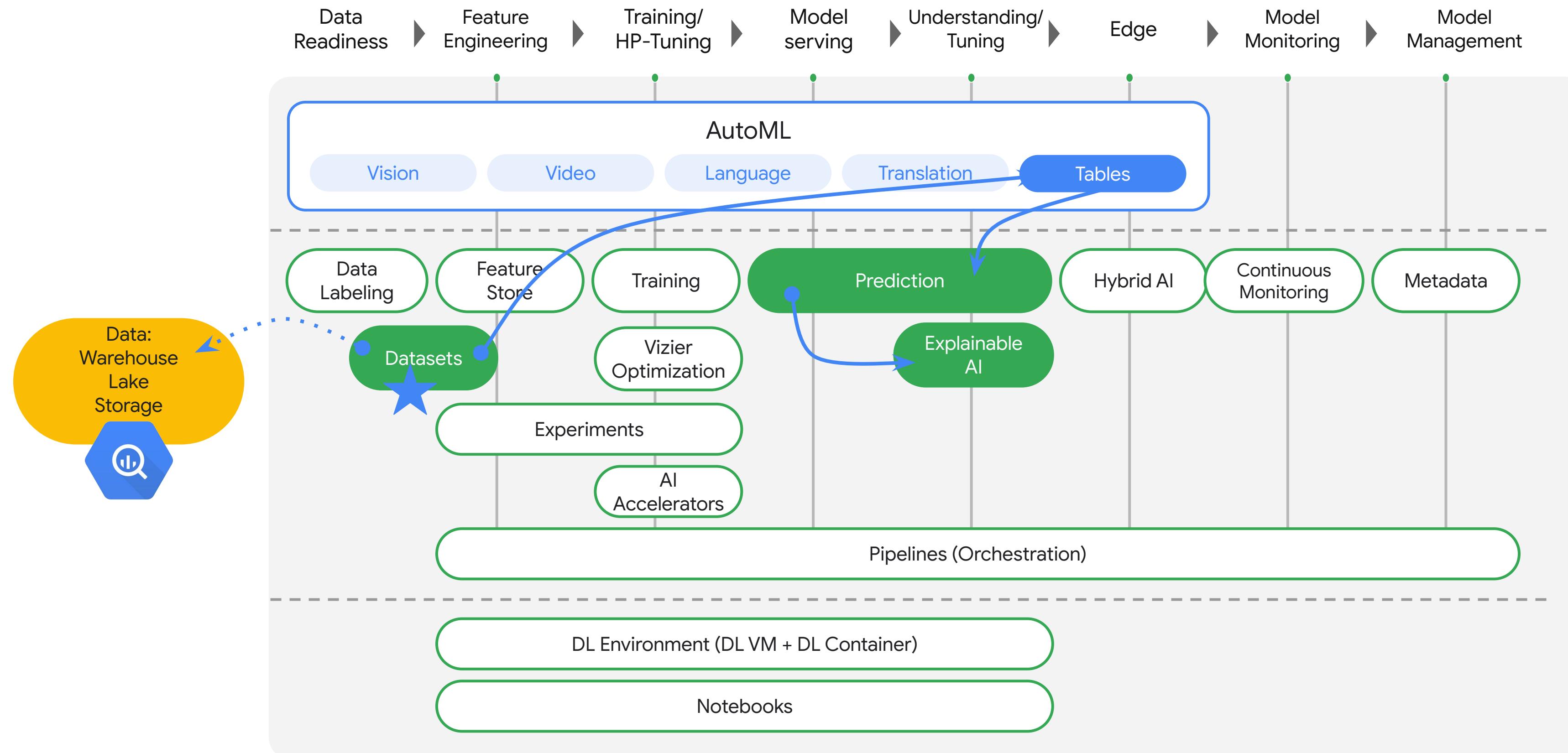


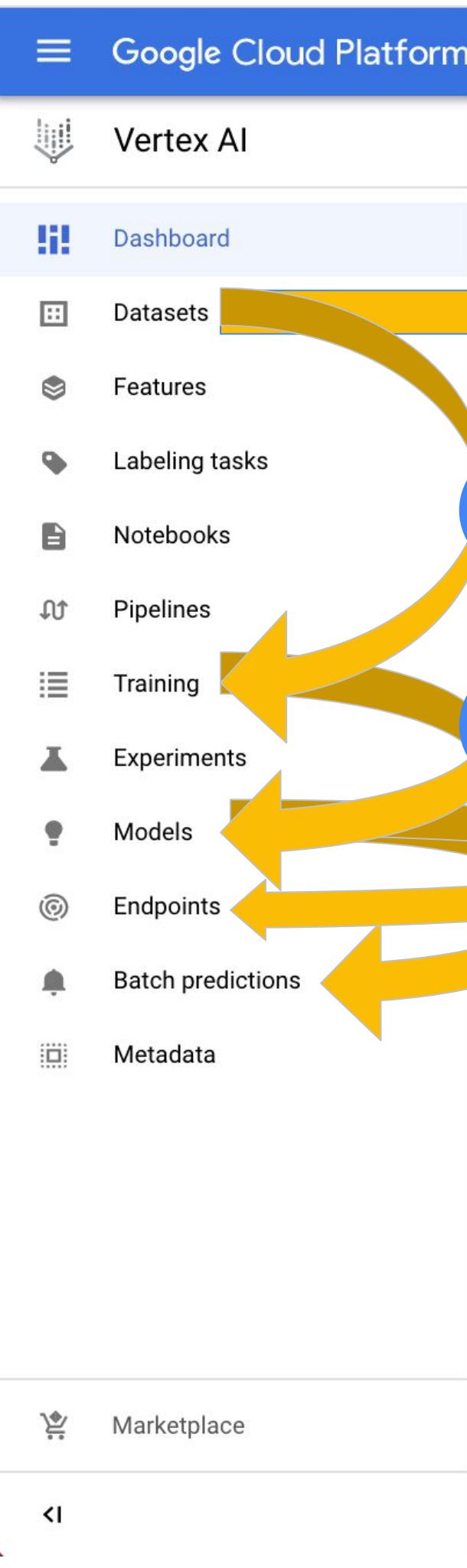
## Data Source

02a

## Notebook: 02a

# Vertex AI Overview





The screenshot shows the Google Cloud Platform Explorer interface. At the top, there are tabs for FEATURES & INFO, SHORTCUT, and DISABLE EDITOR TABS. Below the tabs, the Explorer section displays a pinned project structure under the 'statmike-mlops' project. The 'digits' dataset is expanded, showing its sub-components: Models (1), digits, digits\_featurestore\_import, digits\_fs\_training, and digits\_prepended. The 'DIGITS' tab is active, showing a preview of the 'digits' table. The table has 8 rows and 10 columns, labeled p0 through p9. The first few rows of data are as follows:

Row	p0	p1	p2	p3	p4	p5	p6	p7	p8	p
1	0.0	5.0	16.0	15.0	5.0	0.0	0.0	0.0	0.0	
2	0.0	5.0	16.0	12.0	1.0	0.0	0.0	0.0	0.0	
3	0.0	5.0	15.0	16.0	6.0	0.0	0.0	0.0	0.0	1
4	0.0	4.0	15.0	15.0	8.0	0.0	0.0	0.0	0.0	
5	0.0	6.0	16.0	16.0	16.0	15.0	10.0	0.0	0.0	
6	0.0	8.0	16.0	12.0	15.0	16.0	7.0	0.0	0.0	1
7	0.0	8.0	13.0	15.0	16.0	16.0	8.0	0.0	0.0	
8	0.0	7.0	12.0	14.0	16.0	8.0	0.0	0.0	0.0	

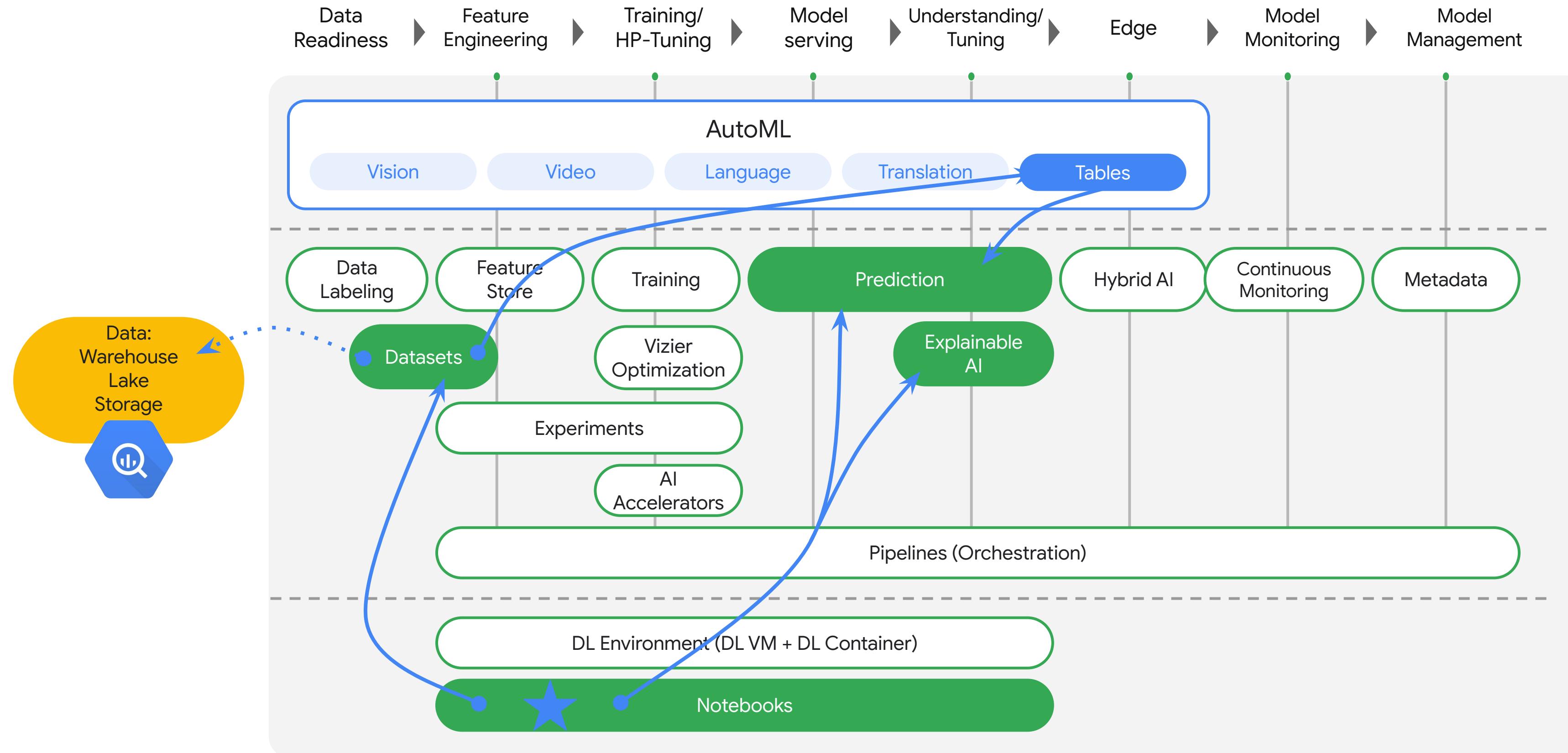


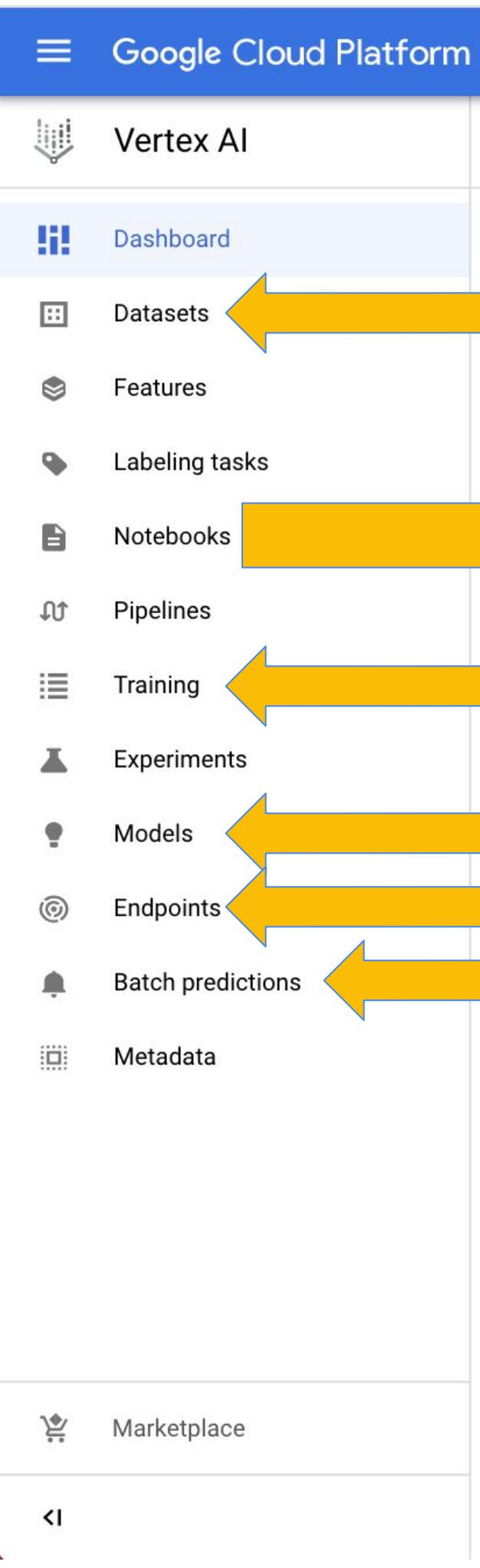
# Vertex AI



**End-To-End: No Code**

02b





File Edit View Run Kernel Git Tabs Settings Help

Launcher 02b - Vertex AI - AutoML v ×

Markdown git Python 3

## 02b - Vertex AI - AutoML with clients (code)

Use the Vertex AI Python Client to recreate the no-code approach of (02a) with code (Python). This builds a custom model with AutoML and deploys it to an Endpoint for predictions and explanations.

**Prerequisites:**

- 01 - BigQuery - Table Data Source

**Overview:**

- Use Python client `google.cloud.aiplatform` for Vertex AI
  - Create a dataset
    - `aiplatform.TabularDataset`
    - Link BigQuery table
  - Train Model with AutoML
    - `aiplatform.AutoMLTabularTrainingJob`
  - Evaluate
    - Review the model in GCP Console > Vertex AI > Models
  - Deploy to Endpoint
    - `Endpoint = aiplatform.Endpoint`
    - `Endpoint.deploy`
  - Online Predictions
    - `Endpoint.predict`

Mode: Command Ln 1, Col 1 02b - Vertex AI - AutoML with clients (code).ipynb

Name	Last Modified
architectures	2 hours ago
Dev	2 days ago
temp	4 hours ago
01 - BigQuery - ...	3 days ago
02a - Vertex AI ...	4 days ago
02b - Vertex AI ...	9 hours ago
02c - Vertex AI ...	9 hours ago
03a - BigQuery ...	4 days ago
03b - Vertex AI ...	9 hours ago
04a - Vertex AI ...	9 hours ago
05 - Vertex AI >...	a day ago
05a - Vertex AI ...	9 hours ago
05c - Vertex AI ...	5 hours ago
05d - Vertex AI ...	5 hours ago
05e - Vertex AI ...	4 hours ago
06 - Vertex AI >...	2 hours ago
readme.md	4 days ago
requirements.ip...	4 days ago
M README.md	5 days ago
run.ipynb	5 days ago

0 \$ 19 Git: idle Python 3 | Idle

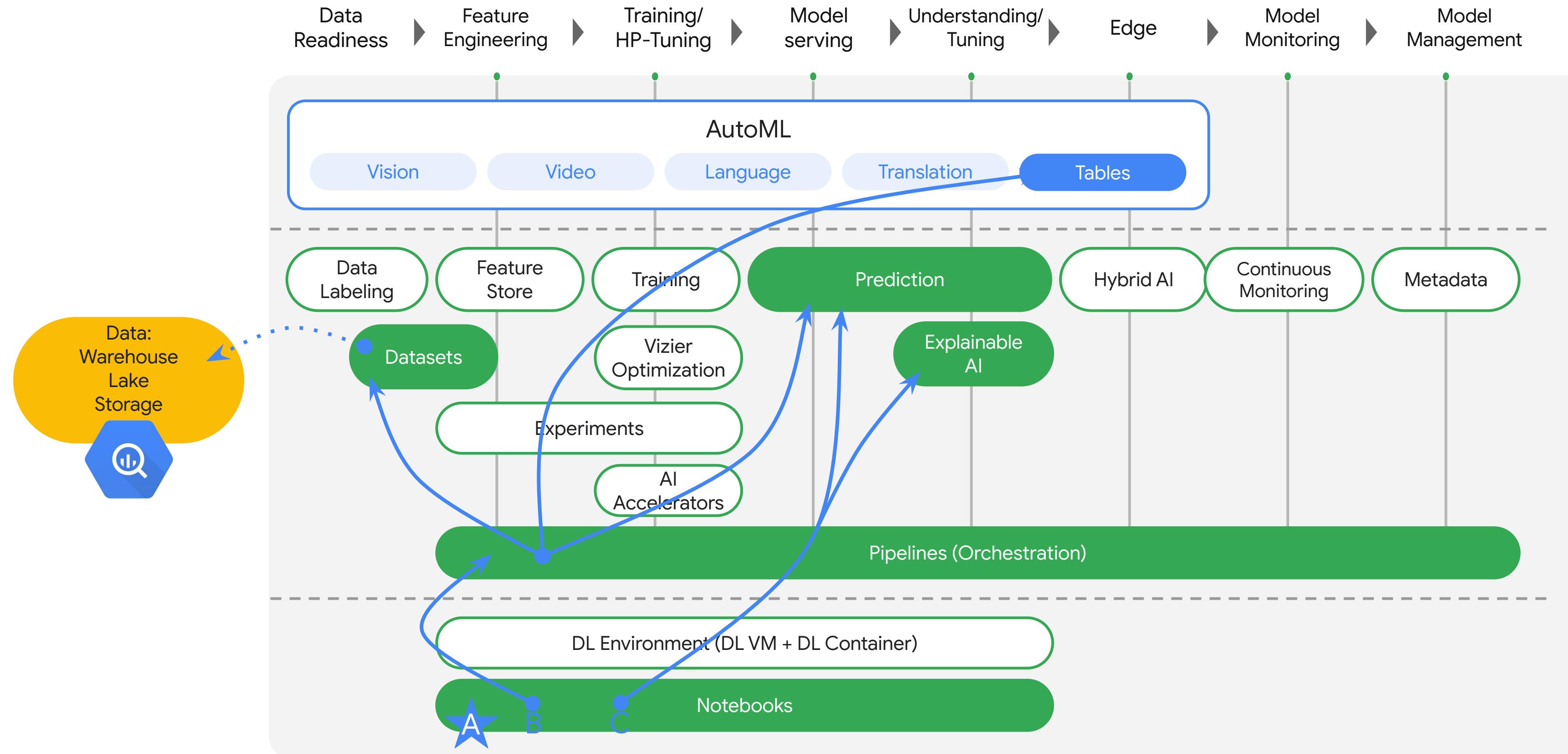


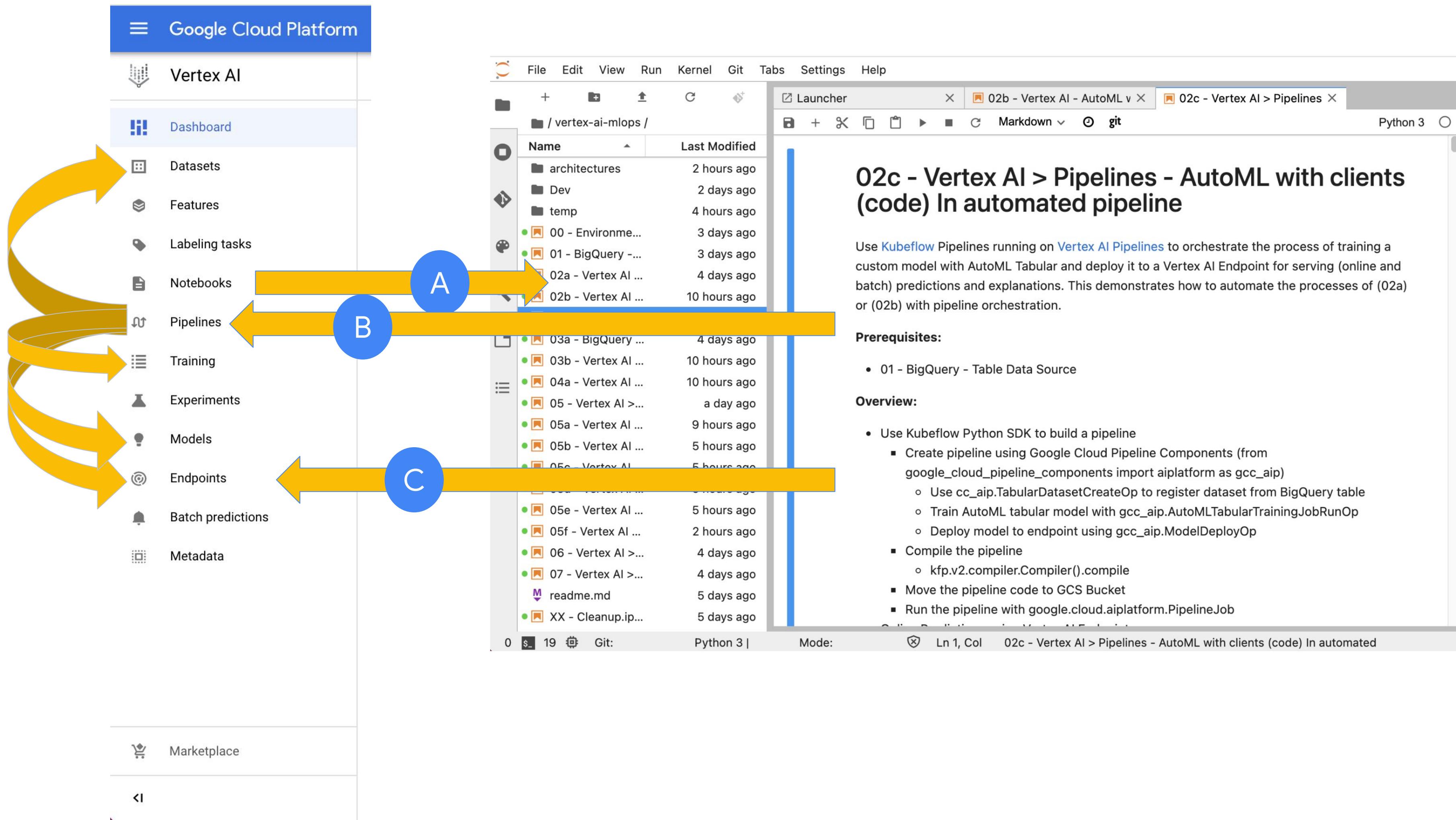
# Vertex AI



**End-To-End: Interactive Code**

02c







# Vertex AI

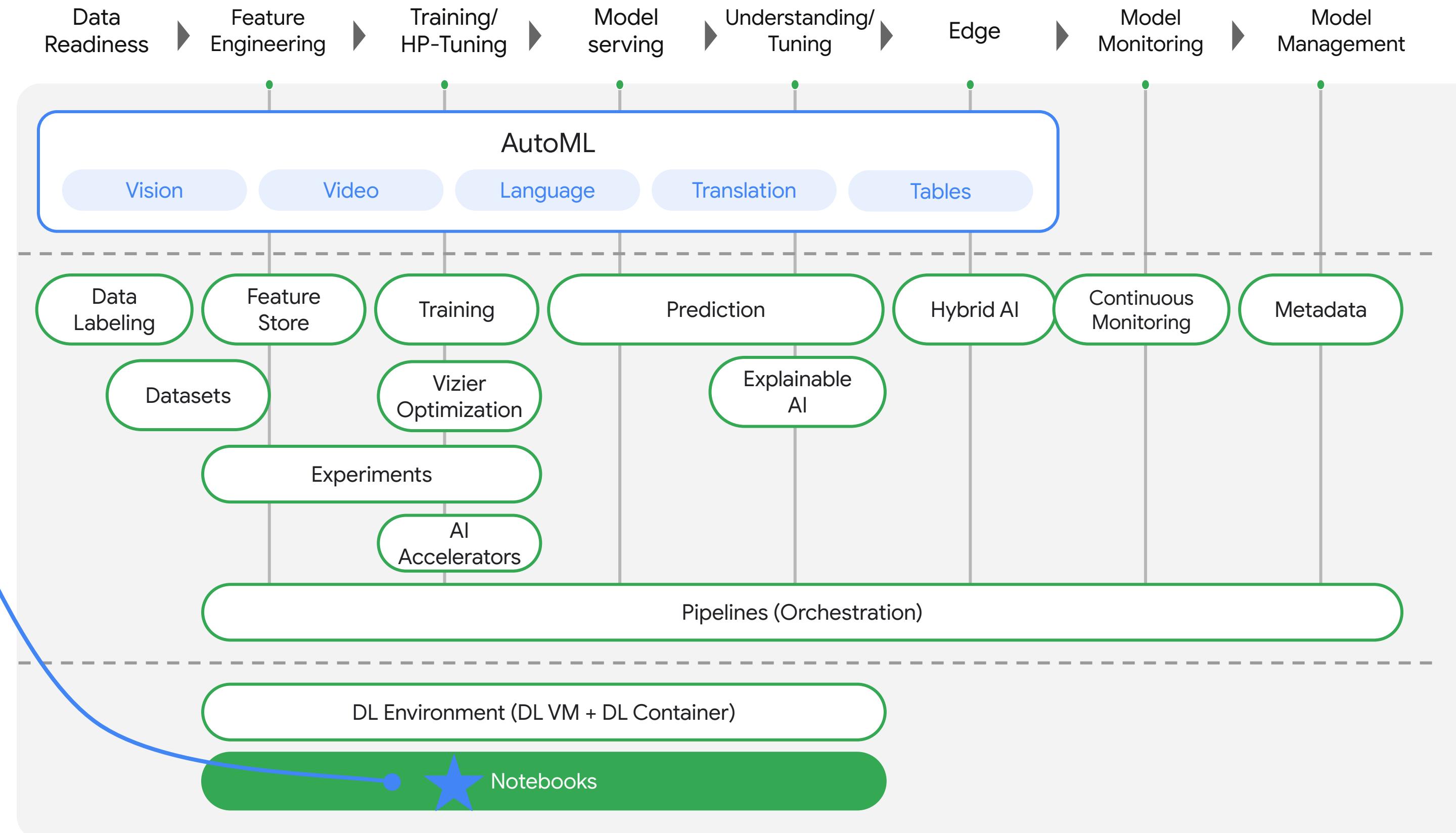


## End-To-End: Pipeline Orchestration

03a

## Notebook: 03a

# Vertex AI Overview

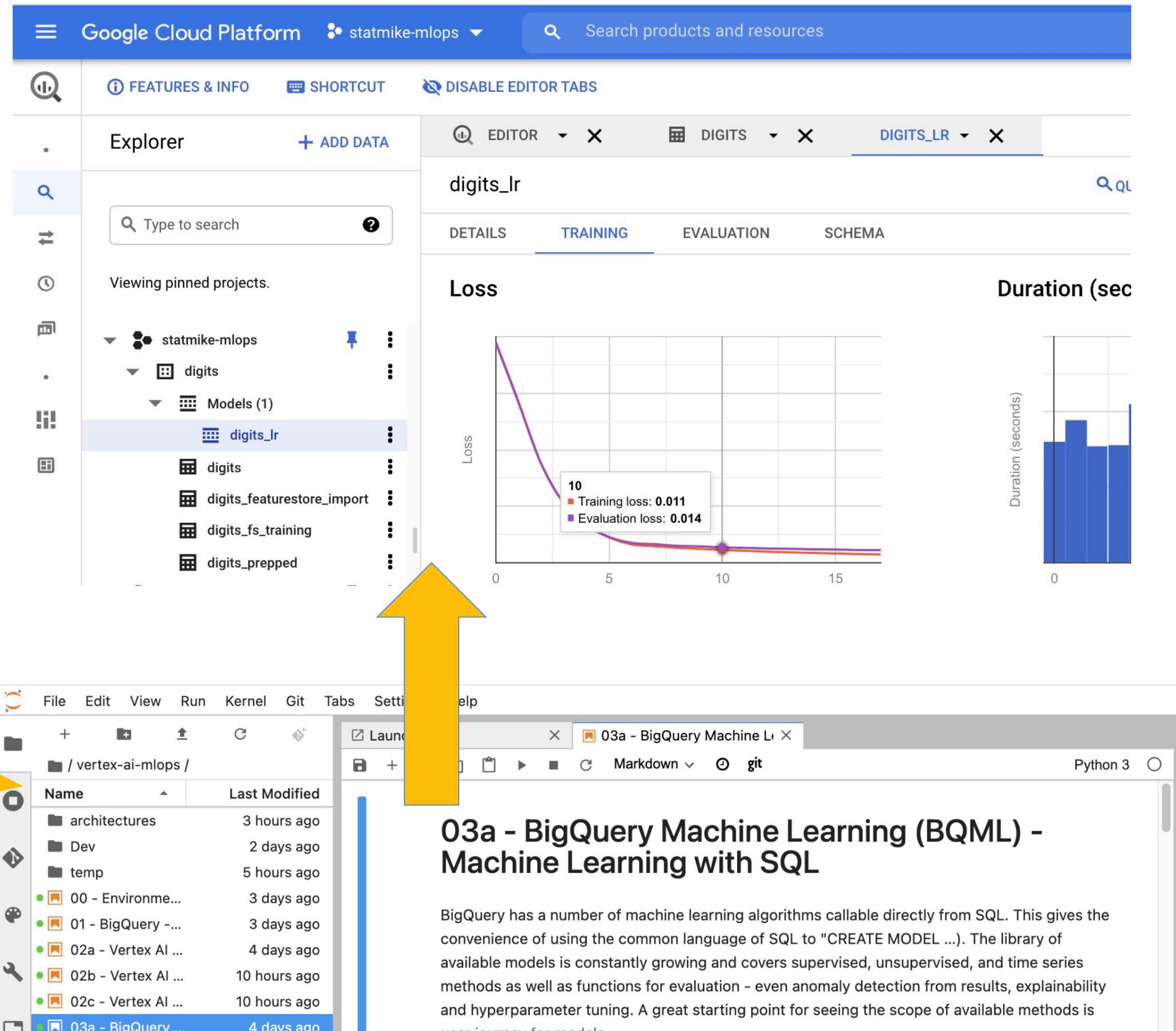


Google Cloud Platform

Vertex AI

- Dashboard
- Datasets
- Features
- Labeling tasks
- Notebooks
- Pipelines
- Training
- Experiments
- Models
- Endpoints
- Batch predictions
- Metadata

Marketplace





# BigQuery Machine Learning

## Vertex AI

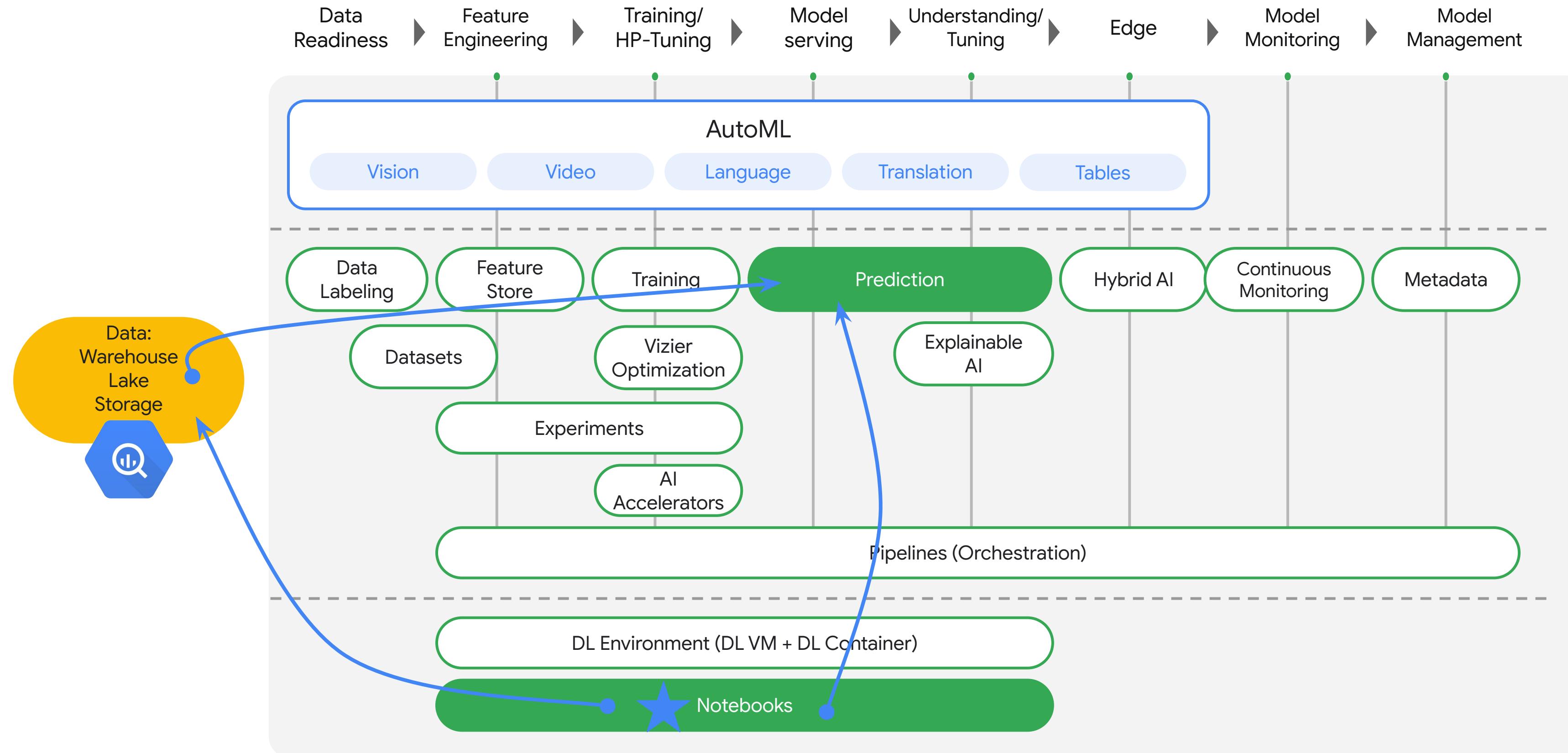


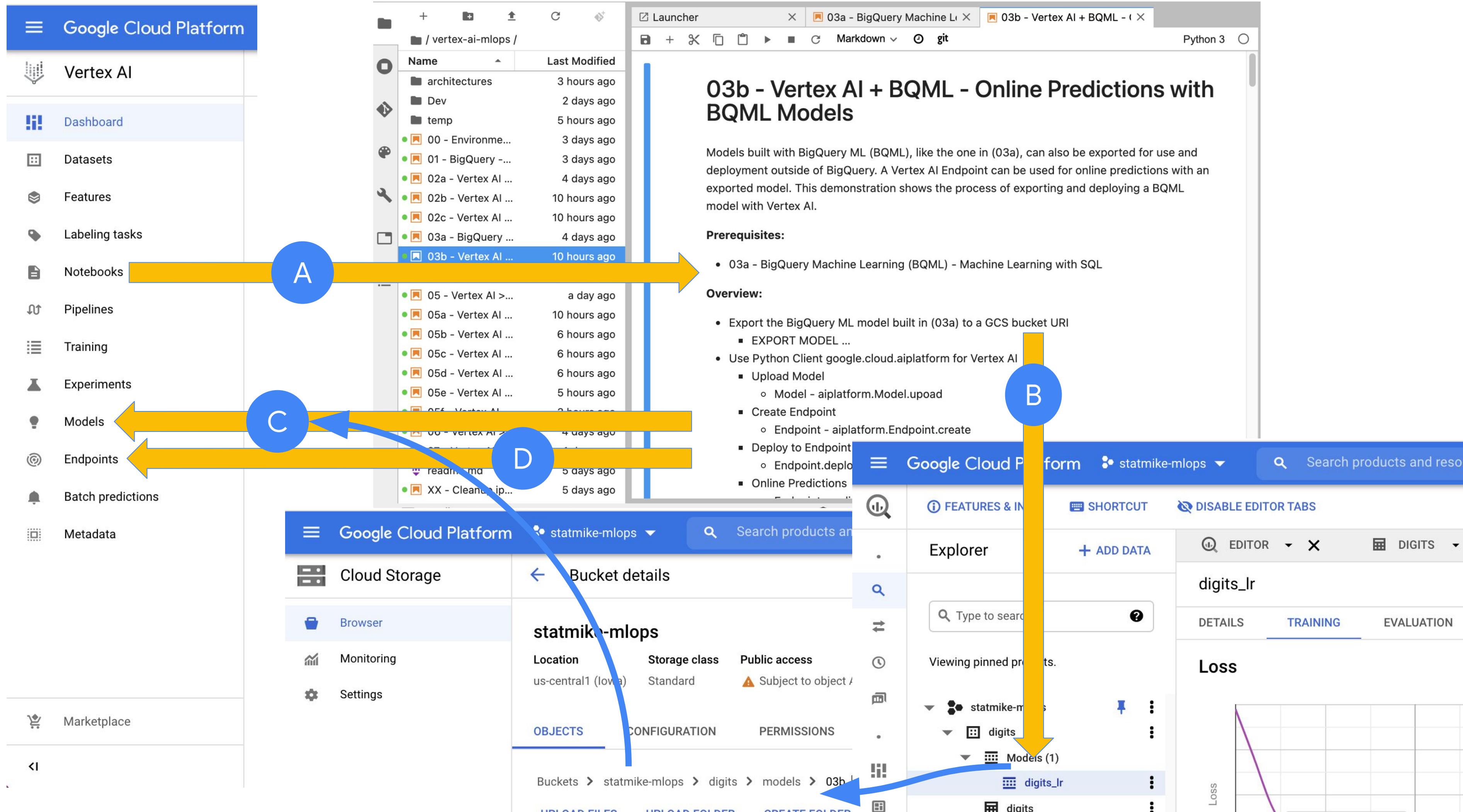
## End-To-End with SQL

03b

## Notebook: 03b

# Vertex AI Overview

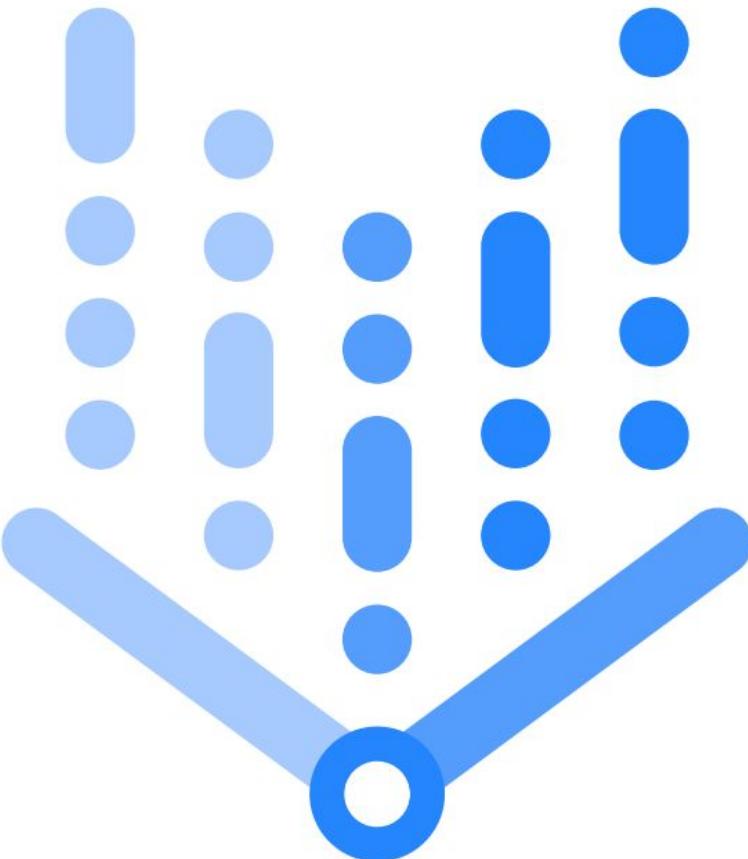






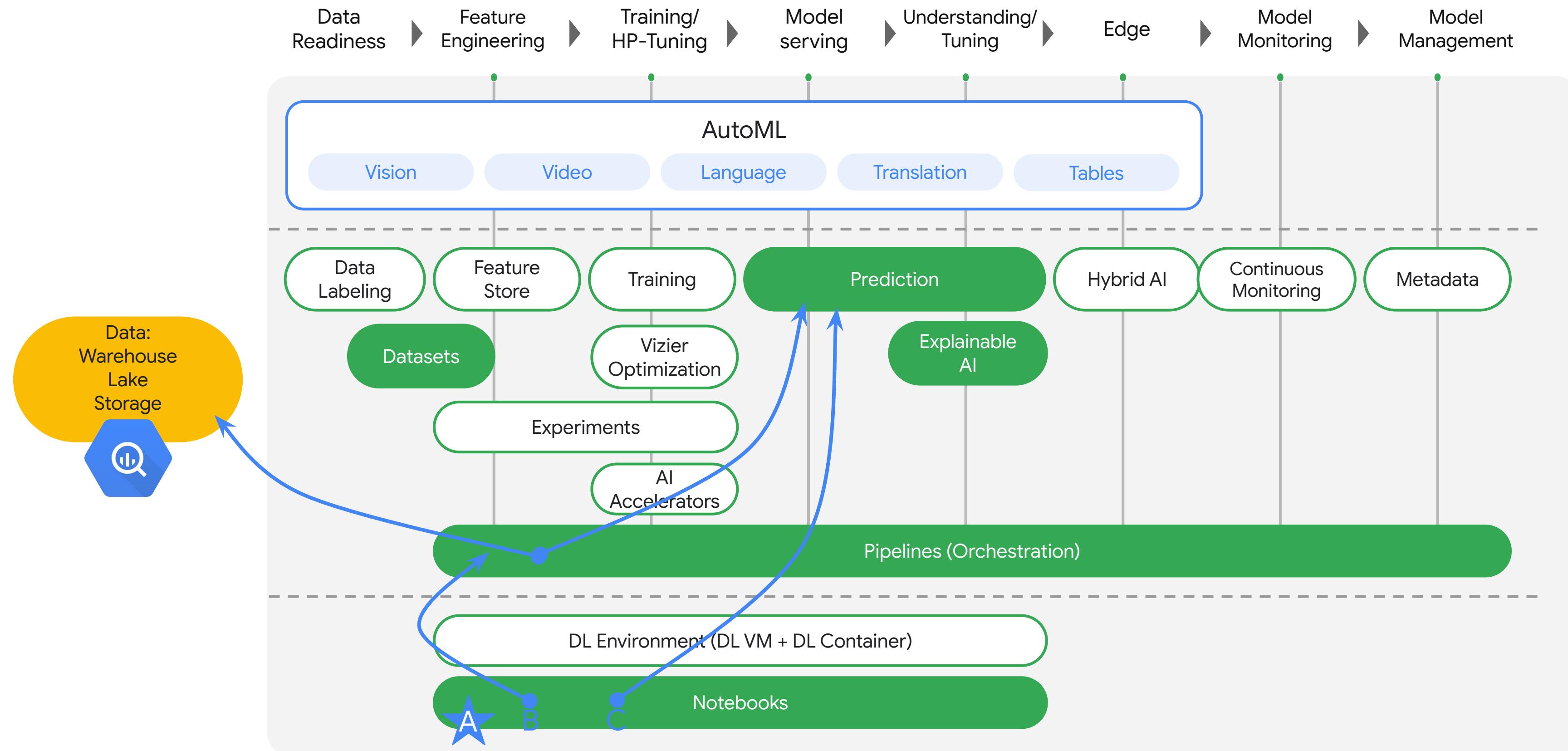
# BigQuery Machine Learning

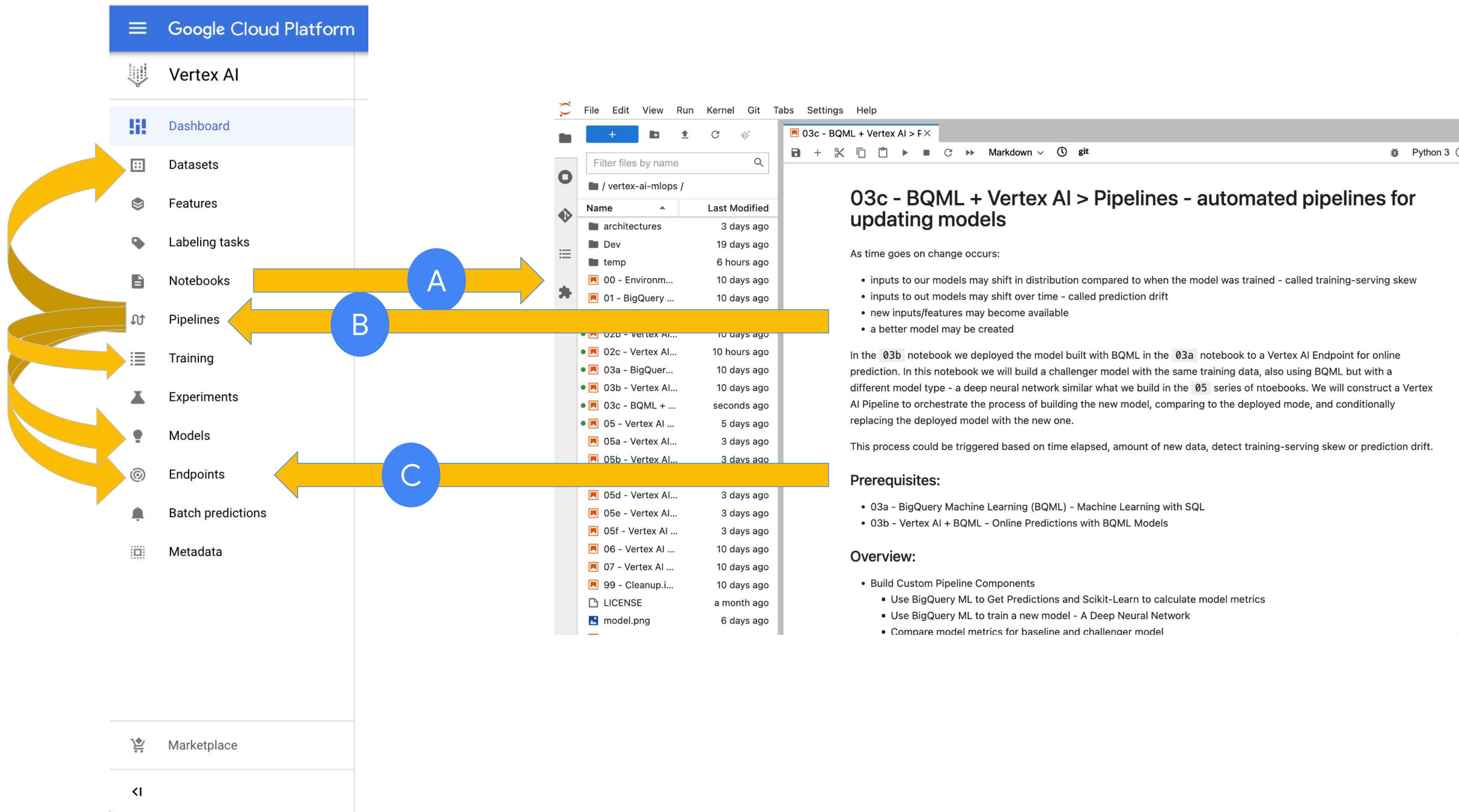
## Vertex AI



## BQML to Online Predictions

03c







# BigQuery Machine Learning

Vertex AI

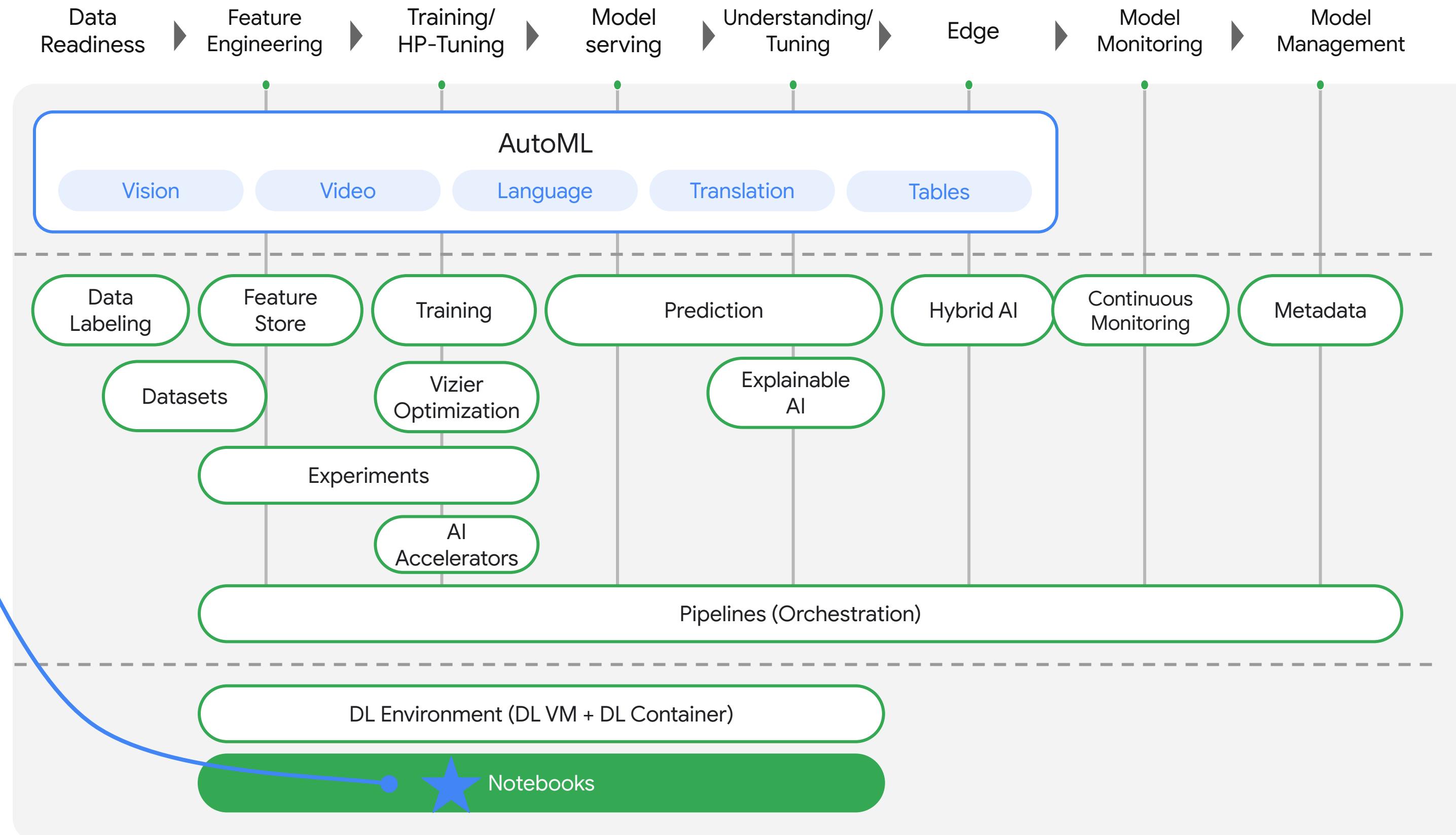


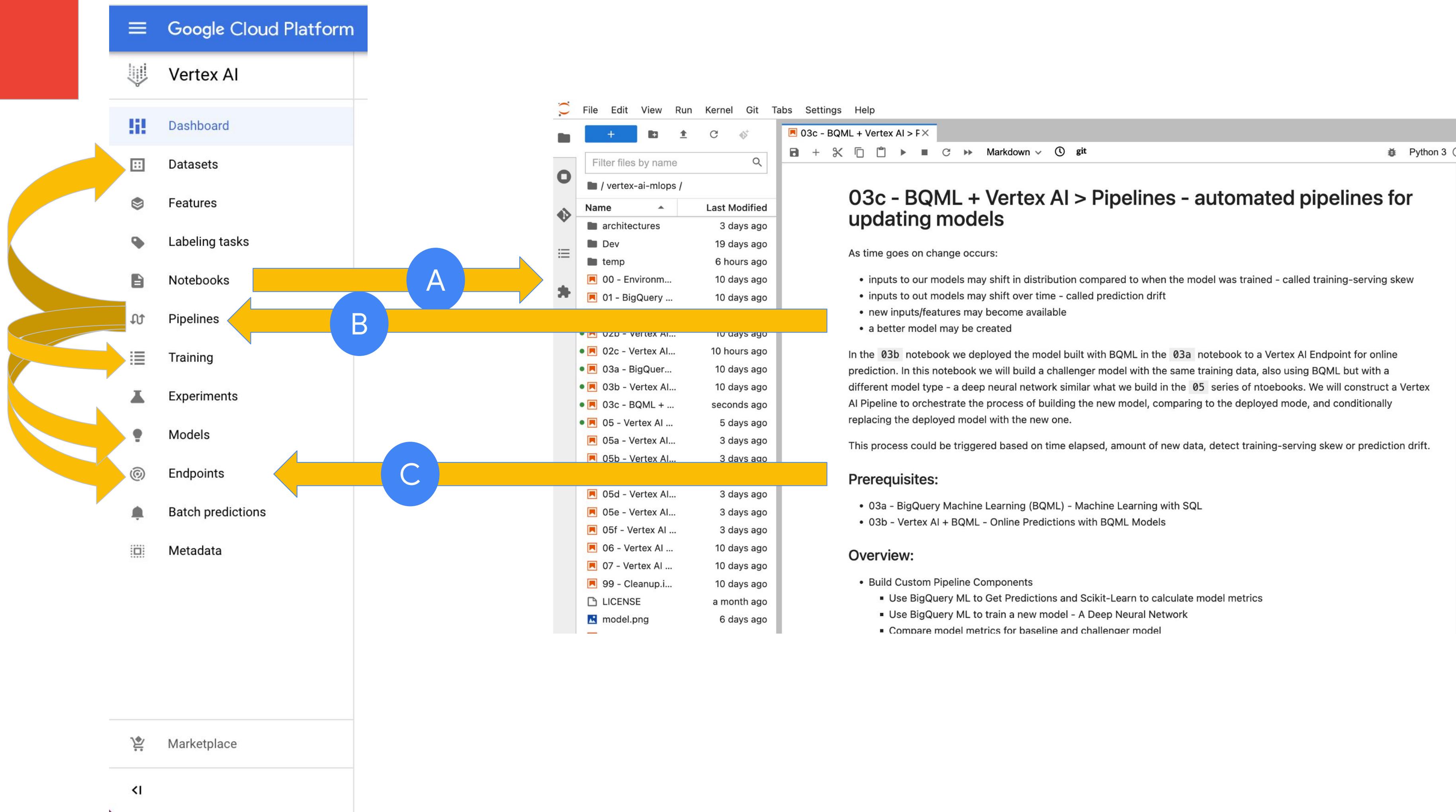
**End-To-End Pipeline Orchestration**  
**Conditionally Update Endpoints**

04

## Notebook: 04

# Vertex AI Overview







# Time Series Forecasting

Vertex AI

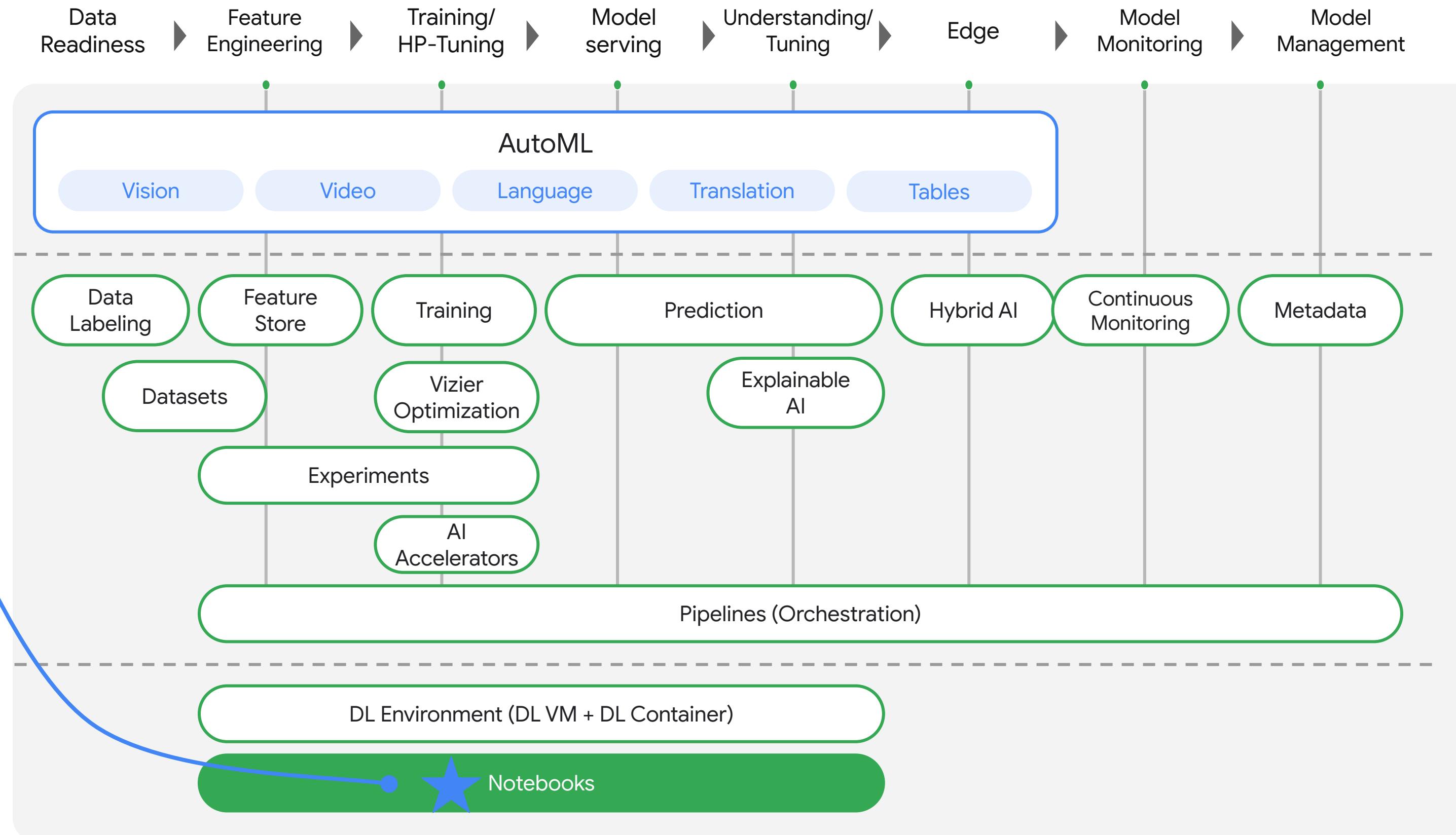


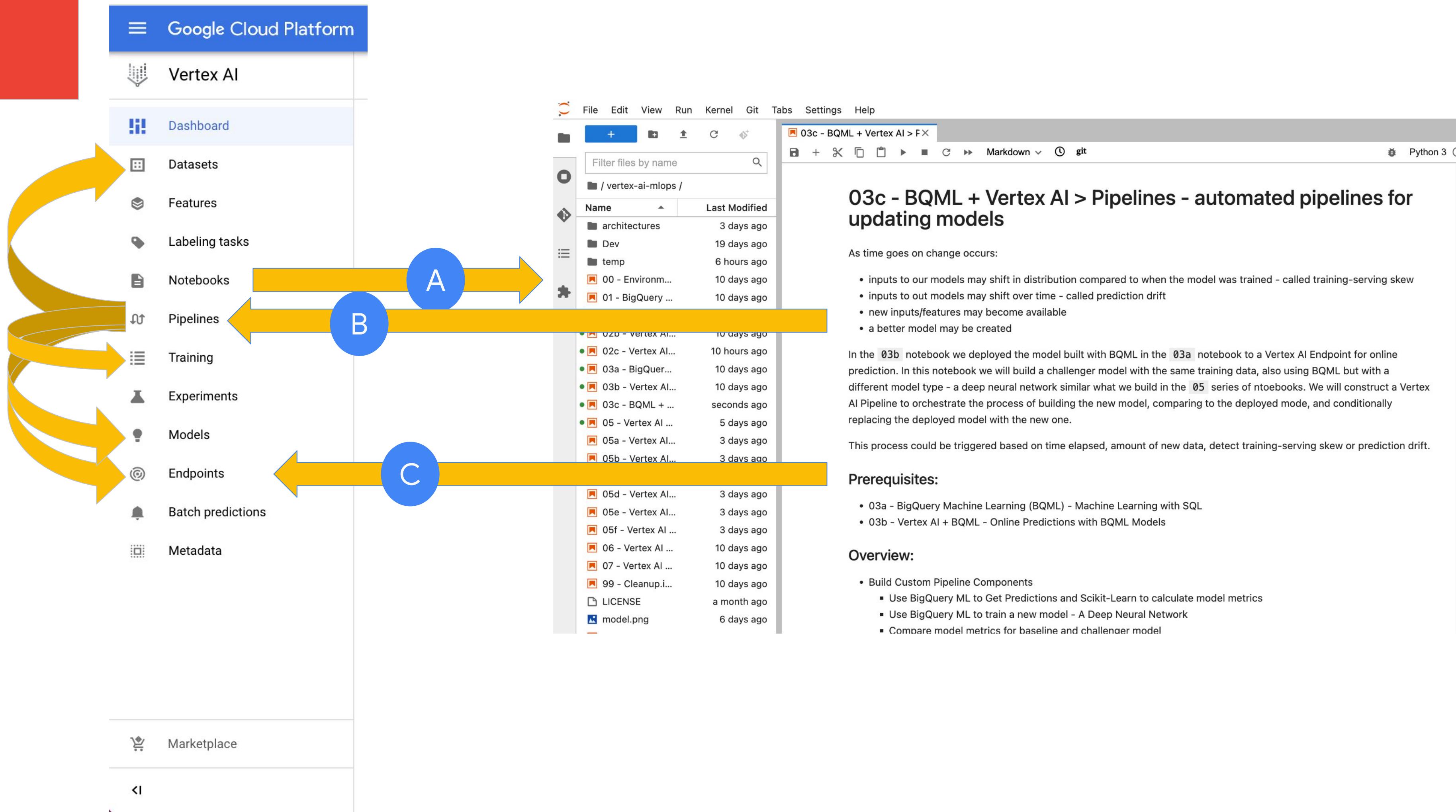
## Data Review with BigQuery

04a

## Notebook: 04

# Vertex AI Overview







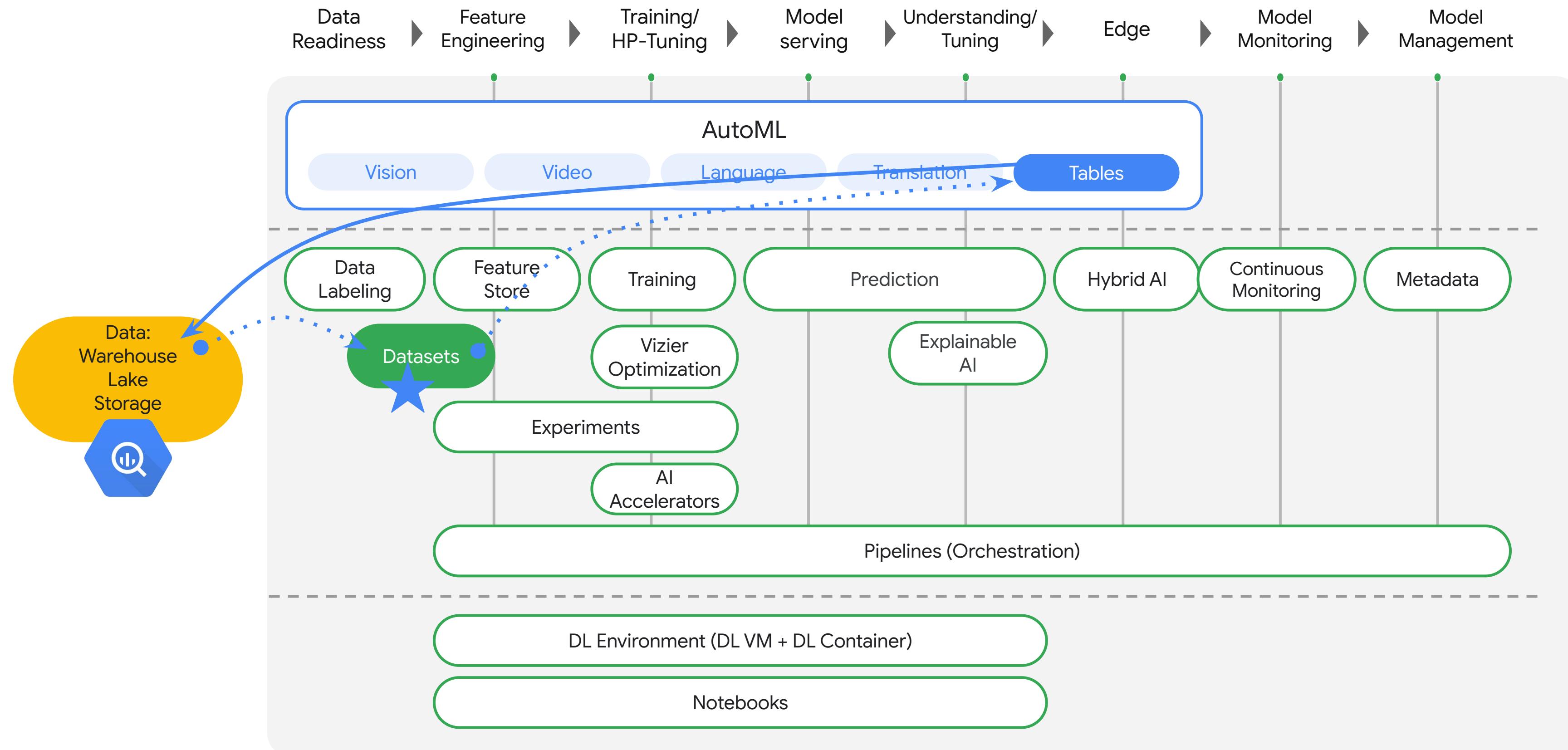
# Time Series Forecasting

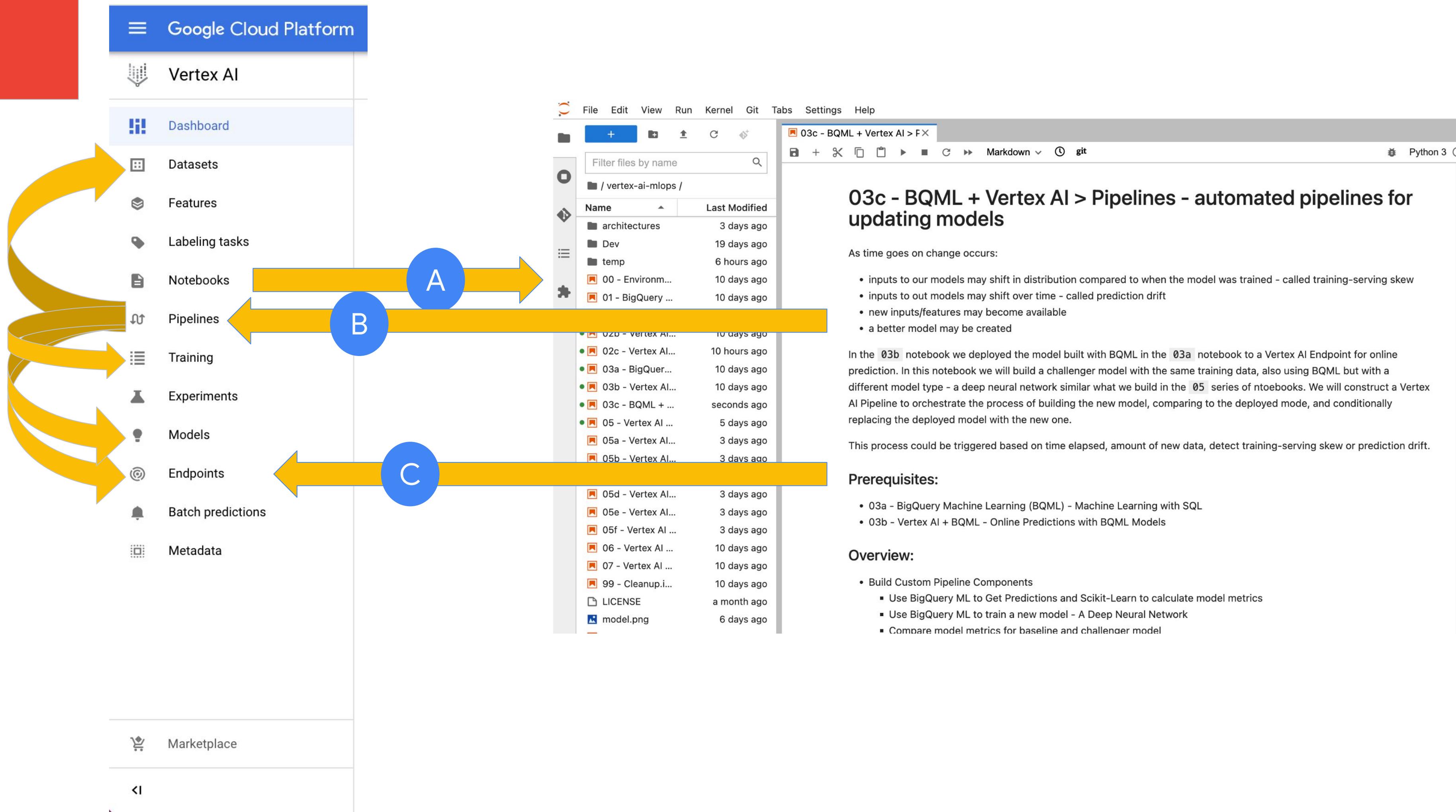
Vertex AI



**BigQuery Machine Learning**  
**Univariate Forecasting with ARIMA+**

04b







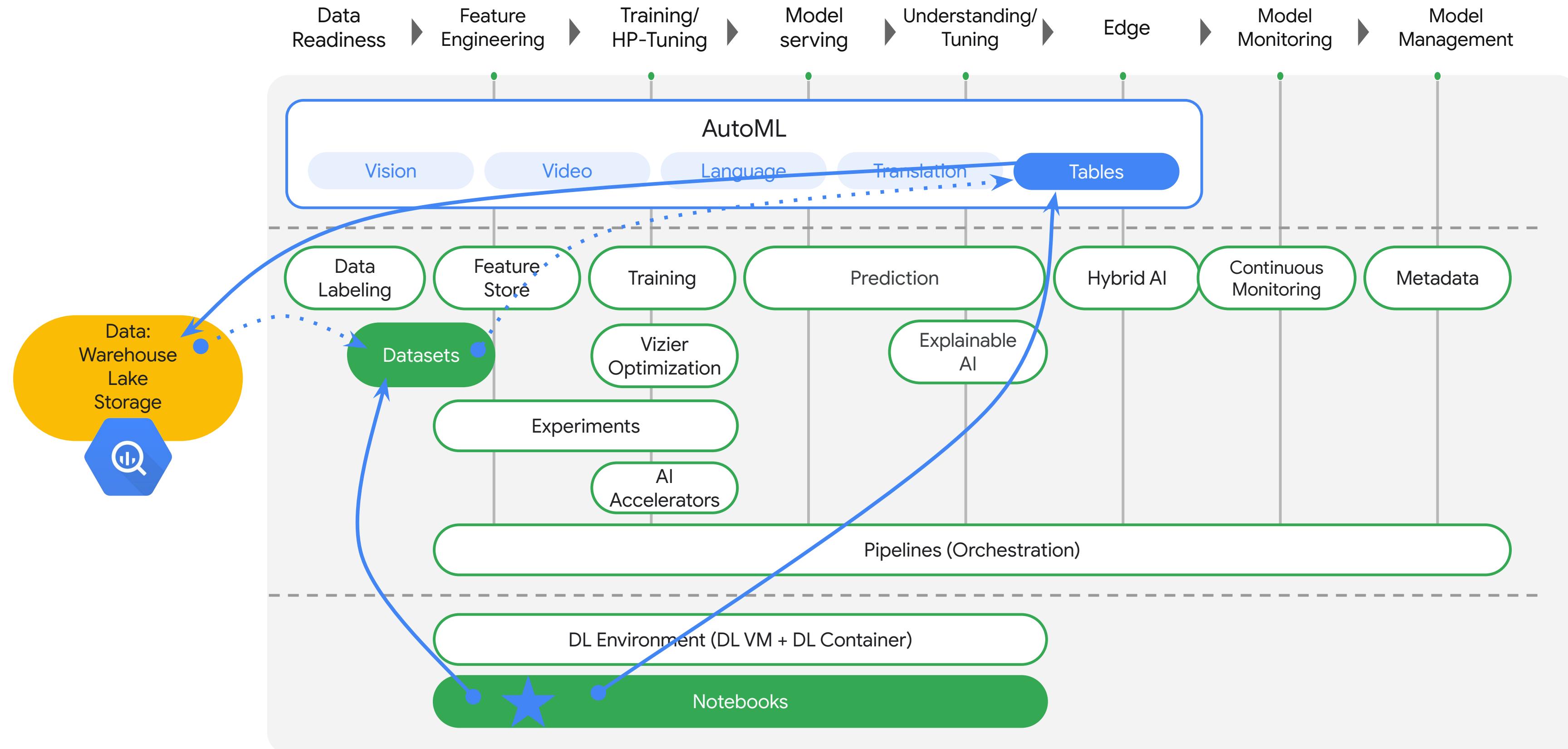
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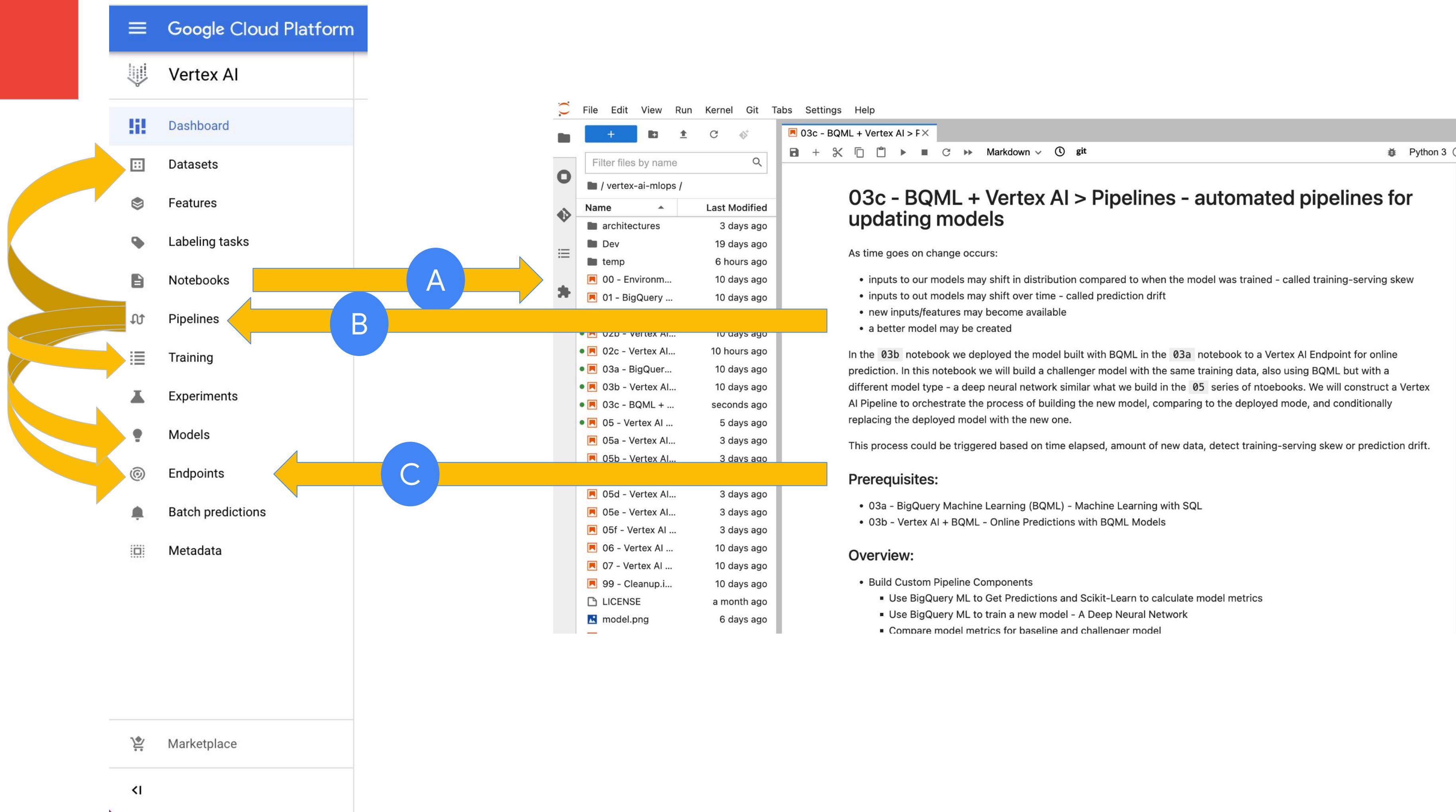
Vertex AI



**AutoML With The Console (No Code)**  
**Global Forecasting With Deep Learning**

04c

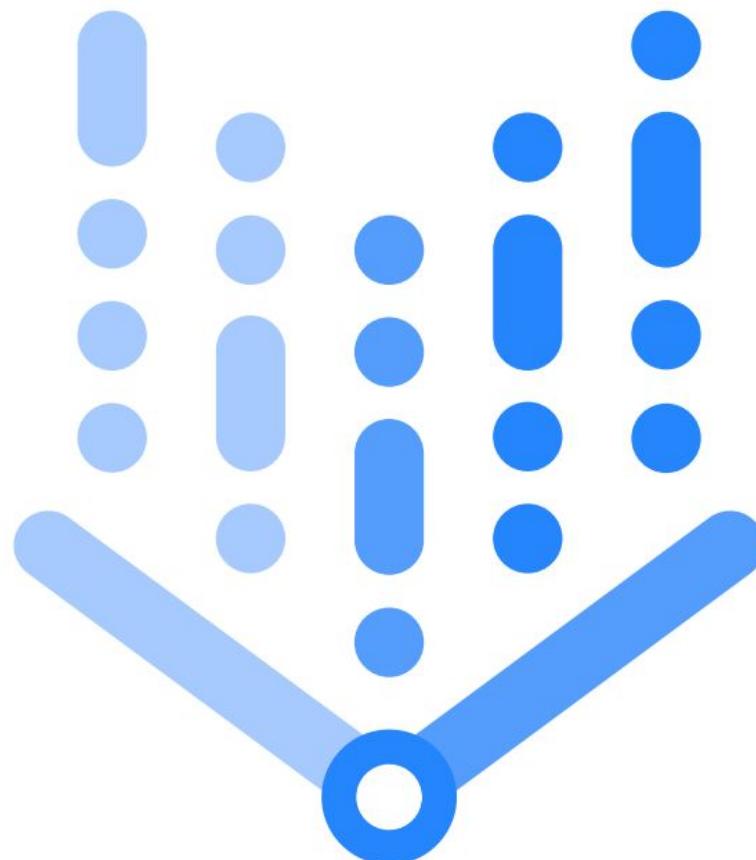






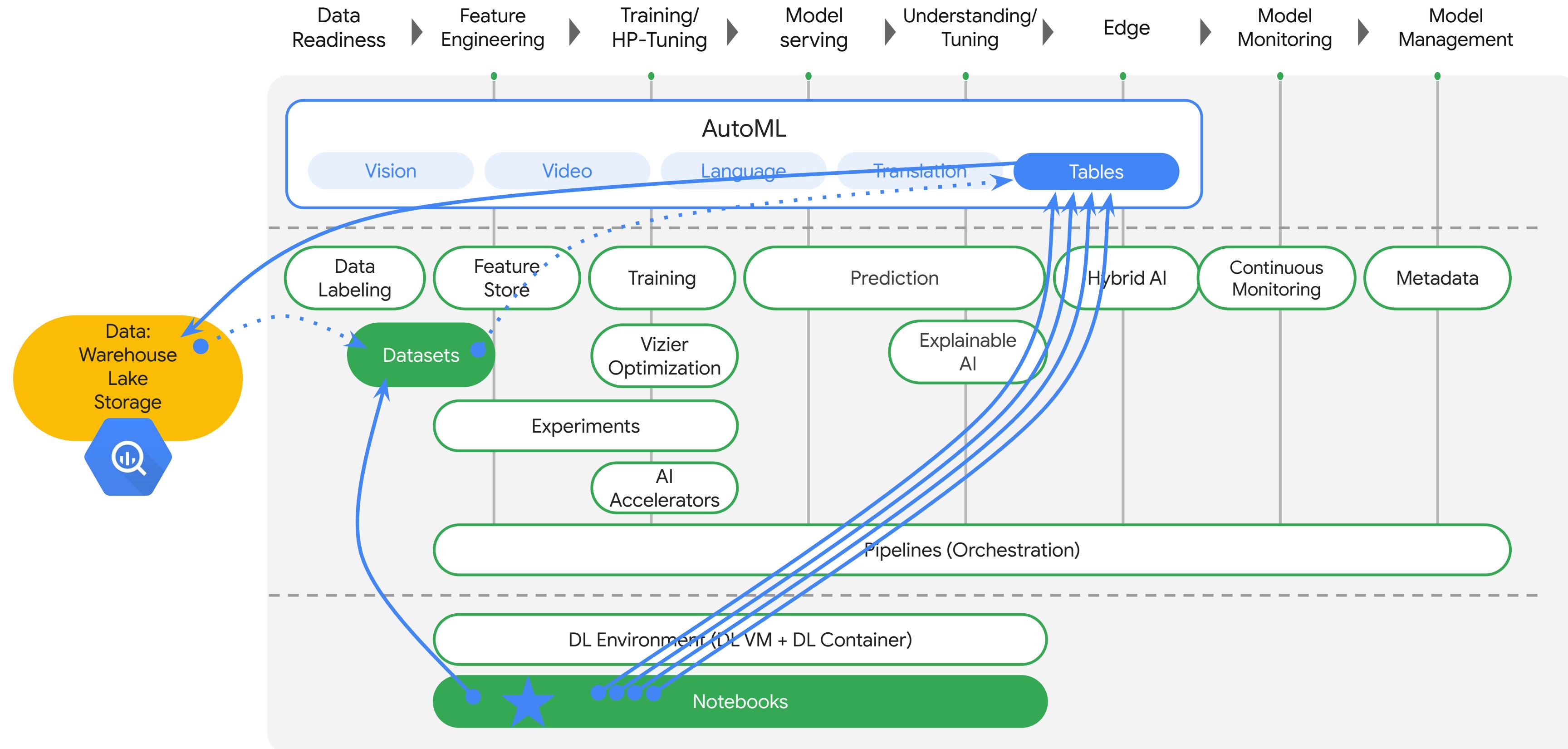
# Time Series Forecasting

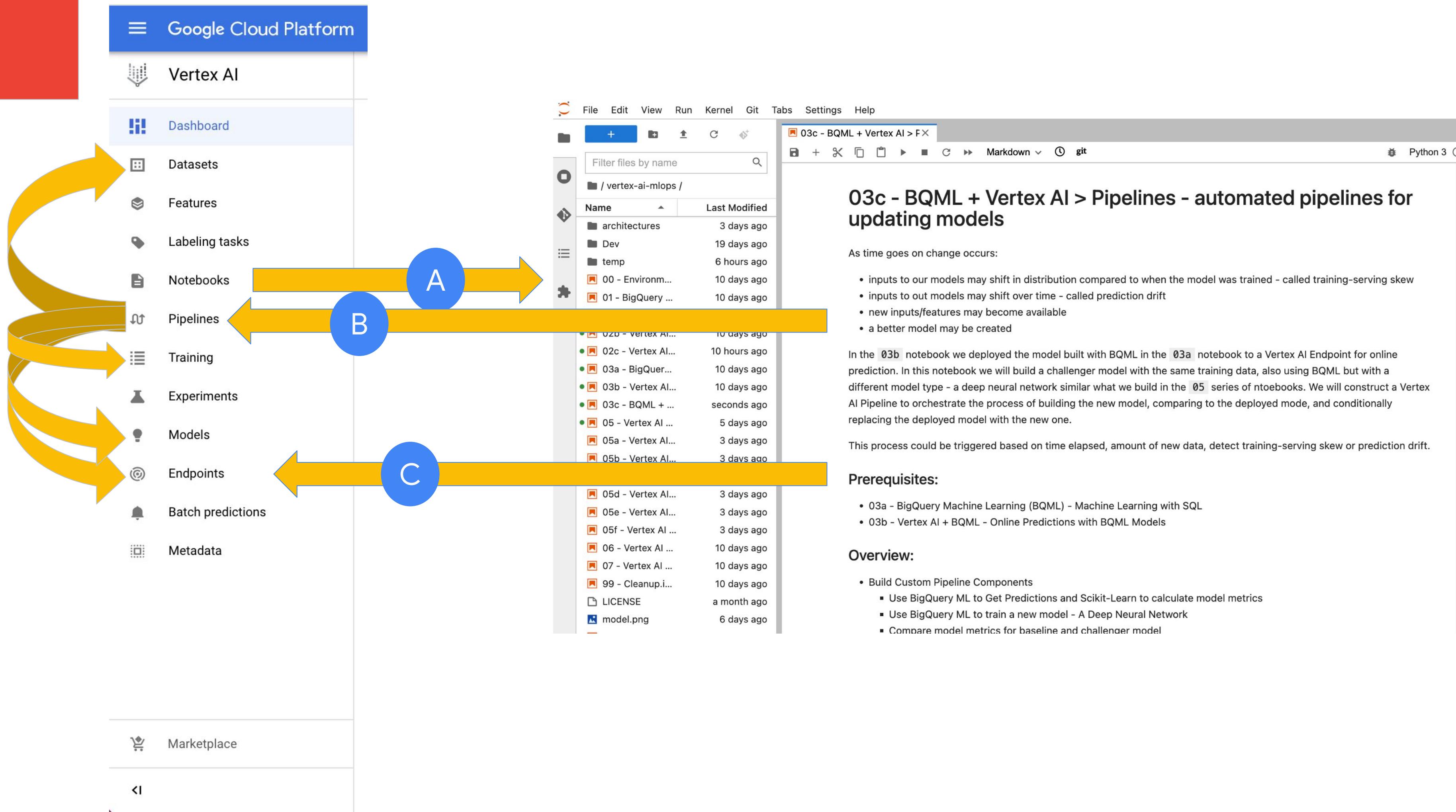
Vertex AI



**AutoML With The Python Client**  
**Global Forecasting With Deep Learning**

04d

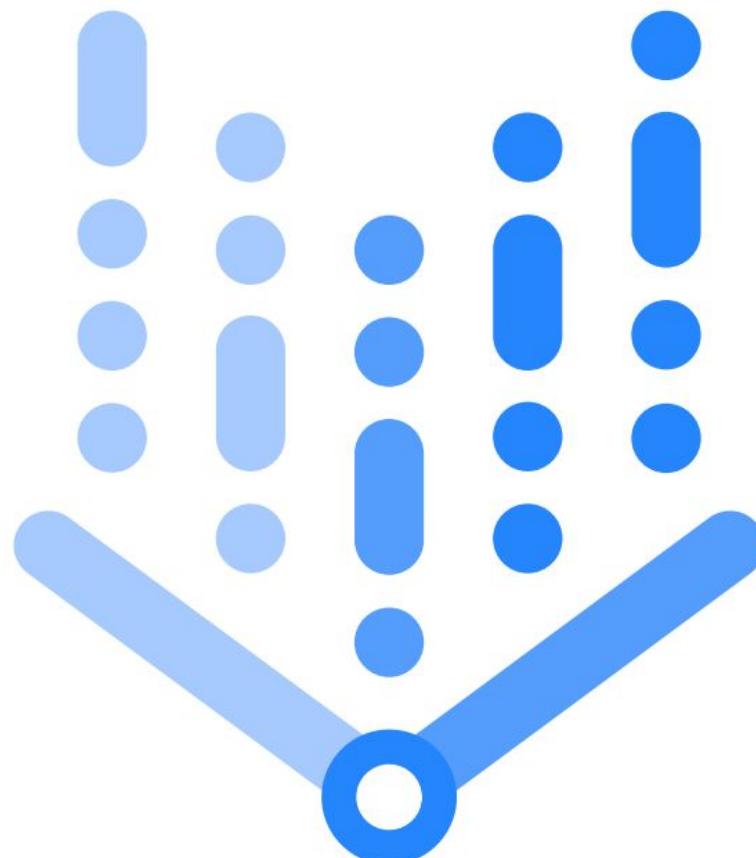






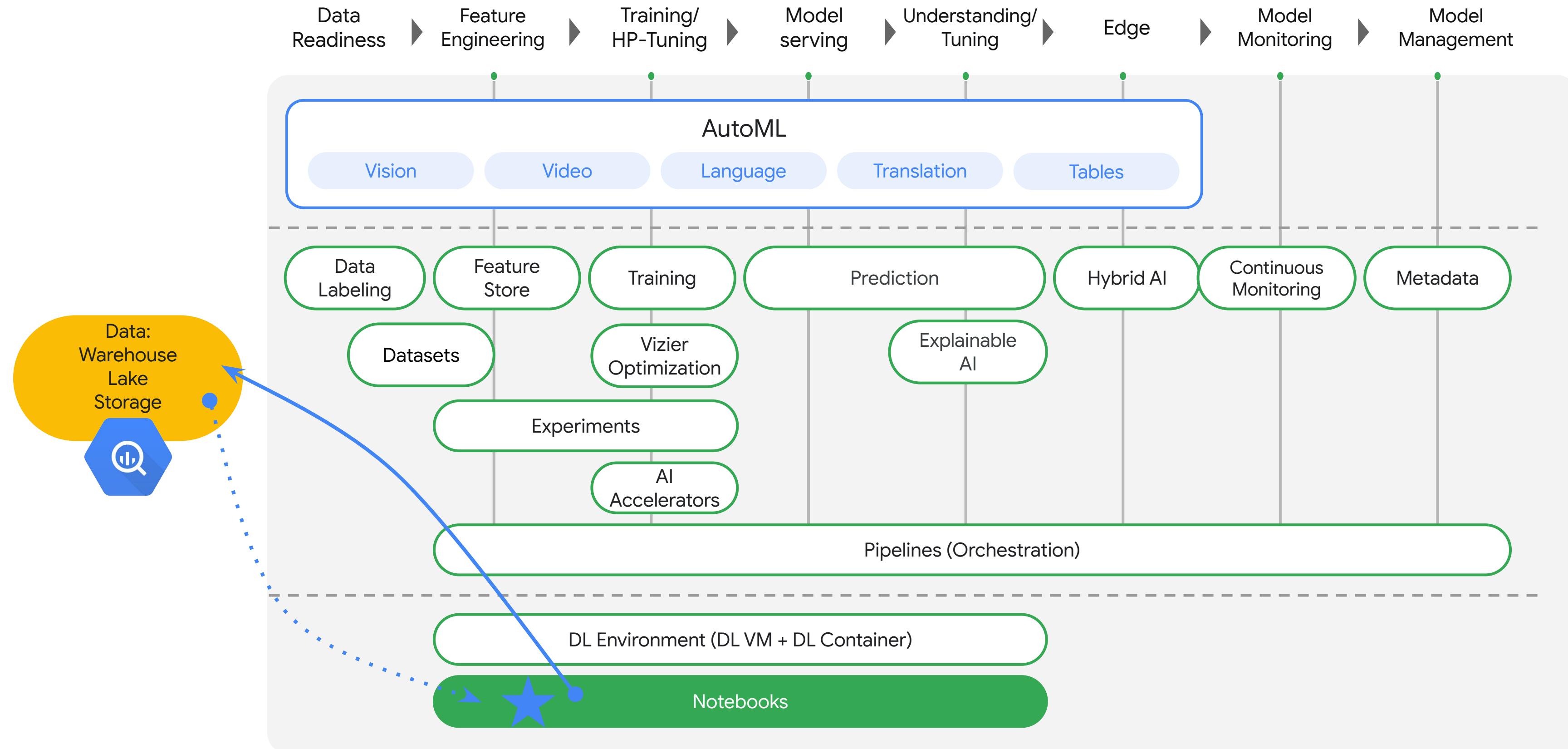
# Time Series Forecasting

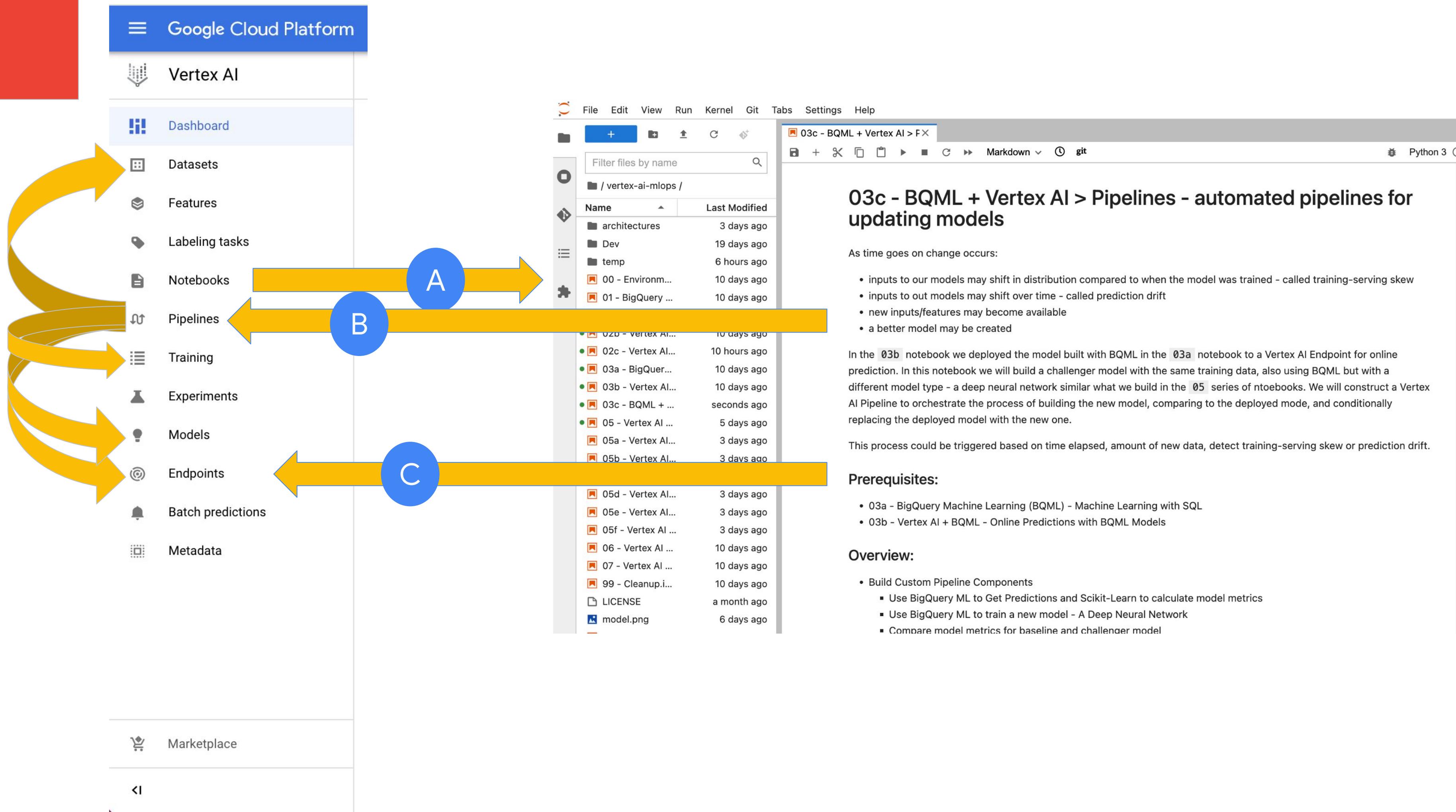
Vertex AI



**AutoML With Multiple Scenarios**  
**Global Forecasting With Deep Learning**

04e







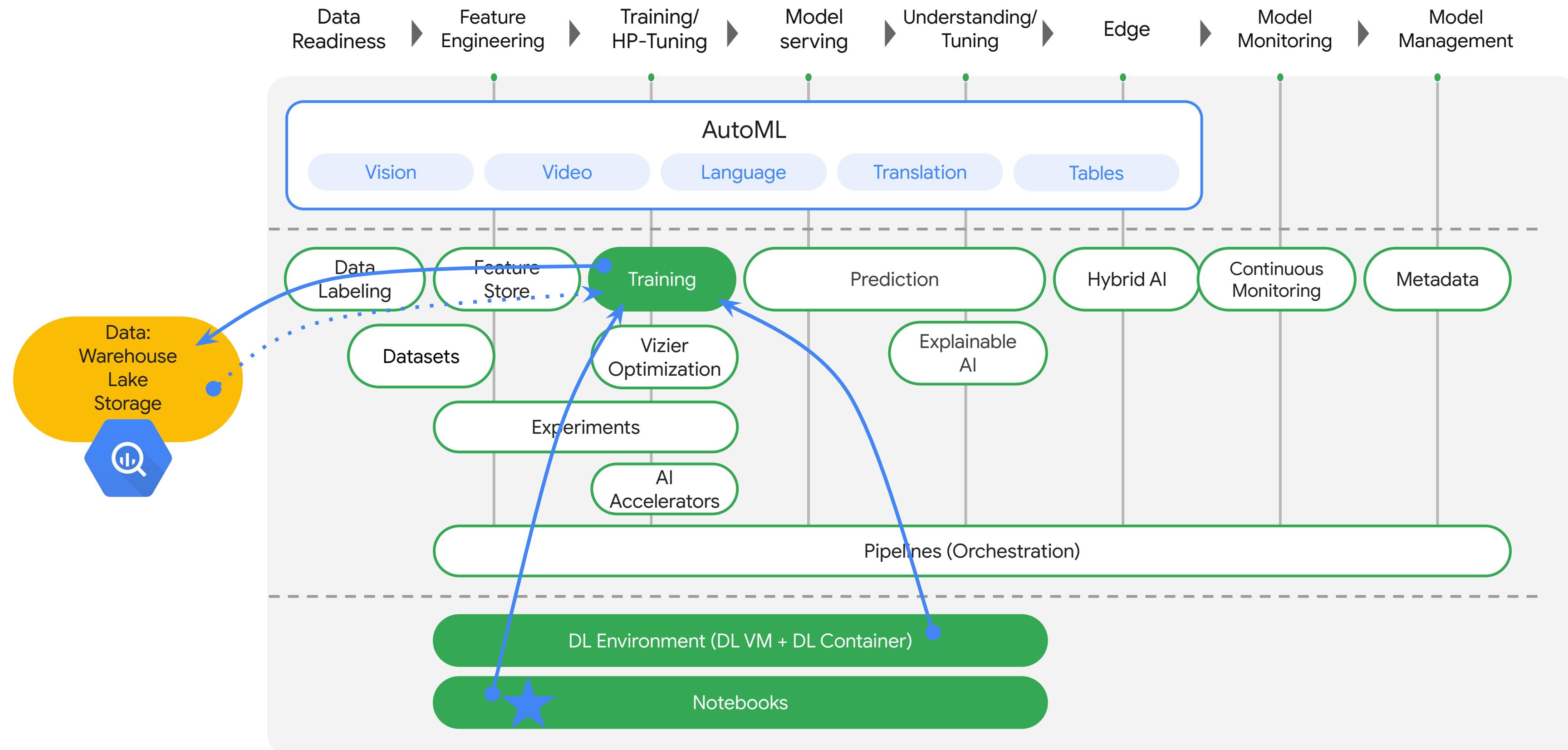
# Time Series Forecasting

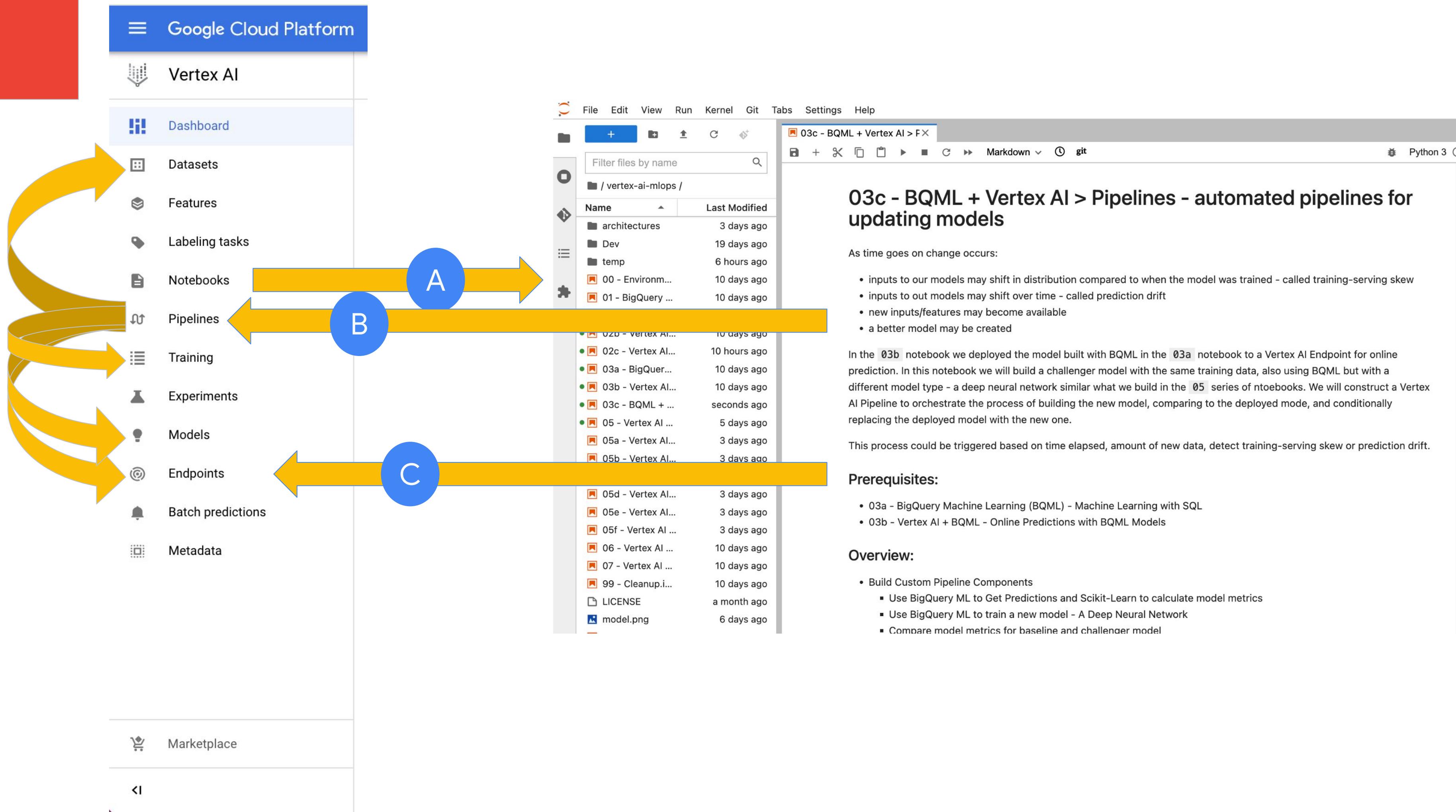
Vertex AI



**Custom Forecast In Notebook**  
**Using Prophet in Vertex AI Notebooks**

04f

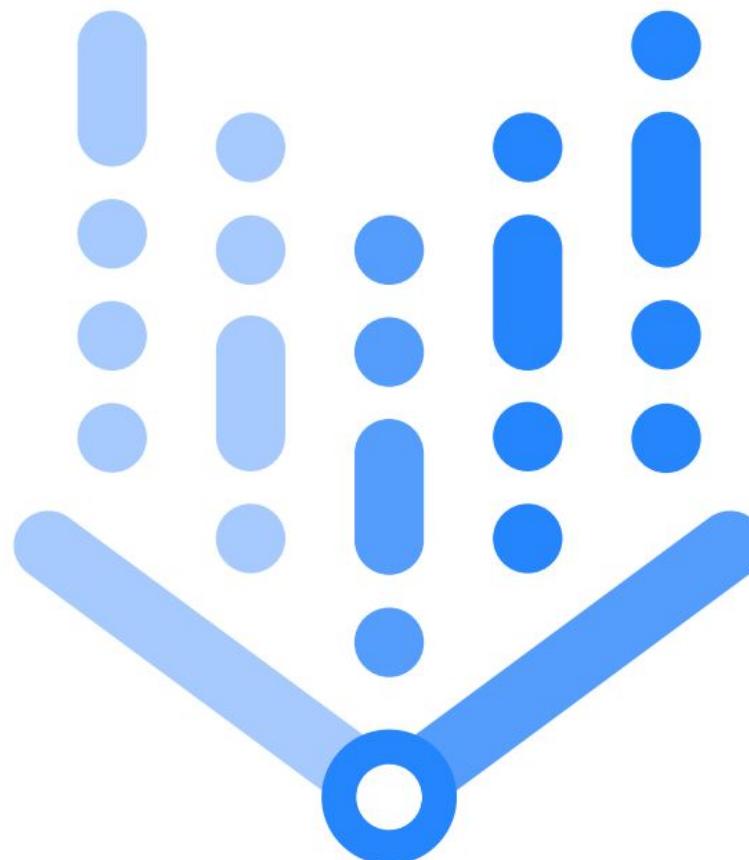






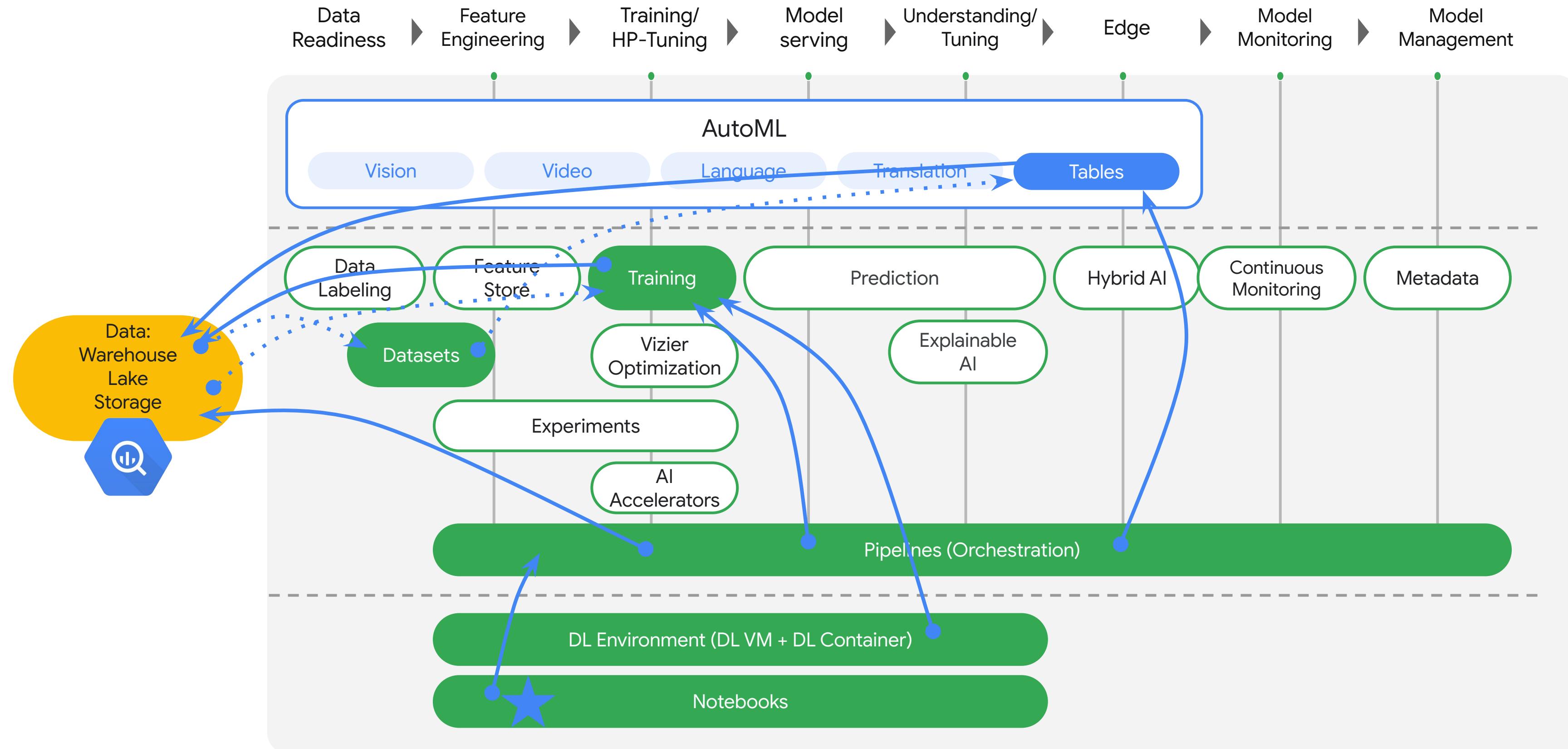
# Time Series Forecasting

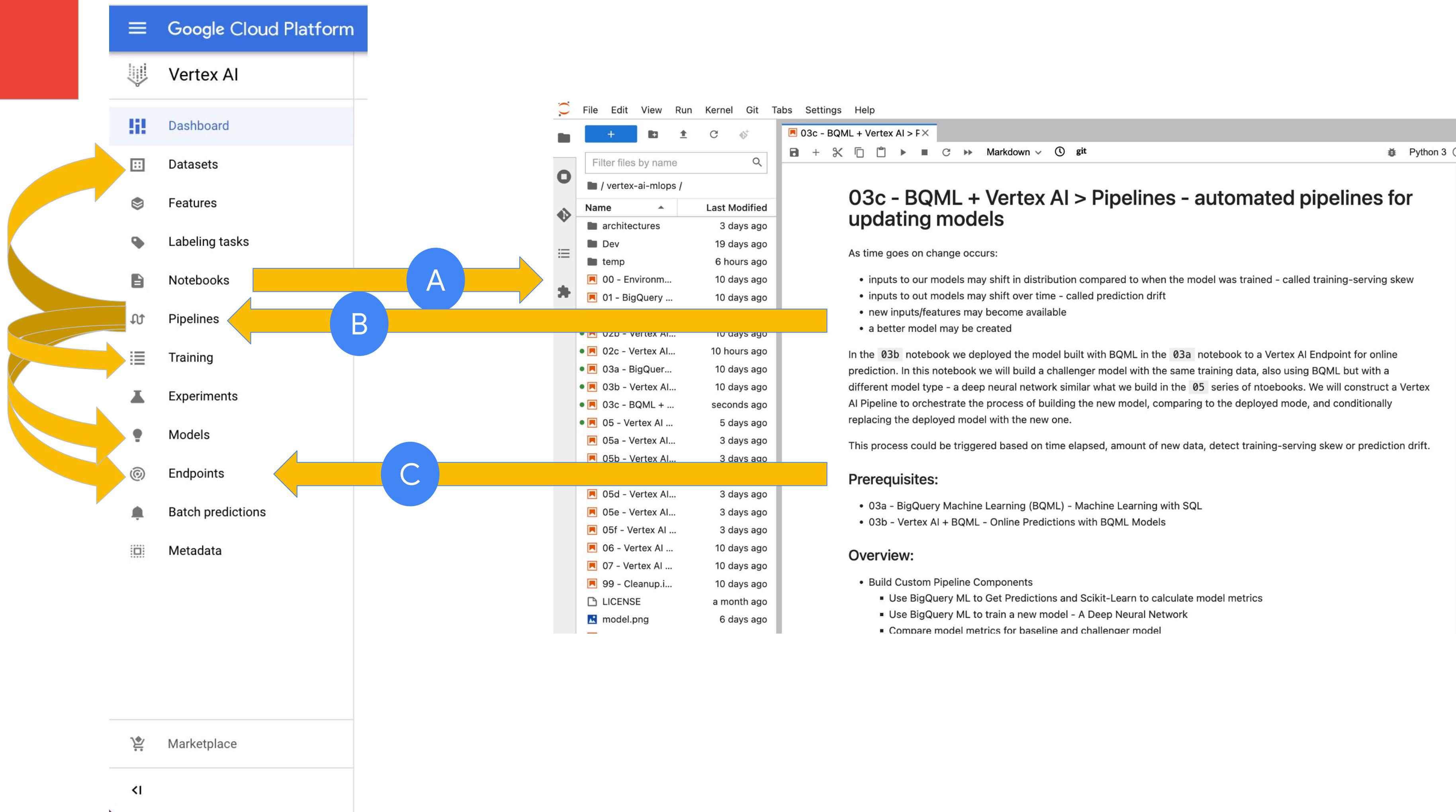
Vertex AI



Custom Job With Custom Container  
Using Prophet in Vertex AI Training

04g

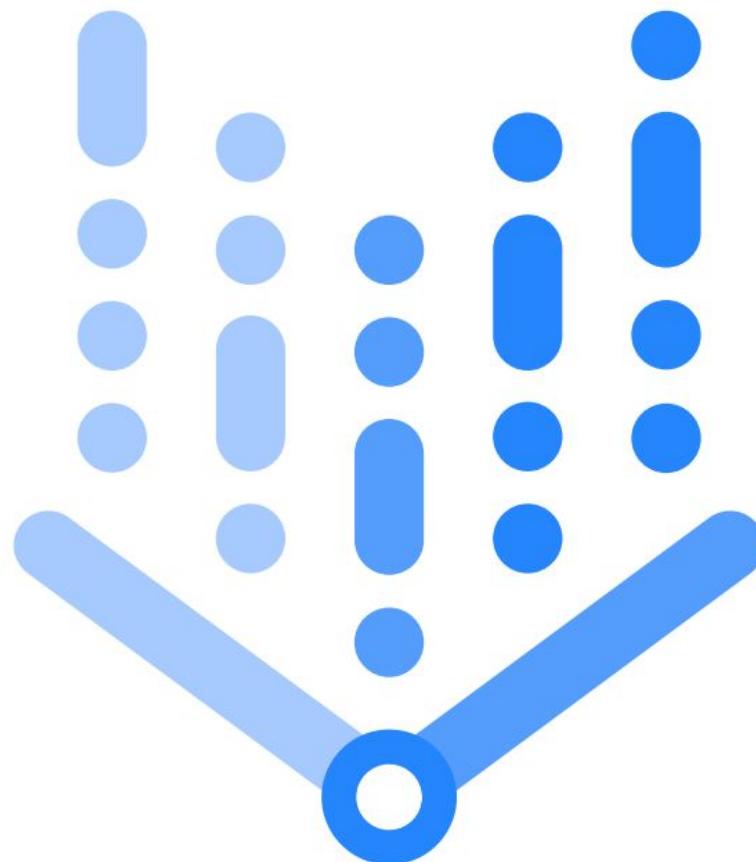






# Time Series Forecasting

Vertex AI



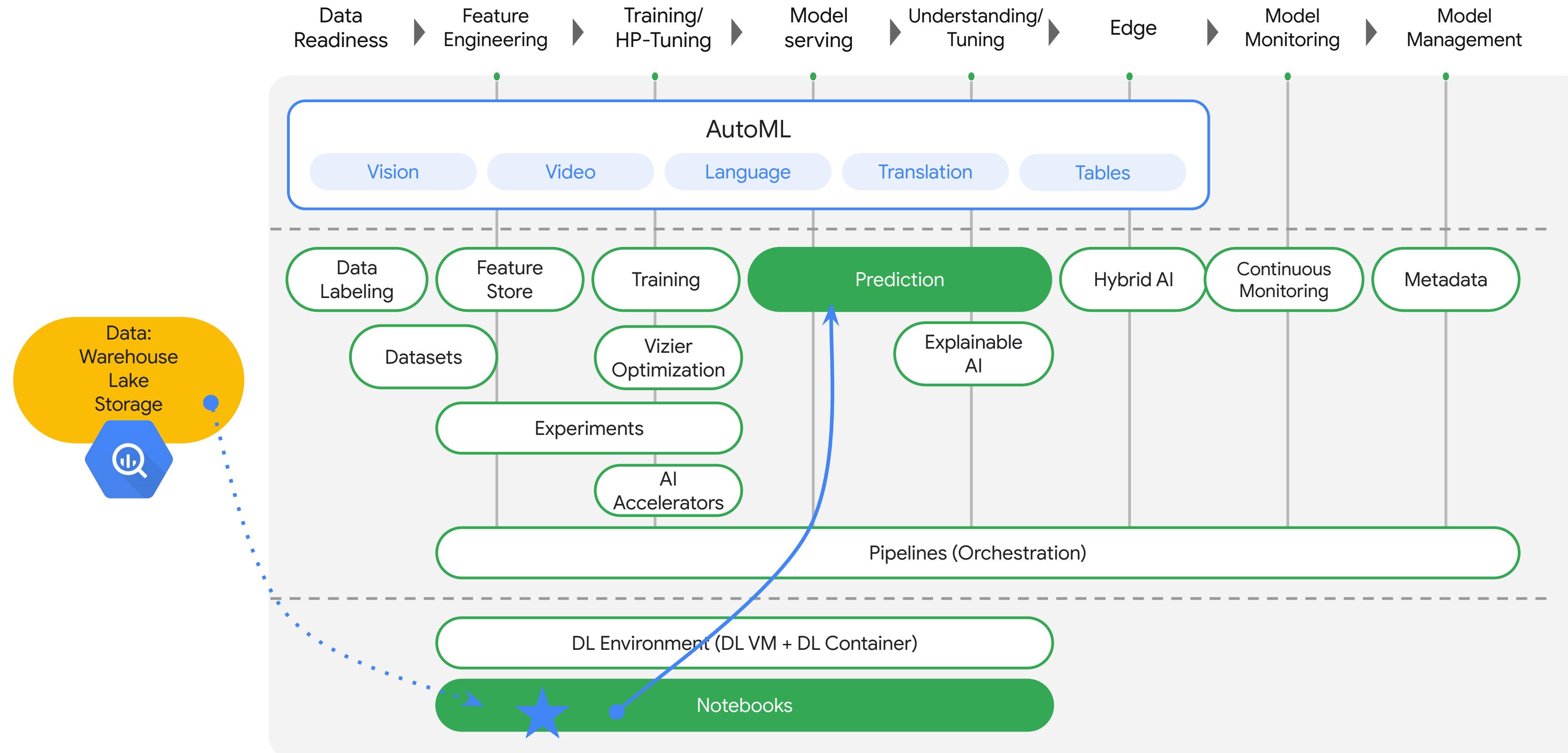
Forecast Tournament Pipeline

BigQuery ML ARIMA+, AutoML and Prophet

05

## Notebook: 05

# Vertex AI Overview



**A**

**B**

**C**

**D**

## 05 - Vertex AI > Notebooks - Models Built in Notebooks with Tensorflow

Where a model gets trained is where it consumes computing resources. With Vertex AI, you have choices for configuring the computing resources available at training. This notebook is an example of an execution environment. When it was set up there were choices for machine type and accelerators (GPUs).

This notebook shows training a model directly within the runtime of the notebook environment. Then the model is saved and moved to GCS for deployment to a Vertex AI Endpoint for online predictions. The model training is done with [Tensorflow](#), [Keras](#), and was designed to show a neural network approach to logistic regression. Training data batches are read from BigQuery using [Tensorflow I/O](#).

**Prerequisites:**

- 01 - BigQuery - Table Data Source

**Overview:**

- Use Python Client for BigQuery
  - Read the tables schema from BigQuery INFORMATION\_SCHEMA
  - Prepare the feature information for Tensorflow
- Define a function that remaps the input data into features and target variables where target is one-hot encoded (classification model with 10 classes)
- Set Tensorflow I/O read session
- Demonstrate reading a single batch
- Train a Tensorflow model
  - Define the model layers



# Custom Training



## Vertex AI

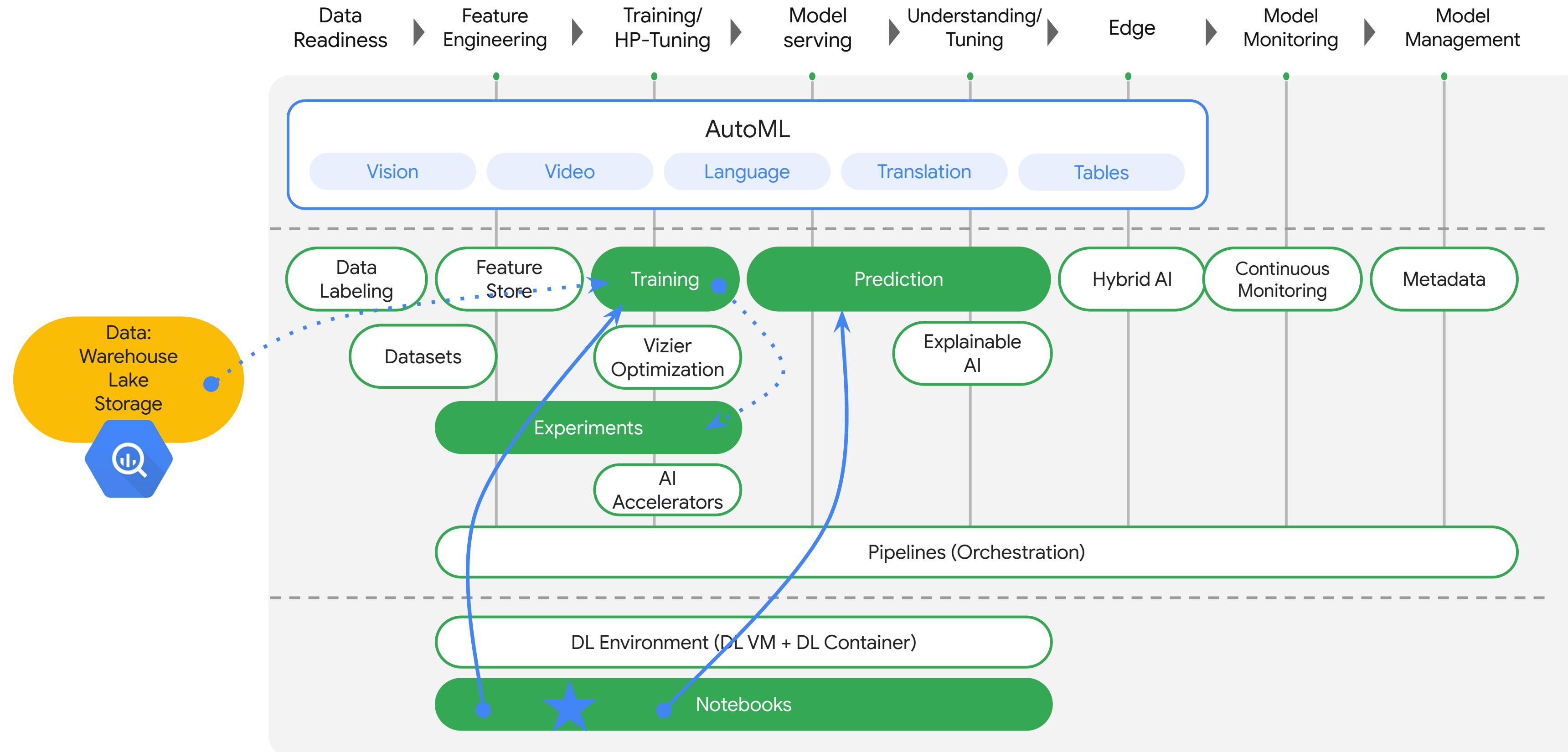


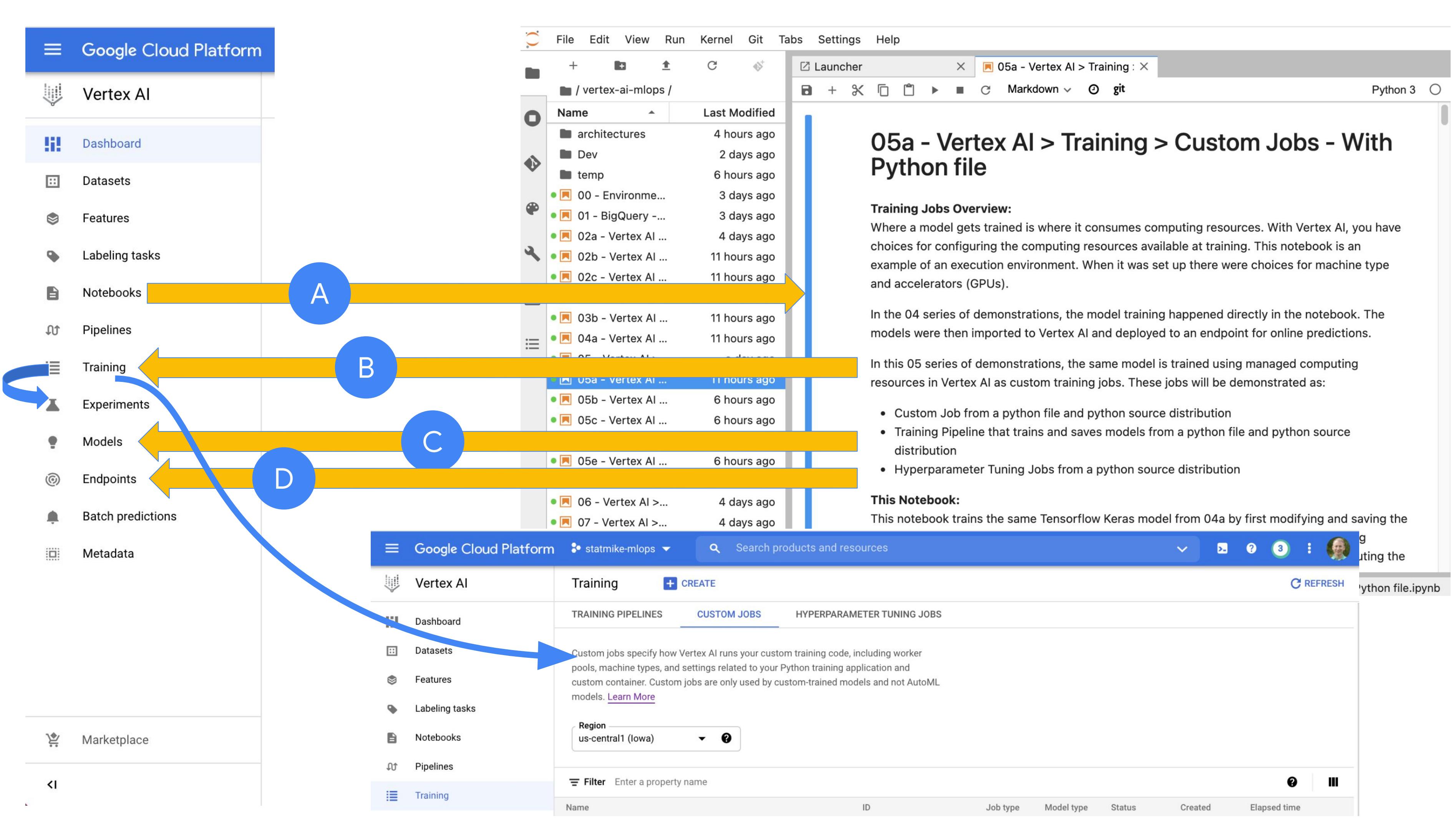
## Custom Training in Notebook

05a

## Notebook: 05a

# Vertex AI Overview



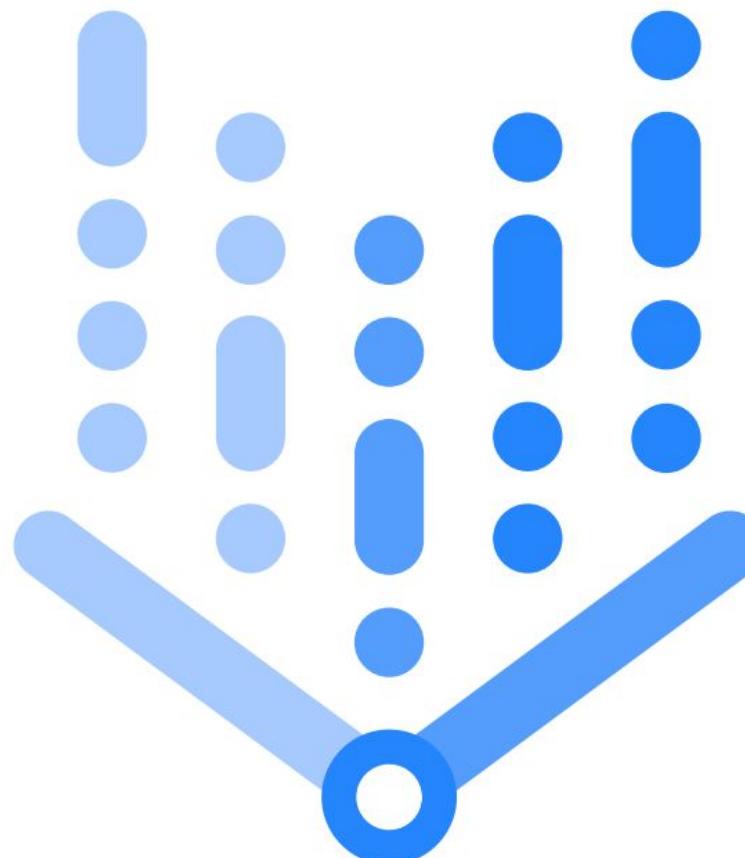




# Custom Training



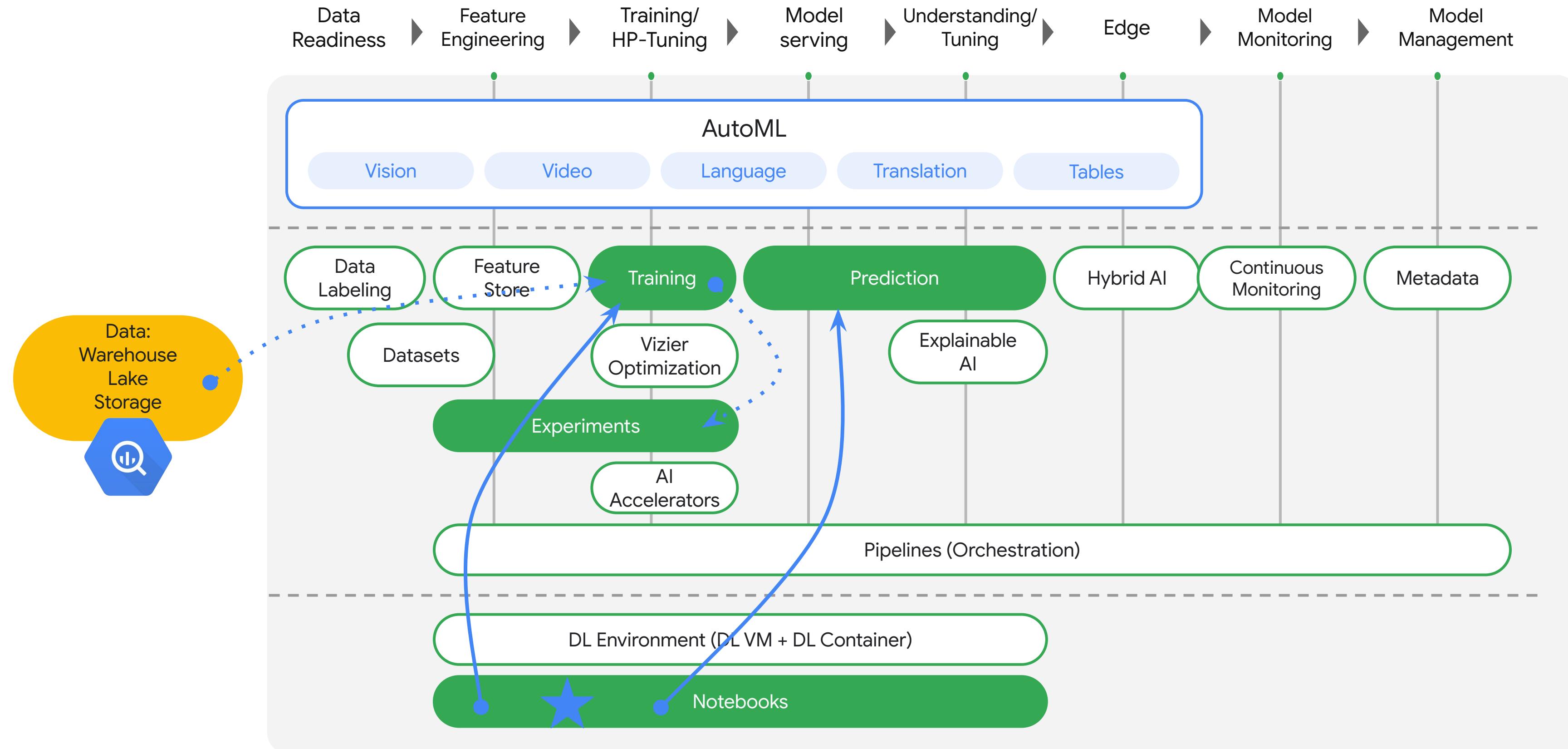
## Vertex AI

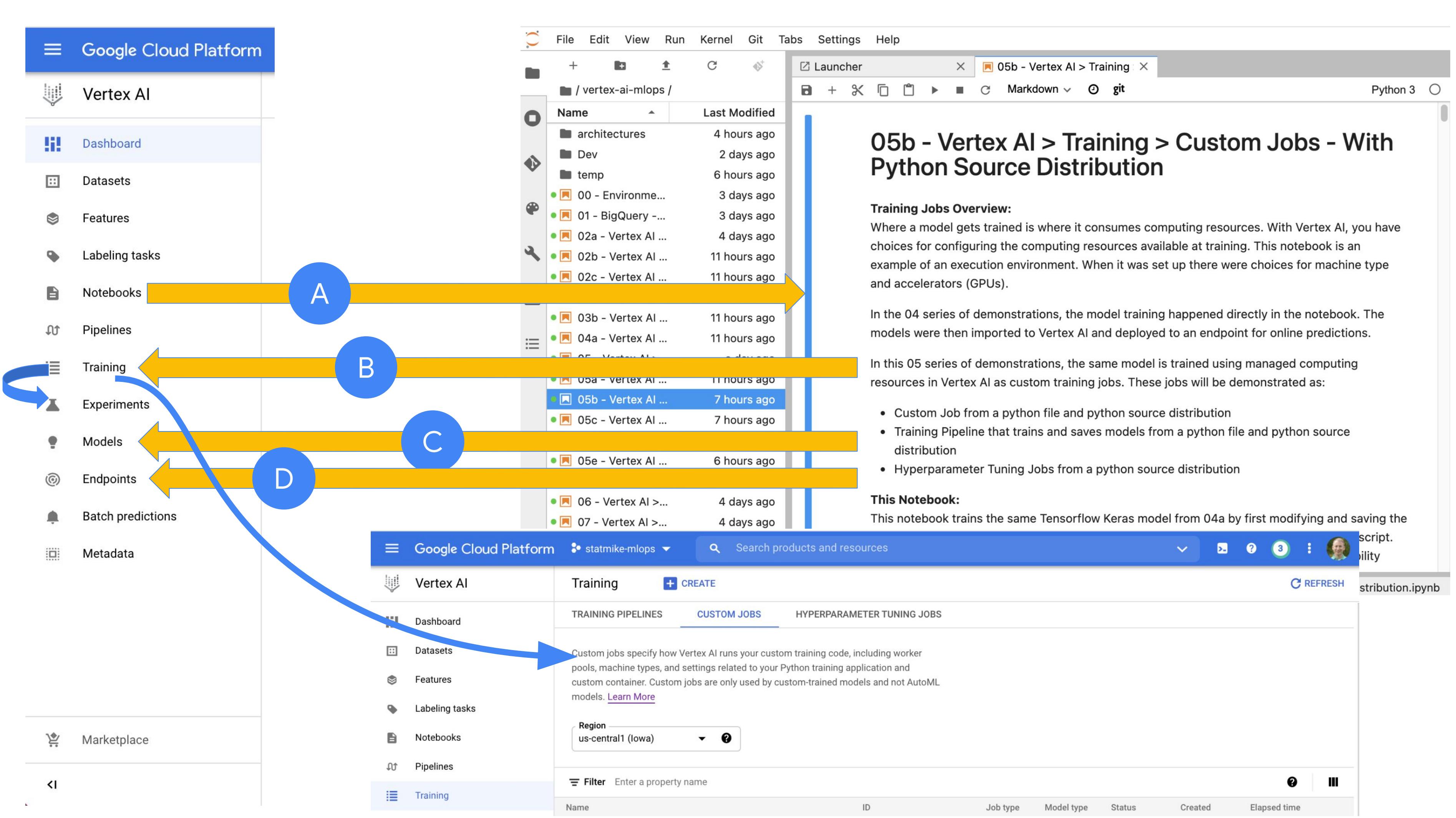


### Custom Job

With Python File

05b







# Custom Training



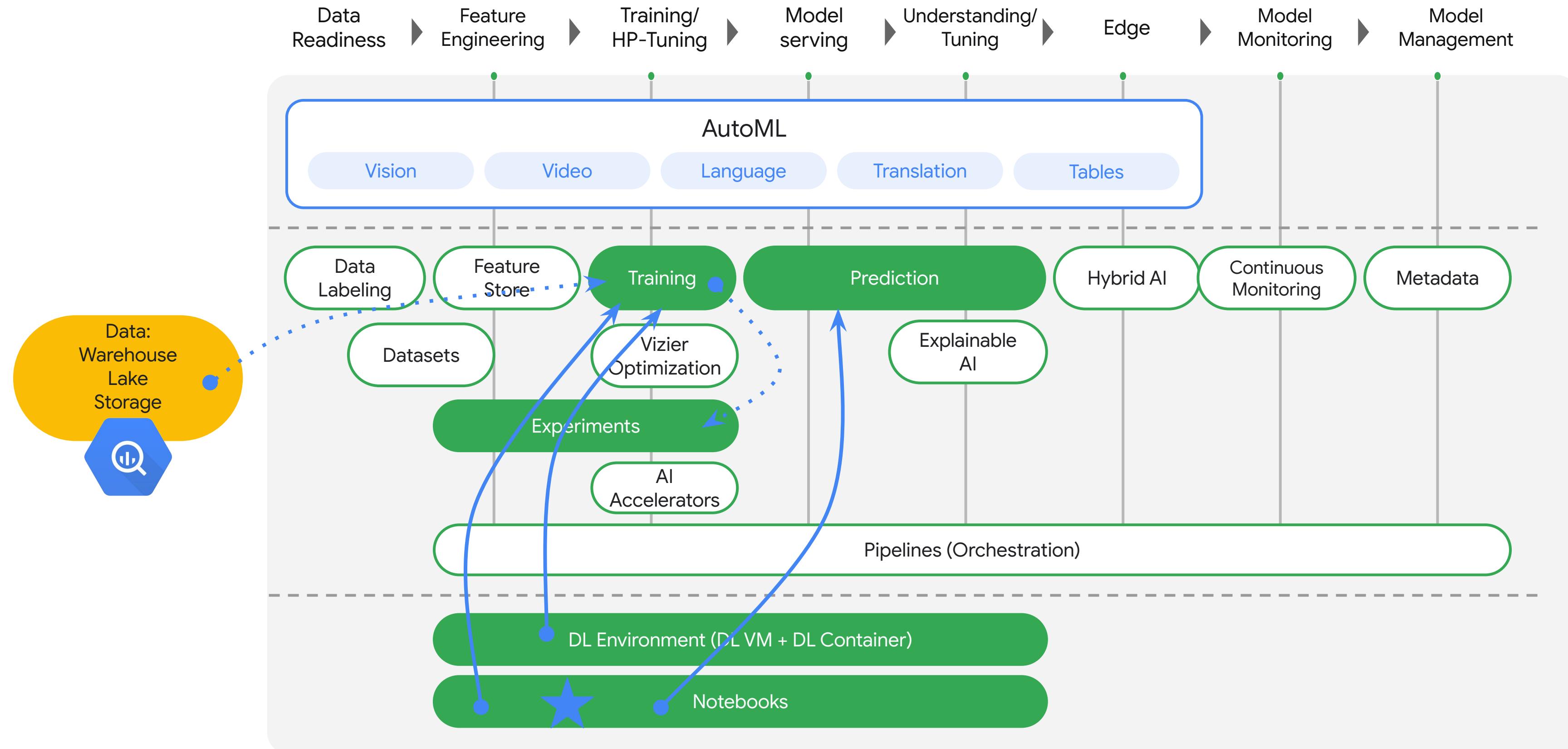
## Vertex AI

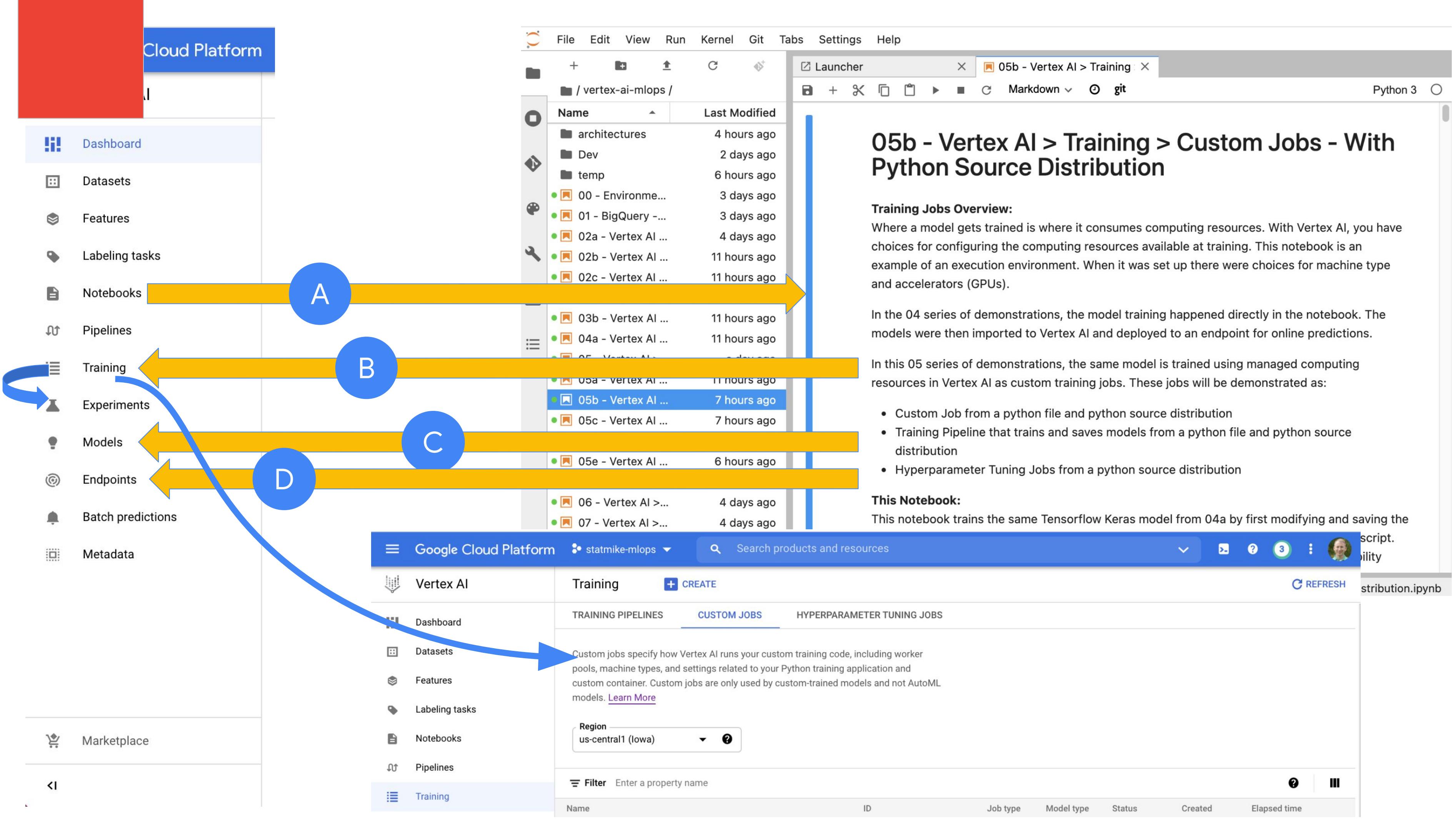


### Custom Job

With Python Source Distribution

05C



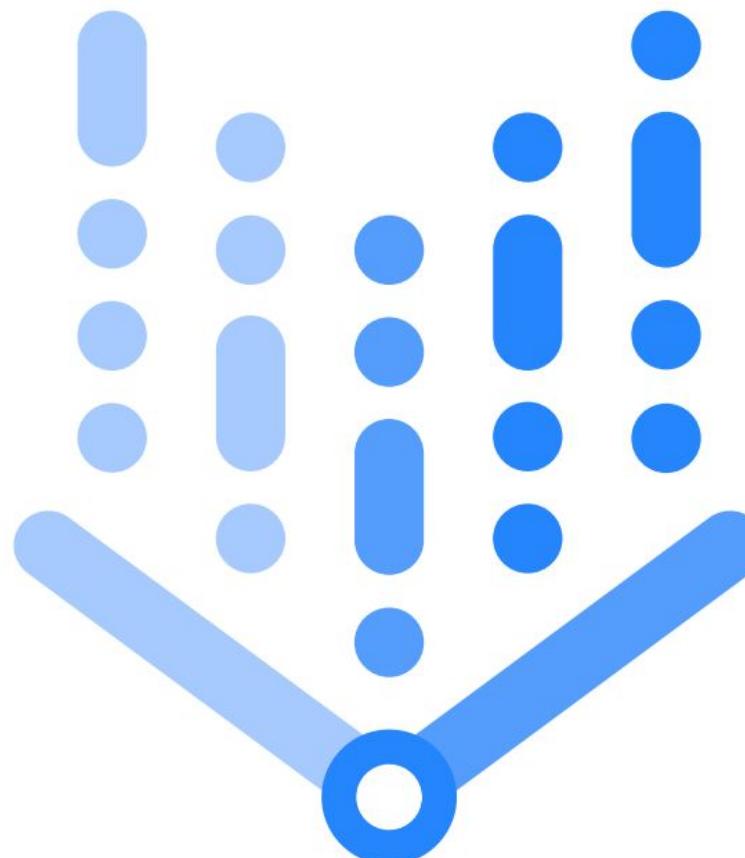




# Custom Training



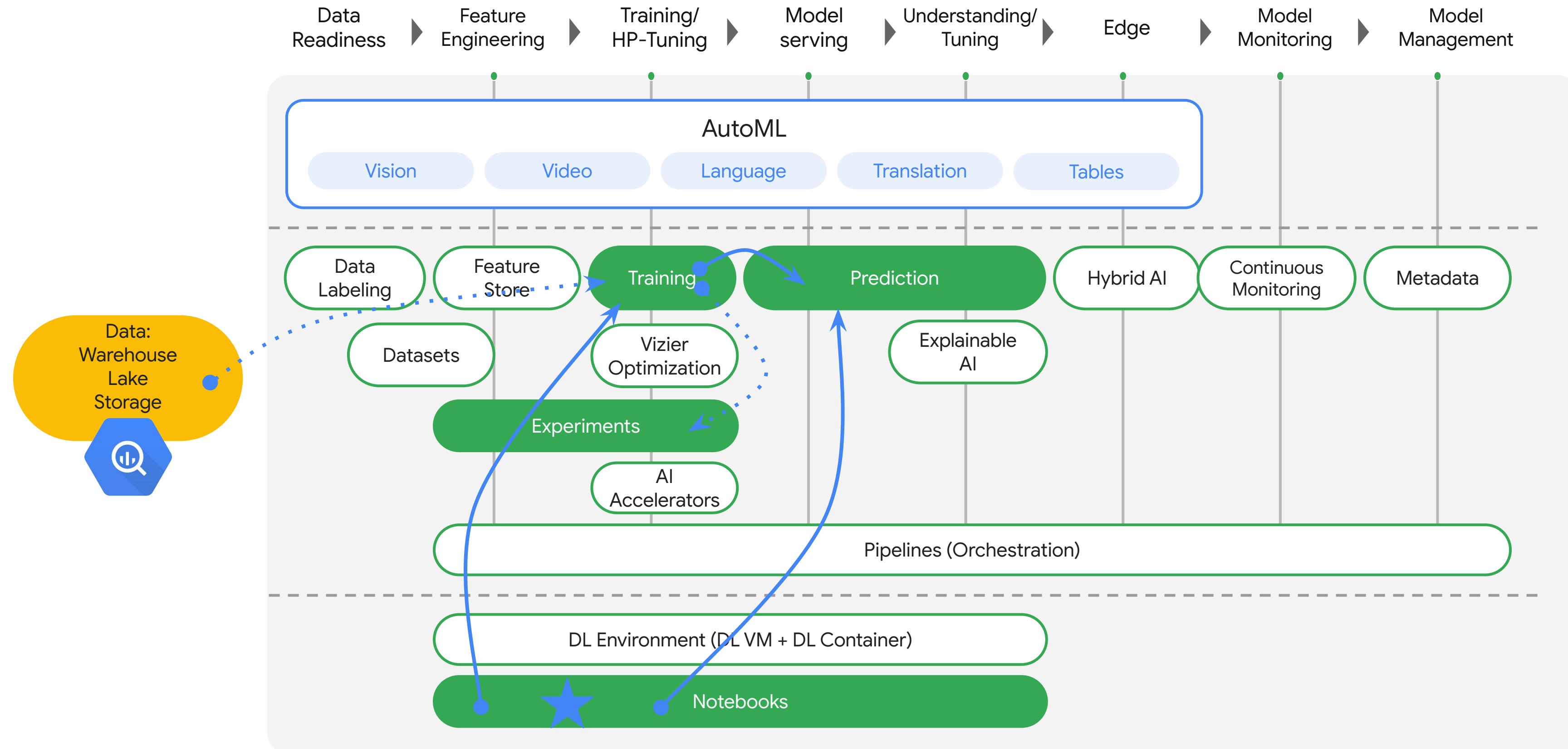
## Vertex AI

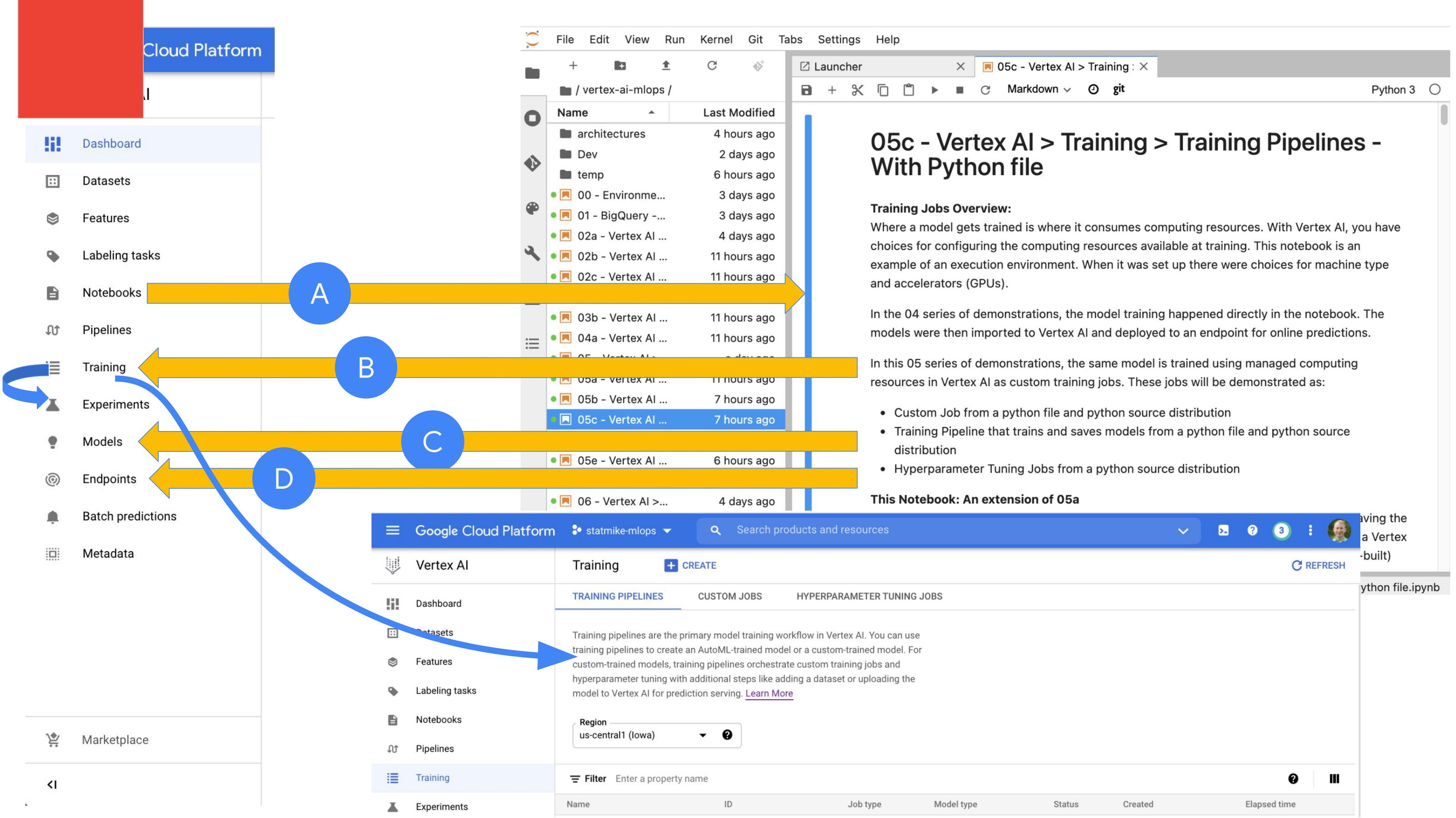


## Custom Job

With Custom Container

05d



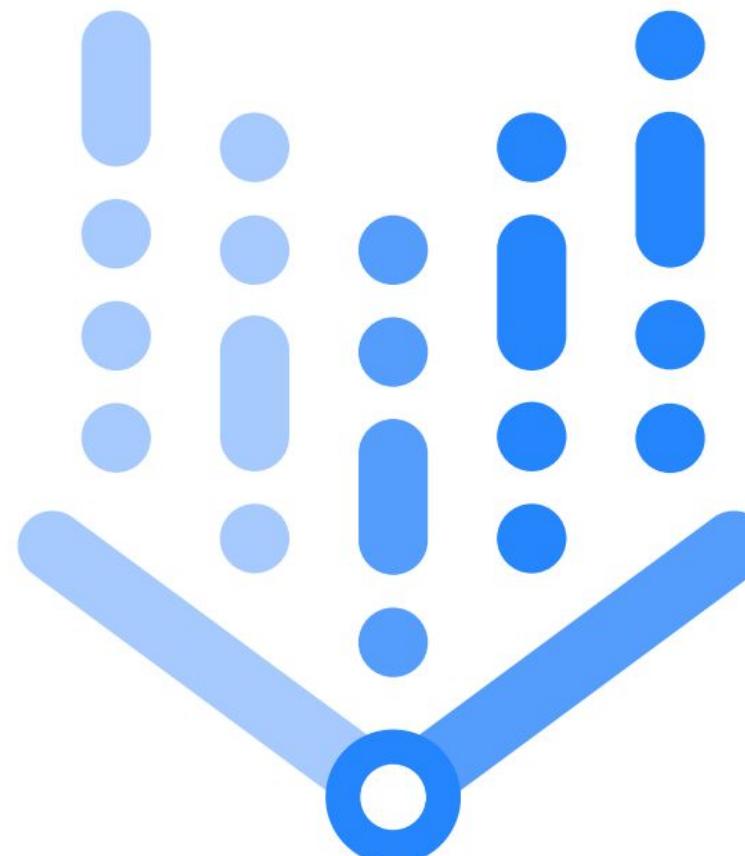




# Custom Training

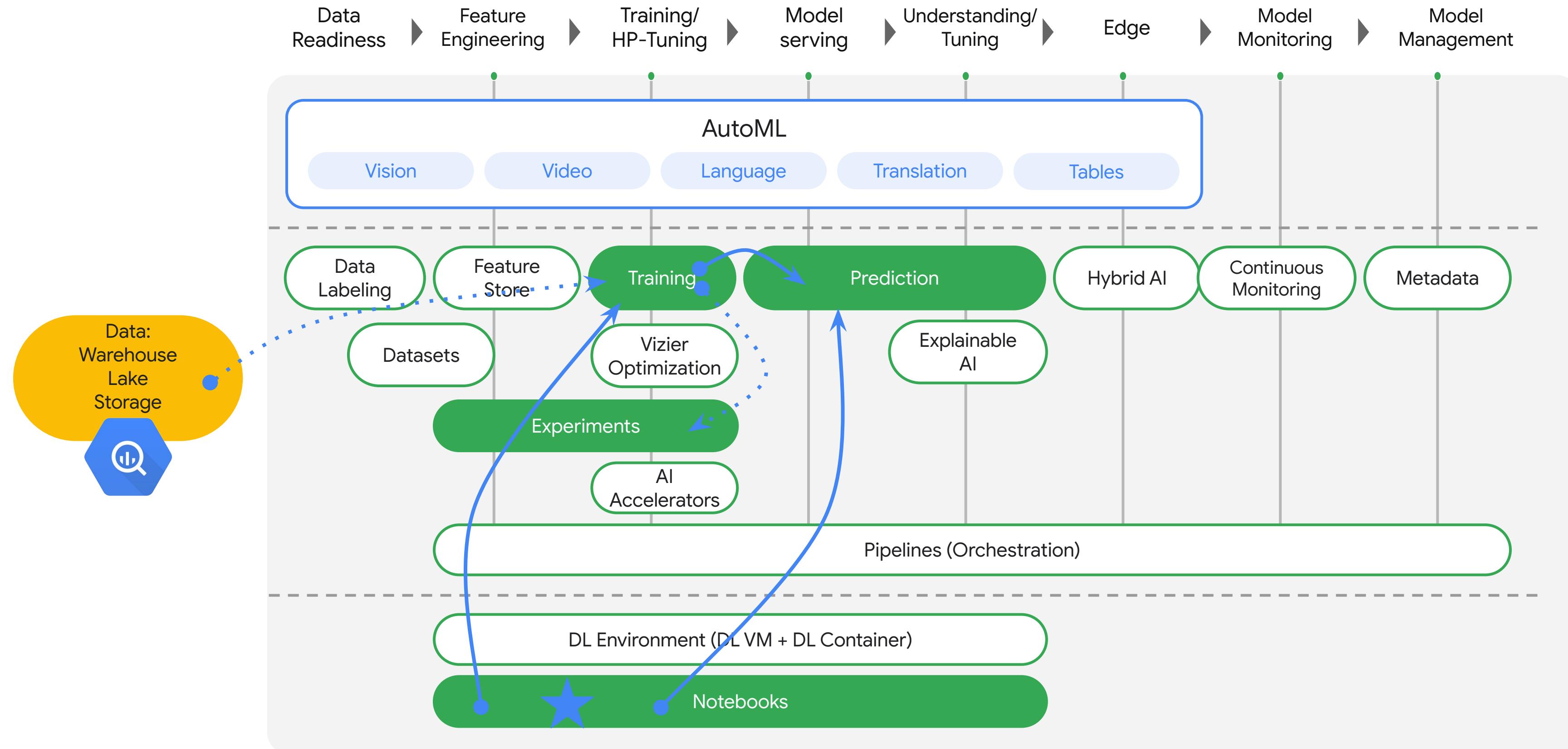


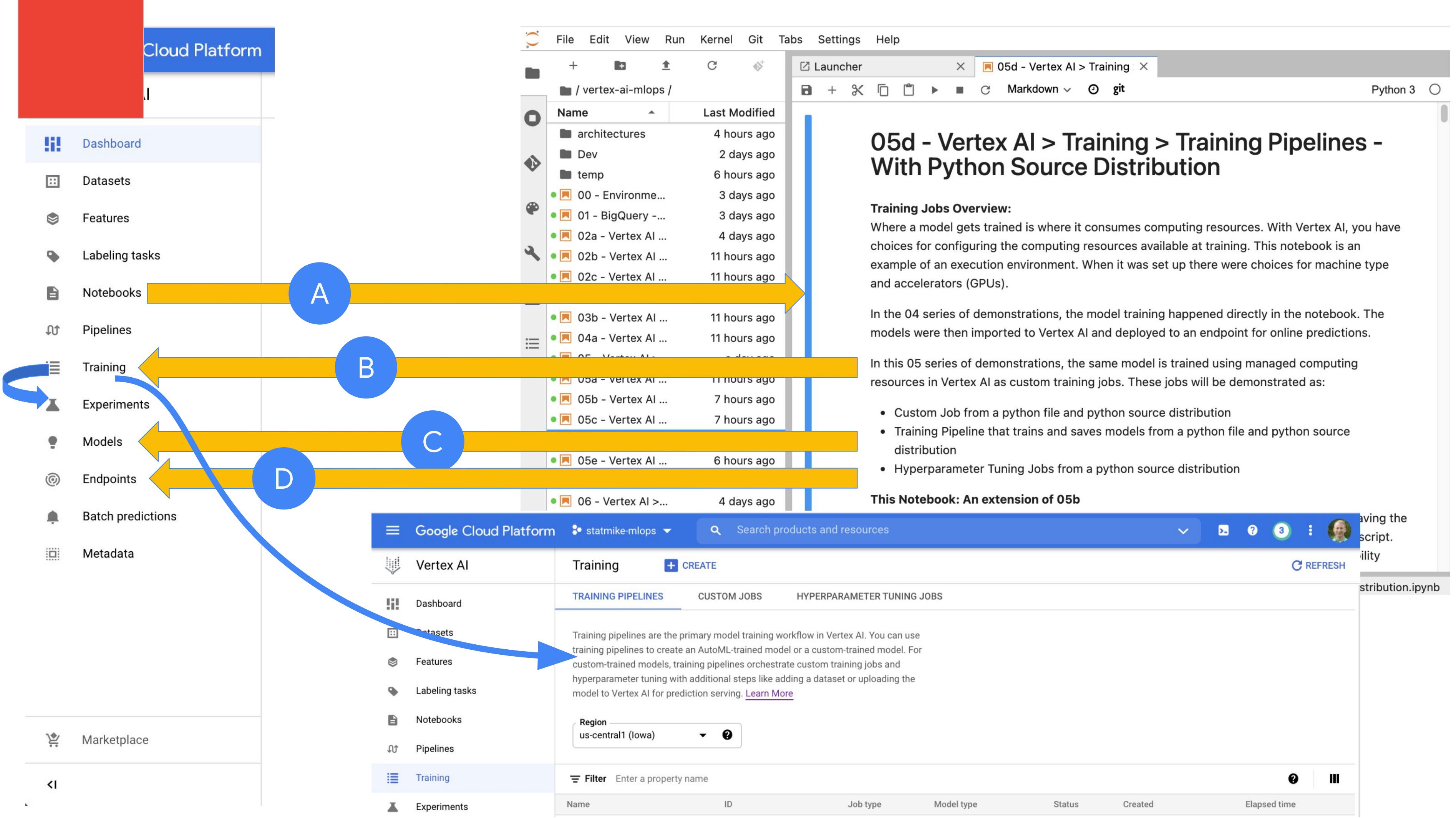
## Vertex AI



**Training Pipeline**  
**With Python File**

05e







# Custom Training

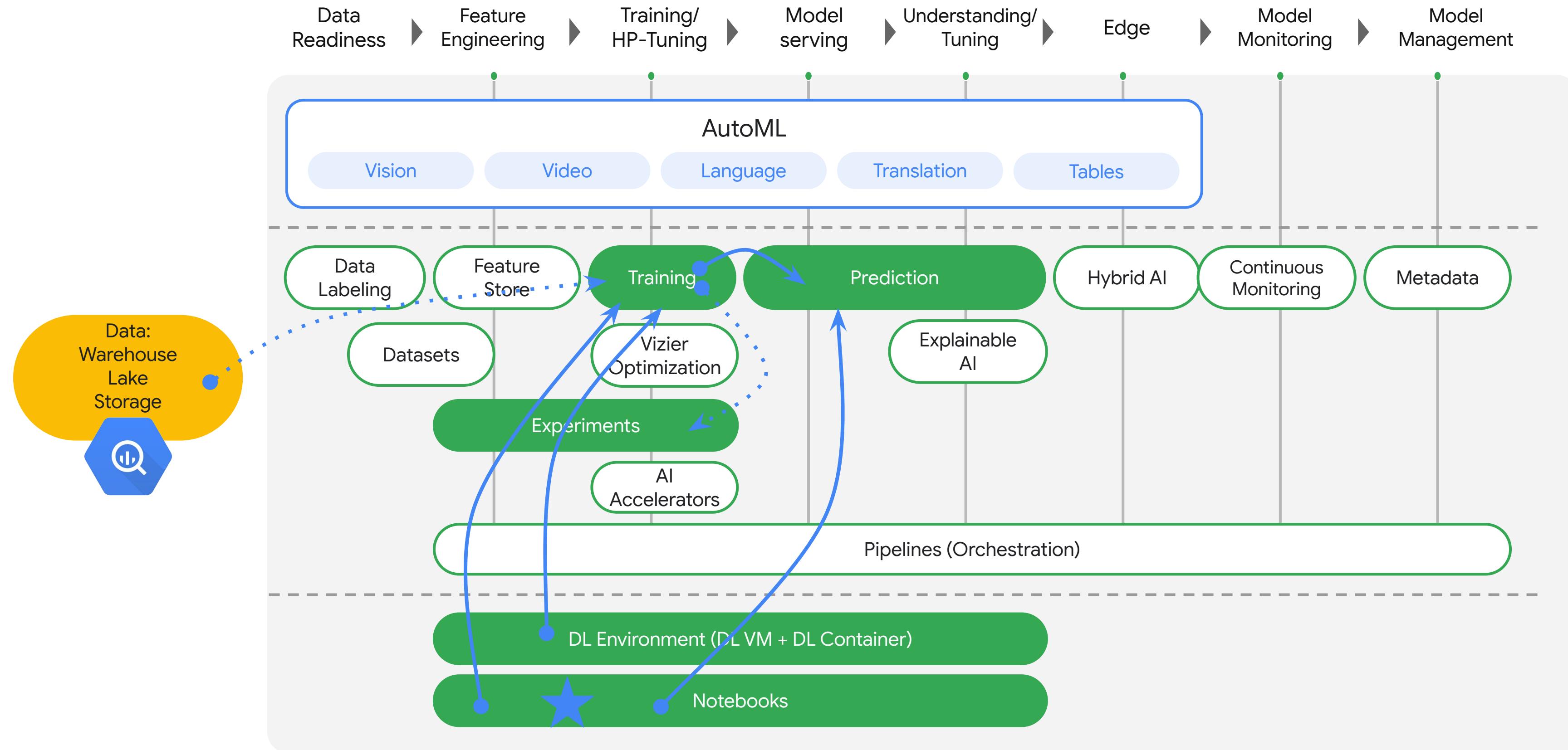


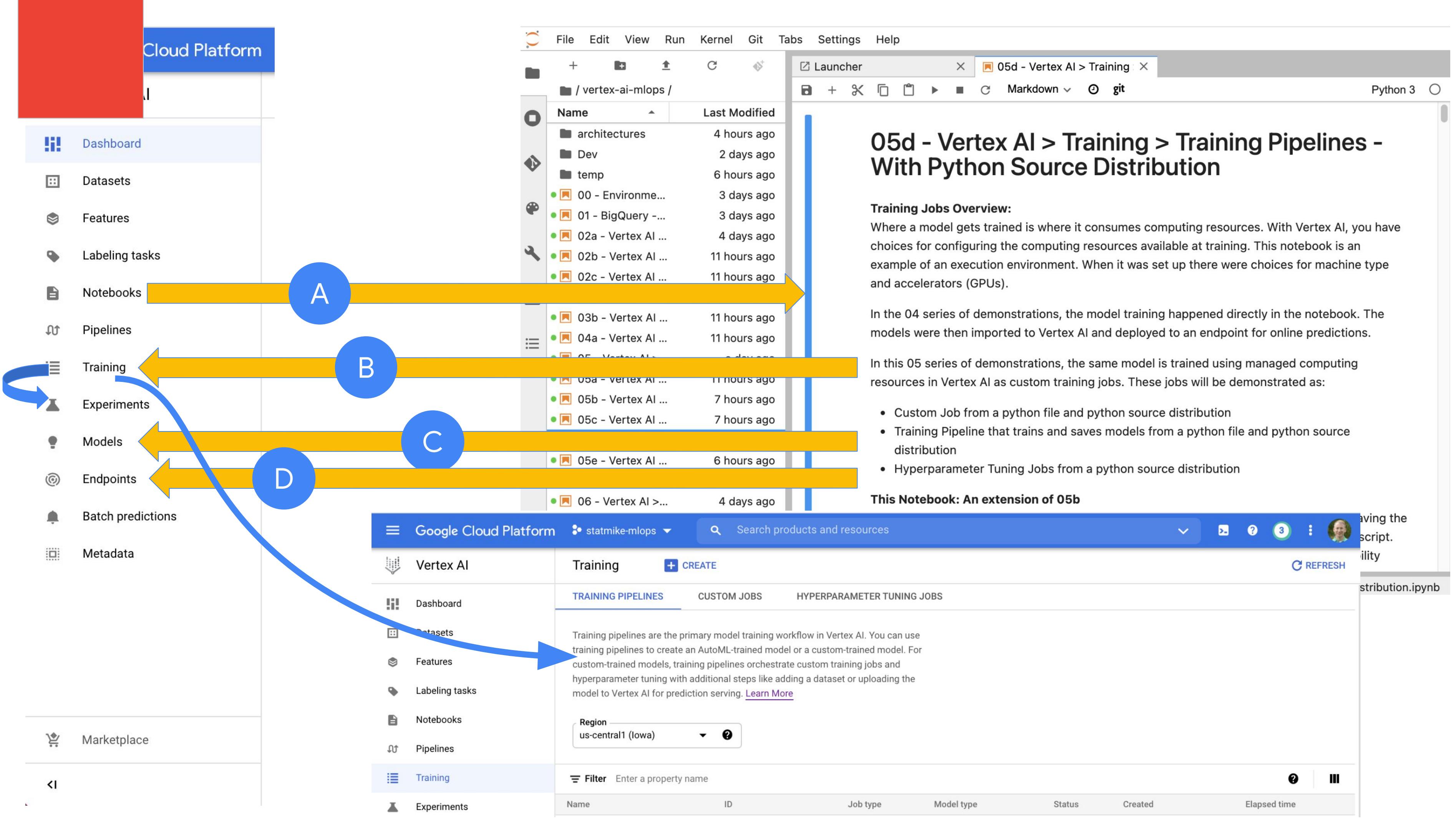
## Vertex AI



**Training Pipeline  
With Python Source Distribution**

05f



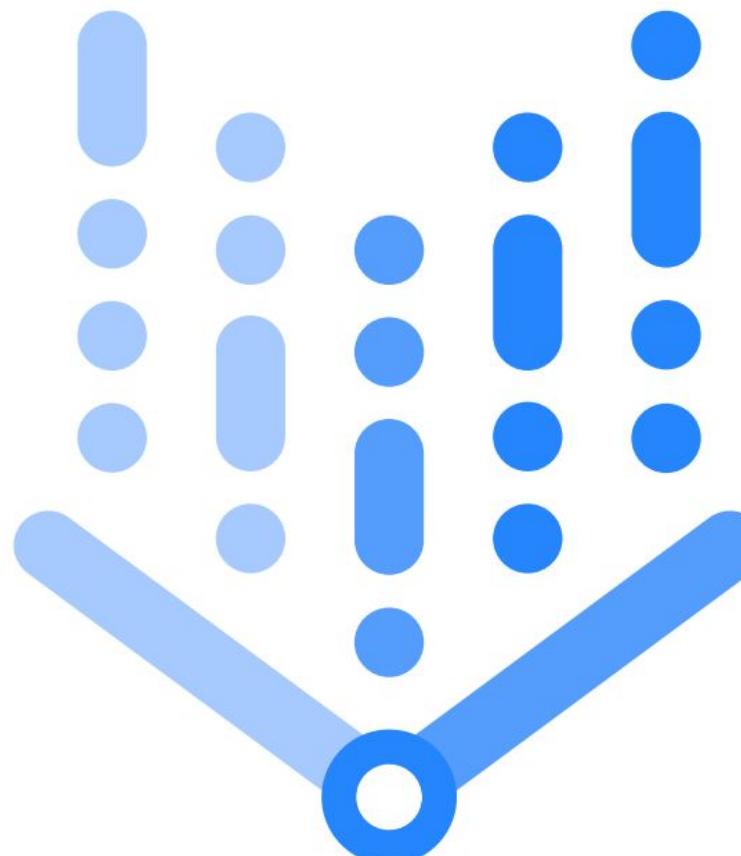




# Custom Training



## Vertex AI

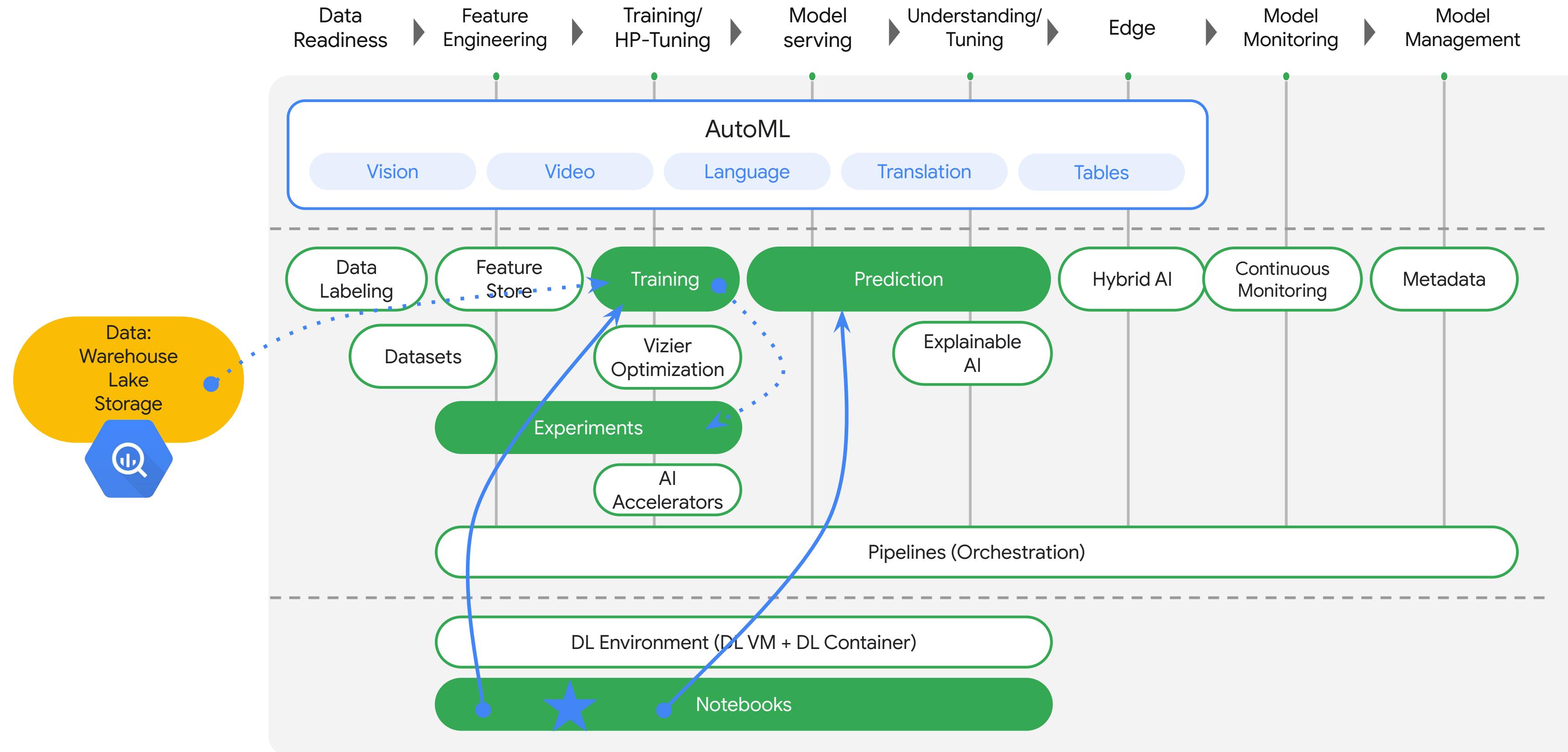


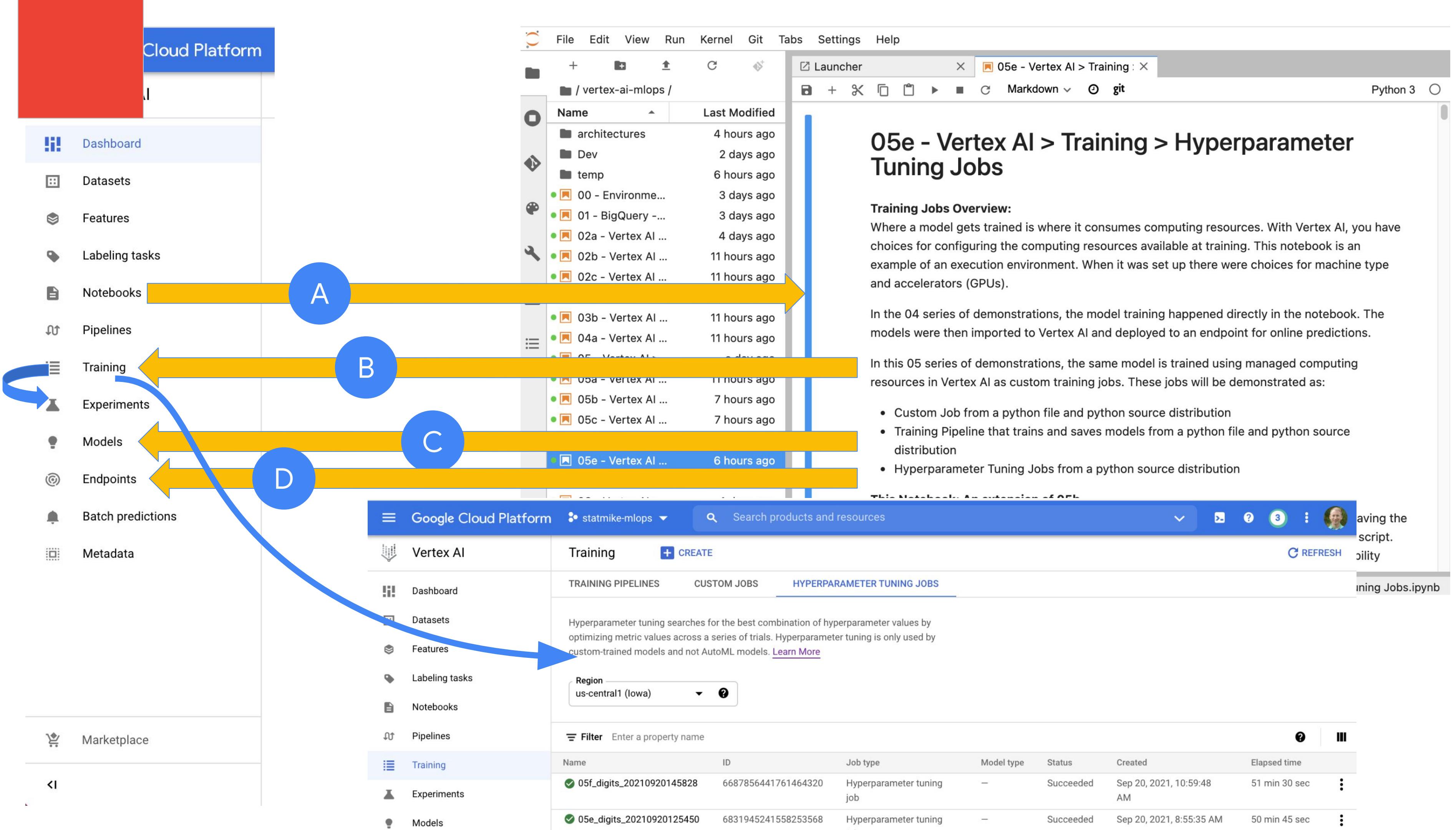
**Training Pipeline  
With Custom Container**

05g

## Notebook: 05g

# Vertex AI Overview







# Custom Training

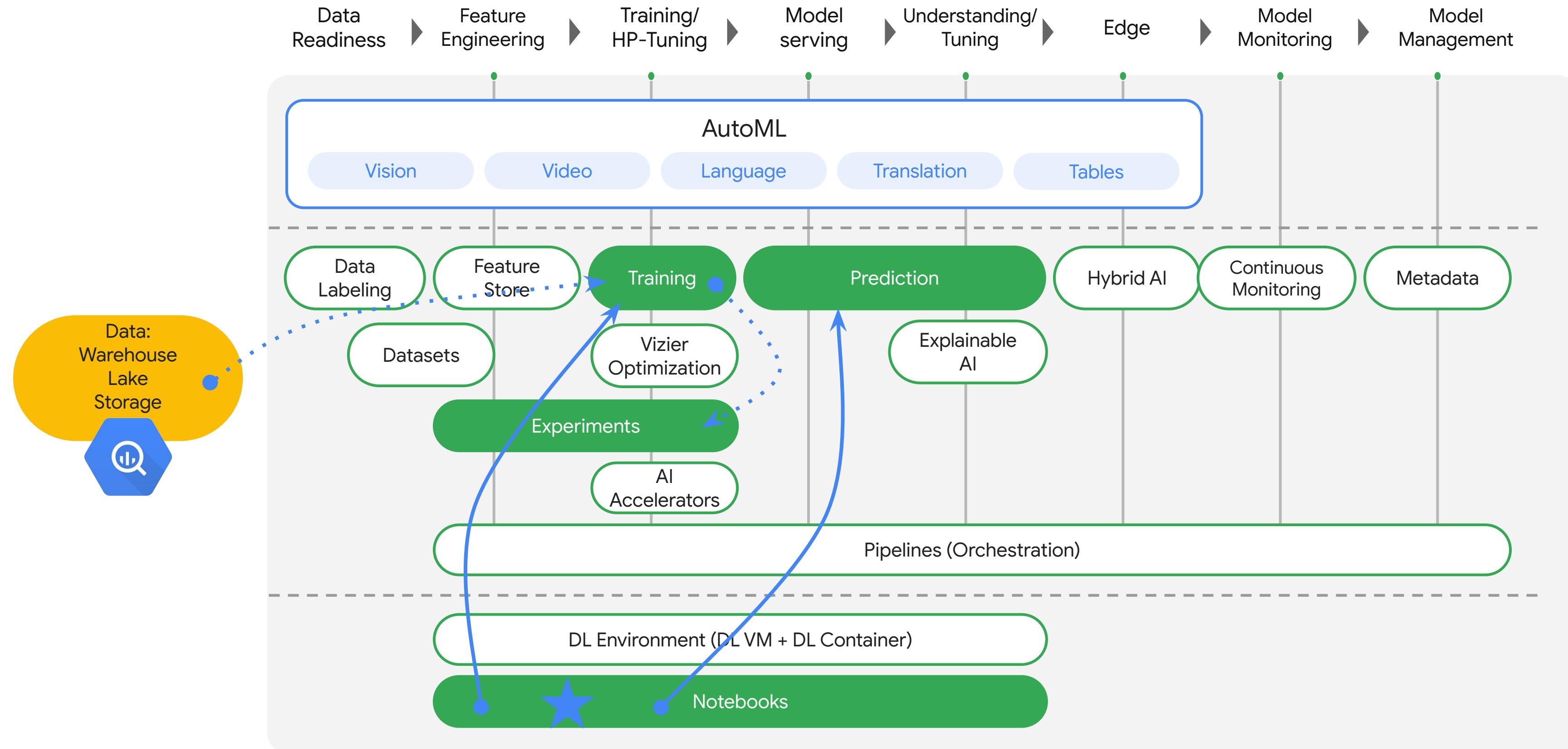


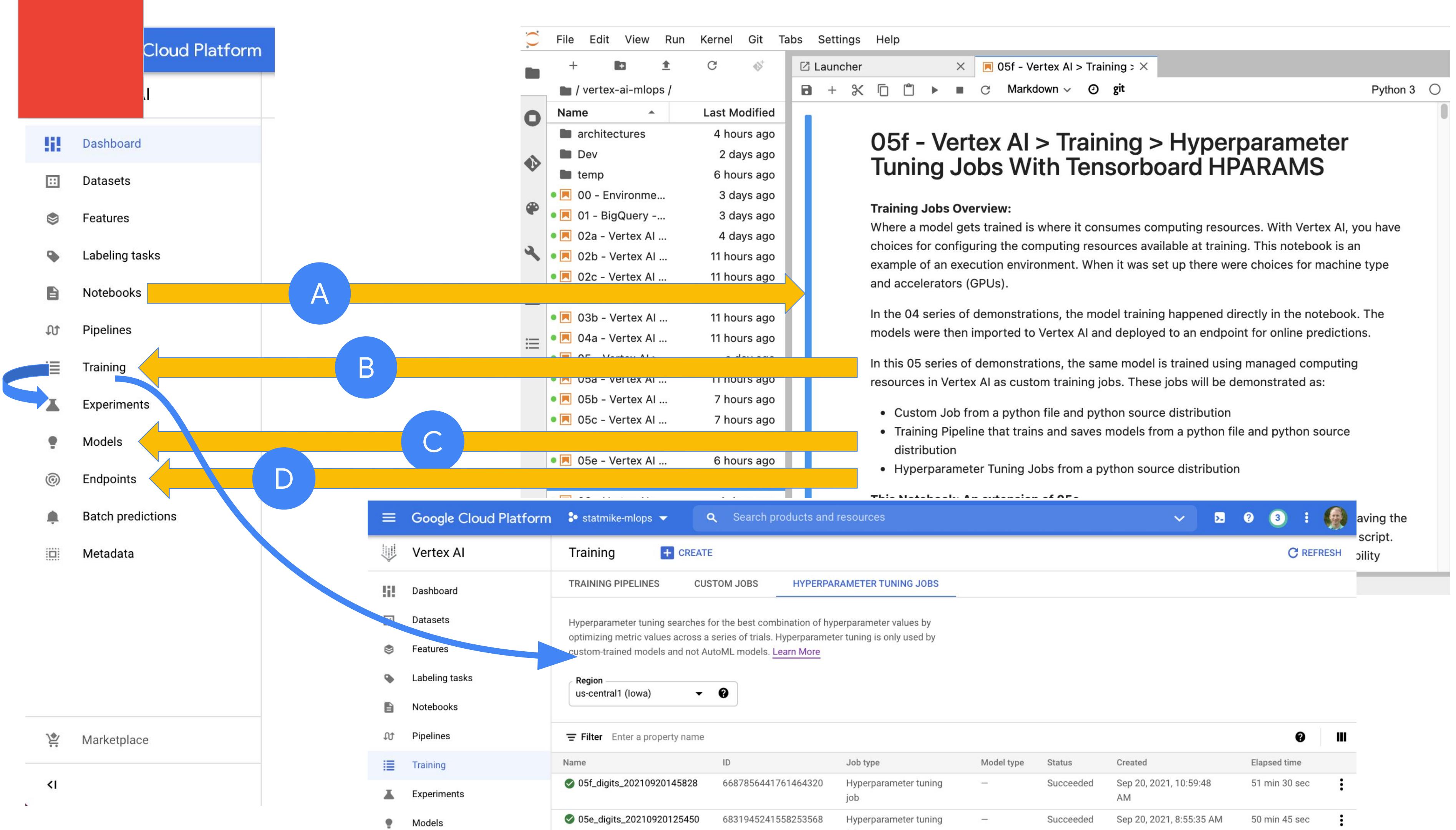
## Vertex AI



**Hyperparameter Tuning Job  
With Python File**

05h







# Custom Training

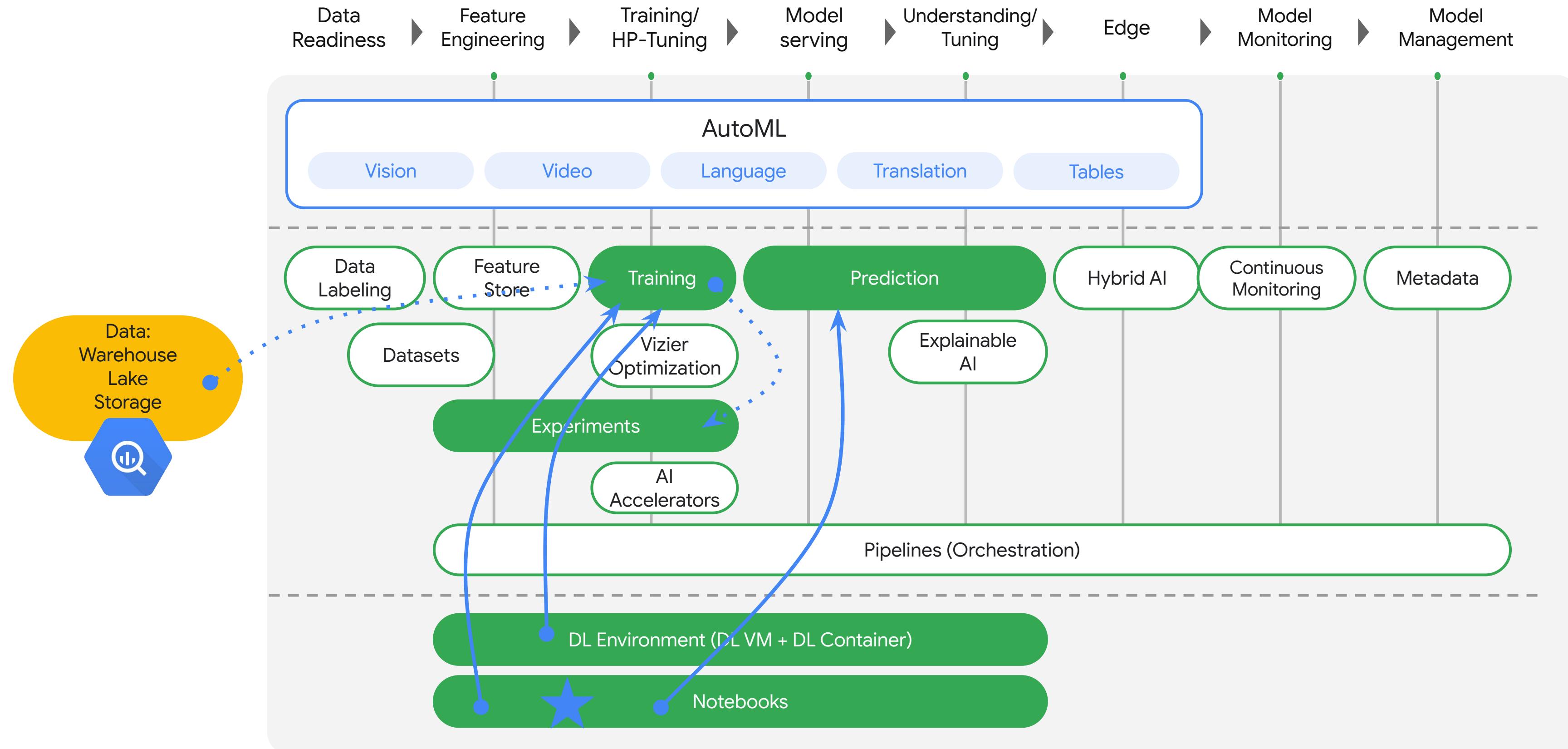


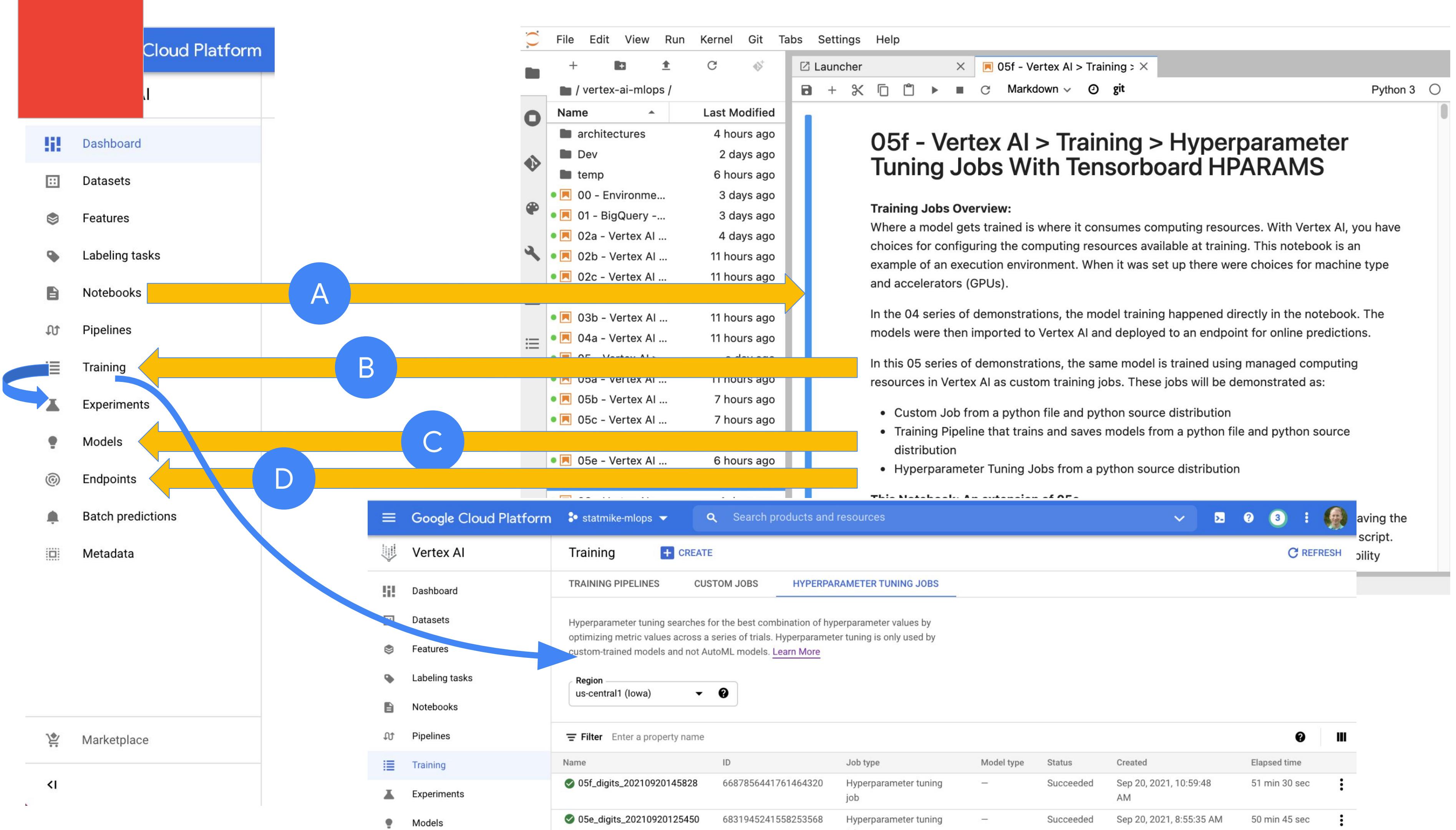
## Vertex AI



**Hyperparameter Tuning Job  
With Python Source Distribution**

05i







# Custom Training



## Vertex AI

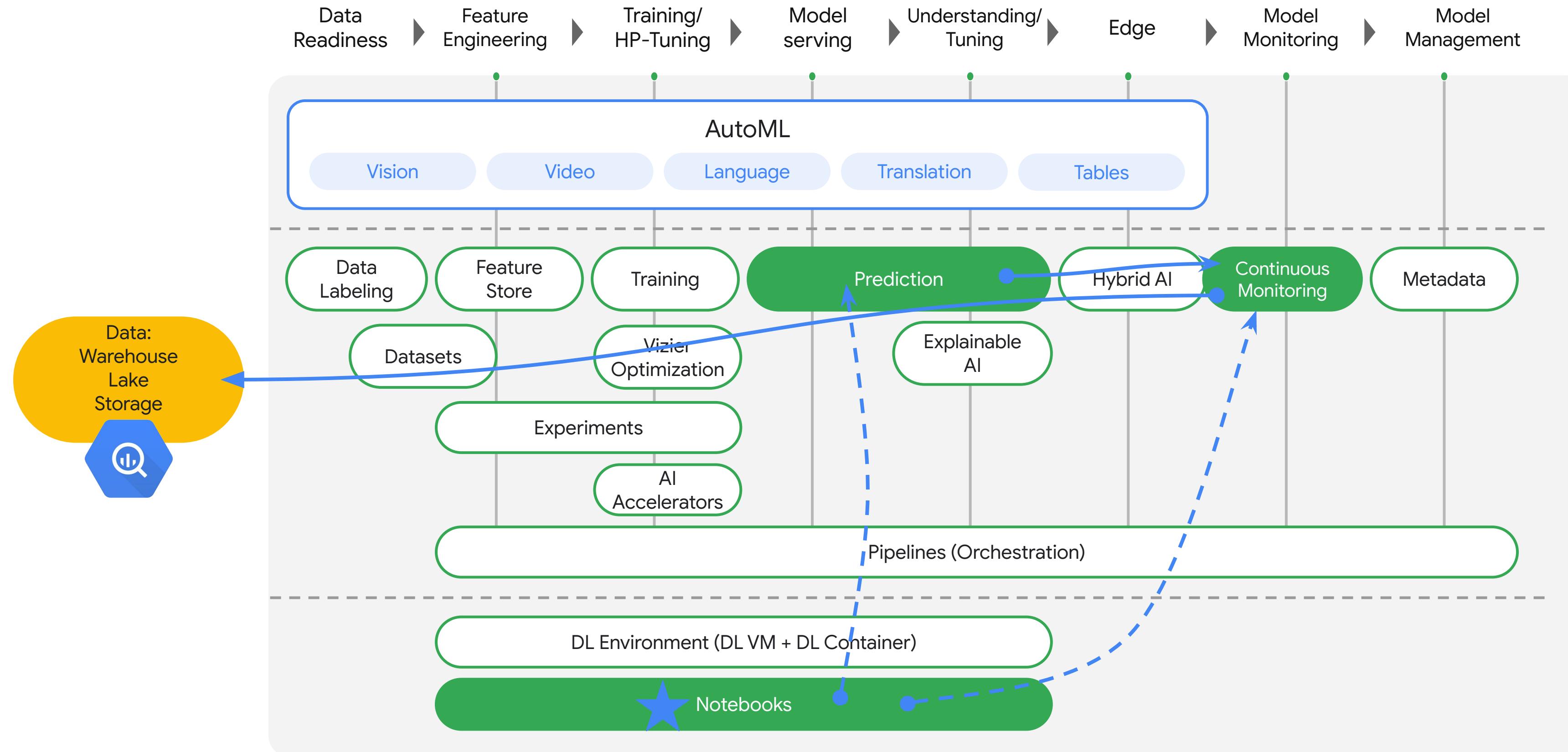


**Hyperparameter Tuning Job  
With Custom Container**

óá

## Notebook: 06a

# Vertex AI Overview



## Cloud Platform

Dashboard

Datasets

Features

Labeling tasks

Notebooks

Pipelines

Training

Experiments

Models

Endpoints

Batch predictions

Metadata

Marketplace

A

B

**04a - Vertex AI > Model Monitoring**

In other notebooks the end-to-end workflows include serving trained ML models on Vertex AI endpoints. In this notebook, an endpoint will be extended by enabling model monitoring. This enables continuous scheduled monitoring of selected model features for deviations:

- Training-serving skew: feature distribution is different from the feature distribution in the training data
- Prediction drift: feature distribution is different over time

The monitor... Google Cloud Platform statmike-demo3 Feature: Amount

Vertex AI 02a\_202215 METRICS ALERTS

- numerical
- categorical

Feature distribution ② Snapshot of distributions when job ran at Feb 25, 2022, 2:00:00 AM Anomaly detected during this job run. Distribution deviation value: 0.45. Anomaly detection threshold: 0.001. ?

Prerequisites

- 02a - Vertex AI
- or
- Pipelines

Latest prediction stats distribution Hover over the chart to view stats

Monitoring jobs (up to last 50)

Date
Feb 25, 2022, 2:00:00 AM
Feb 25, 2022, 1:00:00 AM
Feb 25, 2022, 12:00:00 PM
Feb 24, 2022, 10:00:00 PM
Feb 24, 2022, 9:00:00 PM
Feb 24, 2022, 8:00:00 PM
Feb 24, 2022, 7:00:00 PM
Feb 24, 2022, 6:00:00 PM
Feb 24, 2022, 4:00:00 PM
Feb 24, 2022, 3:00:00 PM

Overview

- Find Experiments
- Predictions
- Start Monitoring
- Set up monitoring
- Set up alerts

Model features Monitoring job runs every 1 hour

Filter Enter a project ID

Feature	Alert	Train
V25	Train	Train
V26	Train	Train
V27	Train	Train
V28	Train	Train

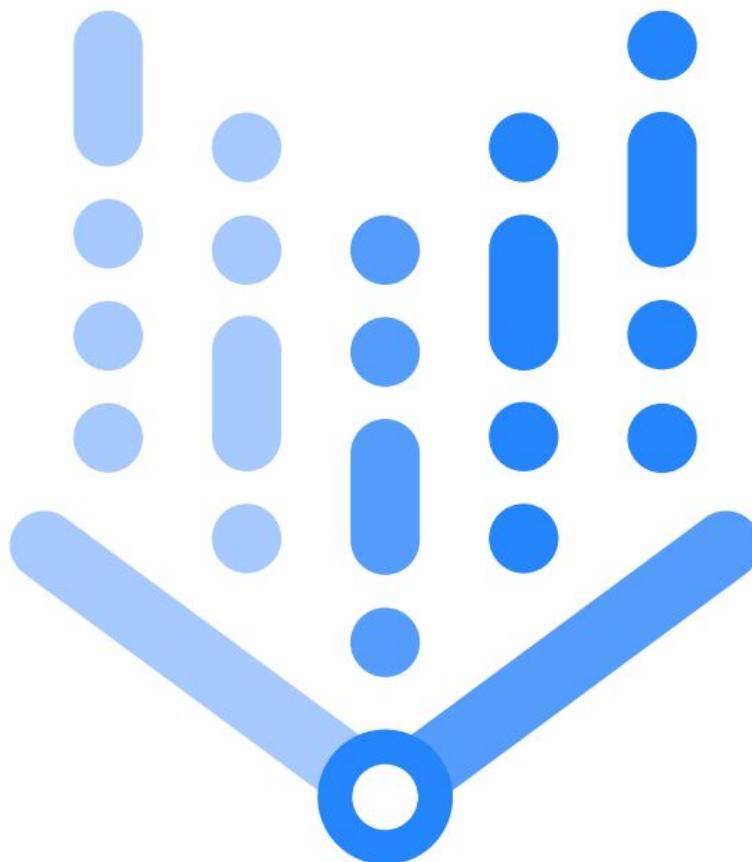
Training stats distribution

Feature	Alert	Prediction
V25	Prediction	Prediction
V26	Prediction	Prediction
V27	Prediction	Prediction
V28	Prediction	Prediction



# Continuous Monitoring

Vertex AI

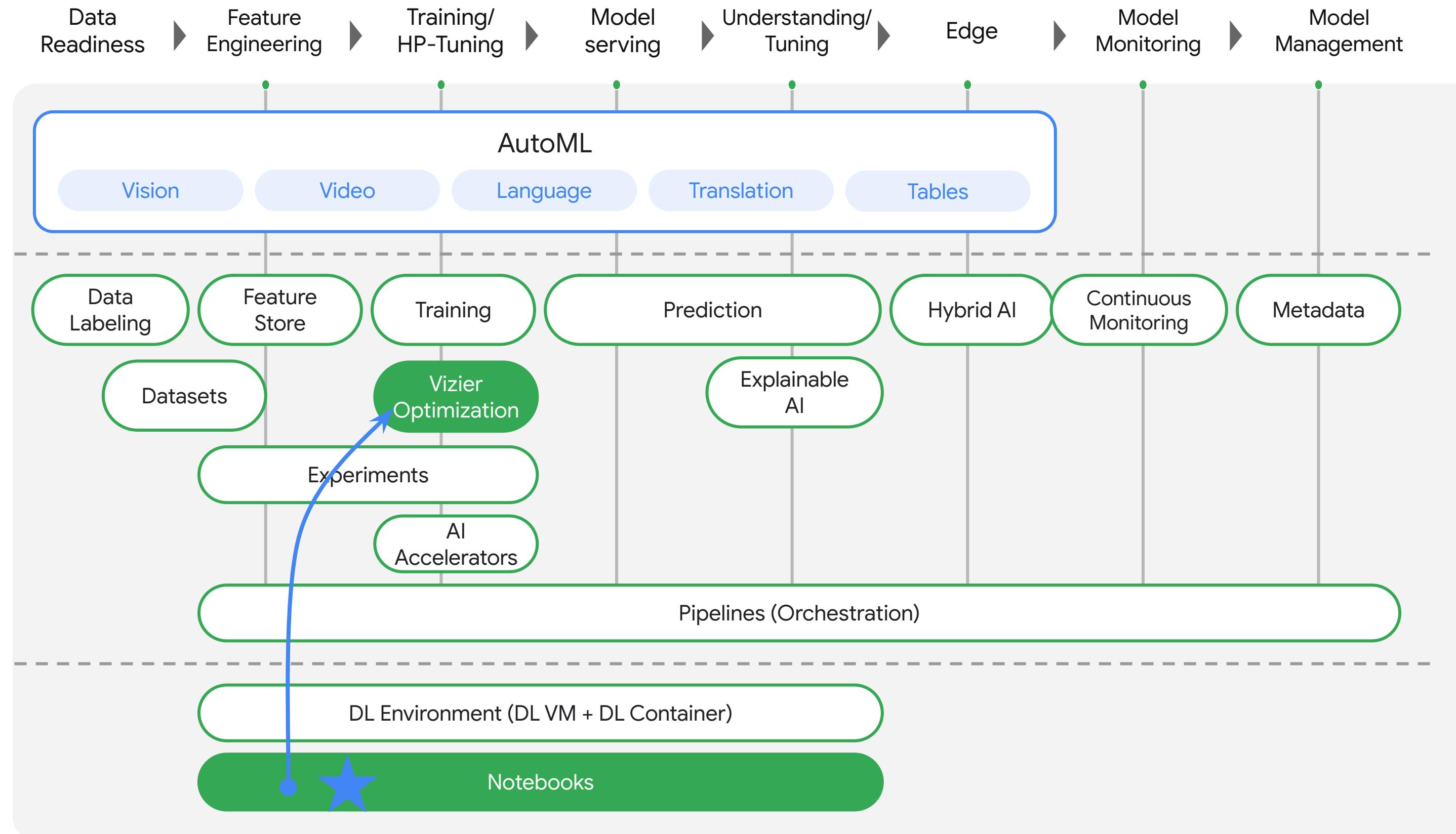


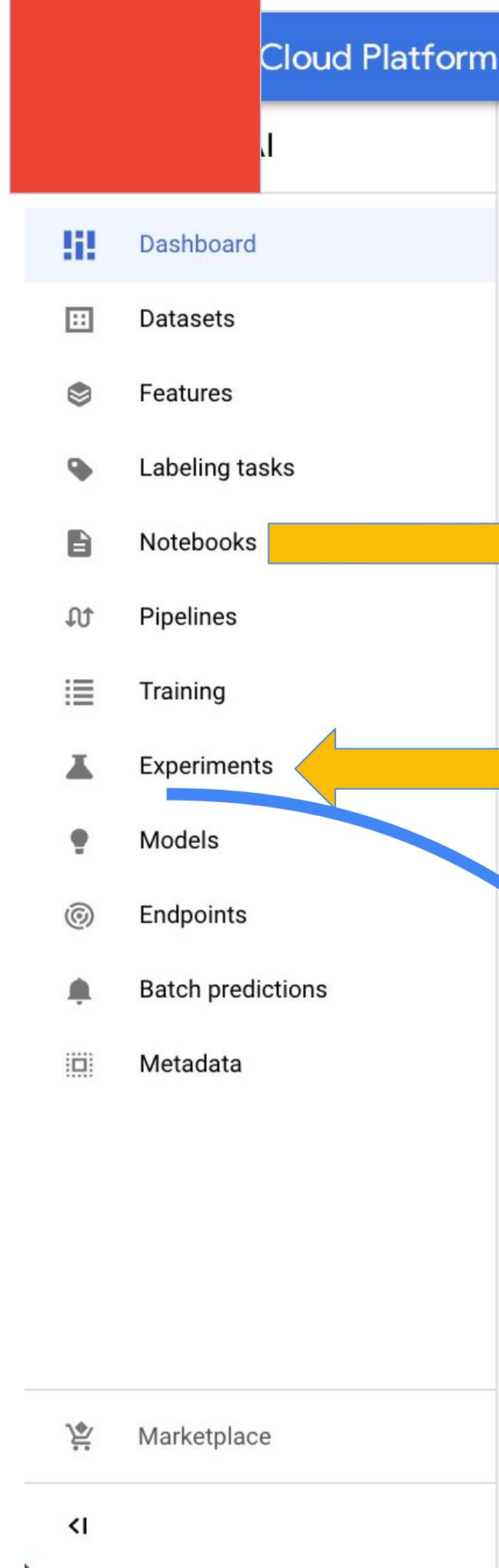
## Model Skew and Drift

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## Notebook: 10

# Vertex AI Overview





The screenshot shows a Jupyter Notebook interface with the following details:

- Title:** 06 - Vertex AI > Experiments > Studies - Vizier Optimization Service
- Code Cell:**

```
File Edit View Run Kernel Git Tabs Settings Help
+ + ⌂ C
/ vertex-ai-mlops /
Name Last Modified
architectures 4 hours ago
Dev 2 days ago
temp 6 hours ago
00 - Environme... 3 days ago
01 - BigQuery ... 3 days ago
02a - Vertex AI ... 4 days ago
02b - Vertex AI ... 12 hours ago
02c - Vertex AI ... 12 hours ago
03b - Vertex AI ... 11 hours ago
04a - Vertex AI ... 11 hours ago
05 - Vertex AI >... a day ago
05a - Vertex AI ... 11 hours ago
05c - Vertex AI ... 7 hours ago
05d - Vertex AI ... 7 hours ago
05e - Vertex AI ... 7 hours ago
```
- Output Cell:**

Vertex AI Vizier is an optimization service. It is used to optimize hyperparameters for machine learning models - called hyperparameter tuning. It can also optimize any system that can be evaluated. Even systems with multiple objectives.

In this demonstration, multiple objectives are set and the Vizier service is used to conduct a random search and a default search (Bayesian Optimization) for comparison.

To see an example of hyperparameter tuning see notebook 05e or 05f. Those notebooks use the `aiplatform.HyperparameterTuningJob()` to manage the process rather than interacting with the Vertex AI Vizier service directly. Also see [this example](#).
- Prerequisites:**
  - None
- Overview:**
  - None
- Google Cloud Platform Vertex AI Studies Page:**

EXPERIMENTS PREVIEW STUDIES PREVIEW TENSORBOARD INSTANCES PREVIEW

Studies

Region: us-central1 (Iowa)

Study name	ID	Objective	Created
Study_06_Bayesian_Optimization	4214226082825	Minimize "blue" and Maximize "green"	Sep 16, 2021, 11:51:29 AM
Study_06_Random	639592116037	Minimize "blue" and Maximize "green"	Sep 16, 2021, 11:44:46 AM



# Vertex AI

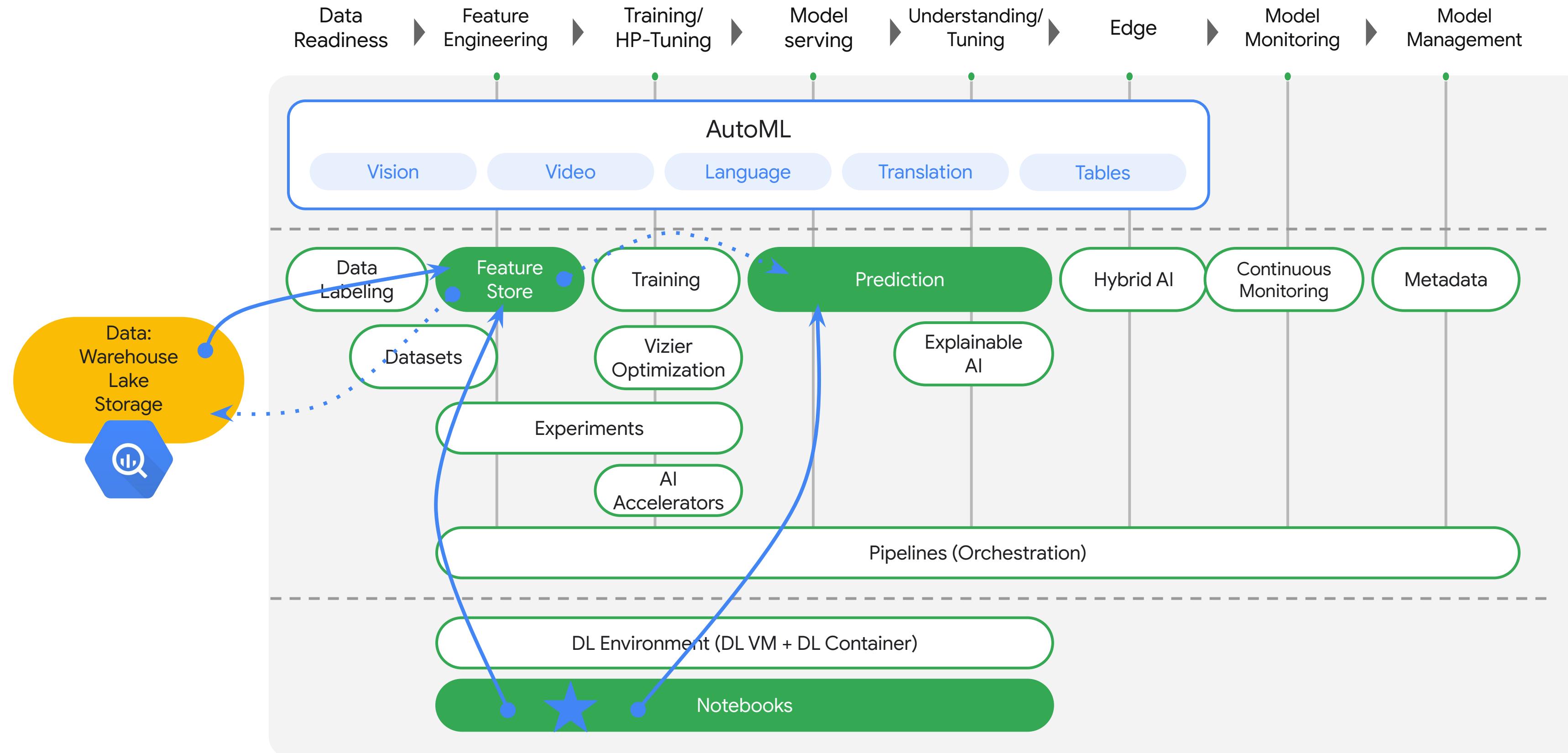


## Vizier Optimization Service

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## Notebook: 11

# Vertex AI Overview



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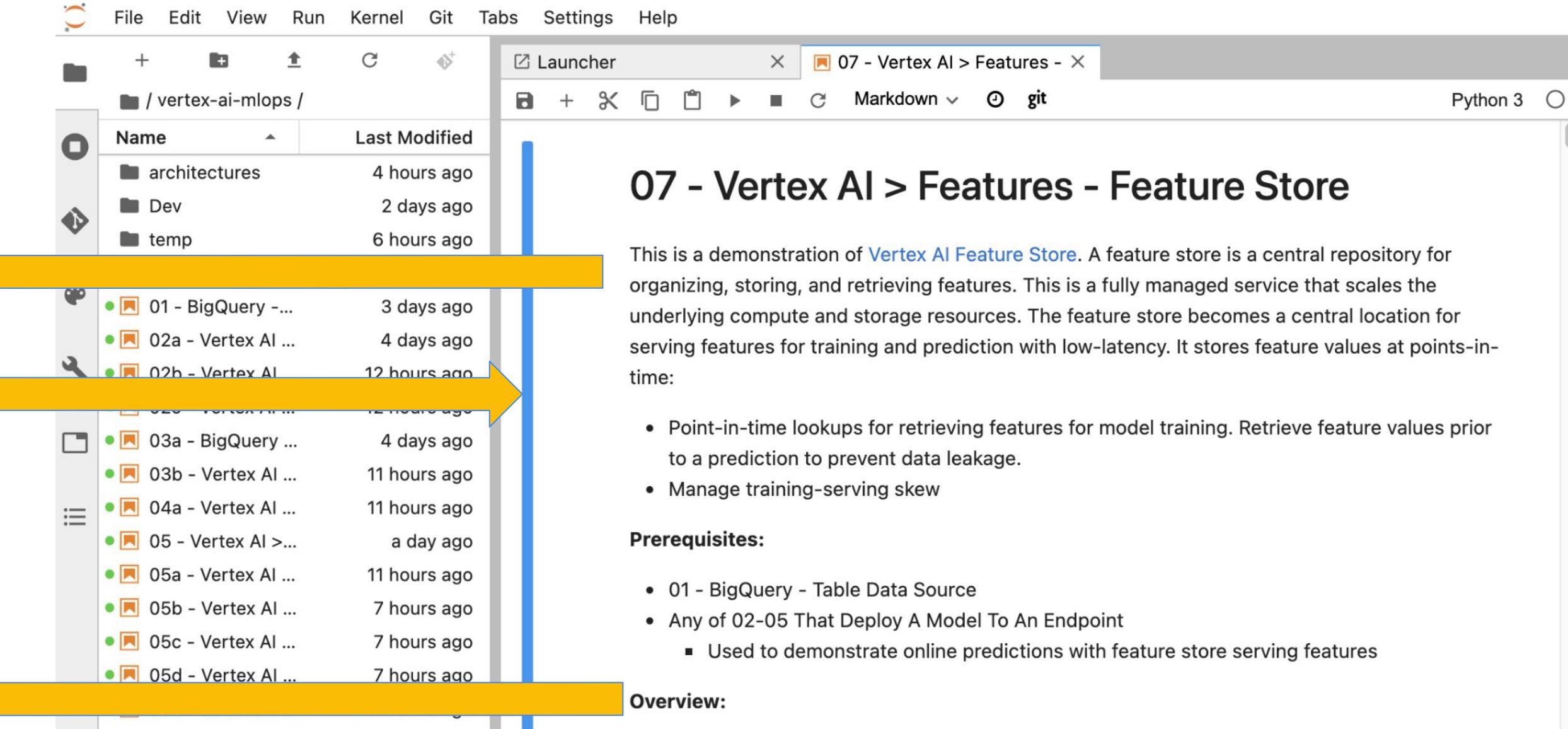
Metadata

Marketplace

B

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C



Google Cloud Platform statmike-mlops Search products and resources

FEATURES & INFO SHORTCUT DISABLE EDITOR TABS

Editor DIGITS DIGITS\_LR DIGITS\_F... COMPOSE NEW QUERY

Explorer + ADD DATA digits\_fs\_training

Type to search

Viewing pinned projects.

statmike-mlops digits Models (1) digits\_lr digits digits\_featurestore\_import digits\_prepended digits\_fs\_training

Row	timestamp	entity_type_drawing	target	p0	p32	p16	p48	p8	p40	p24	p56	p4	p36	p20	p52	p12
1701	2021-09-14 21:04:52 UTC	a0c826c2-520d-46c1-aaef-461277eda3fa	6	0.0	0.0	0.0	0.0	0.0	0.0	0.0	15.0	16.0	2.0	6.0	11.0	
1702	2021-09-14 21:04:52 UTC	226aaaf8b-d8ff-43c7-89ca-b289f4fa7f12	6	0.0	0.0	0.0	0.0	0.0	0.0	0.0	15.0	16.0	0.0	1.0	8.0	
1703	2021-09-14 21:04:52 UTC	eefdf8f1f-3d1d-420c-a434-67cb01a6b8c0	6	0.0	0.0	0.0	0.0	0.0	0.0	0.0	16.0	16.0	0.0	8.0	10.0	
1704	2021-09-14 21:04:52 UTC	40e40f54-7f9d-4ad1-a68b-3e7723008894	8	0.0	0.0	0.0	0.0	0.0	0.0	0.0	15.0	16.0	0.0	8.0	4.0	
1705	2021-09-14 21:04:52 UTC	a7cd4041-fde9-4146-b1cc-299ea383545e	8	0.0	0.0	0.0	0.0	0.0	0.0	0.0	16.0	14.0	7.0	4.0	5.0	
1706	2021-09-14 21:04:52 UTC	c4e06400-bdad-4267-85e7-d1eb5d24d1f5	8	0.0	0.0	0.0	0.0	0.0	0.0	0.0	14.0	15.0	1.0	4.0	10.0	
1707	2021-09-14 21:04:52 UTC	cbfb03781-98be-4fbe-9d5c-bc8d71fcf9a1	8	0.0	0.0	0.0	0.0	0.0	0.0	0.0	11.0	16.0	0.0	0.0	12.0	
1708	2021-09-14 21:04:52 UTC	f6aab929-cc5b-407d-87a4-10a503df4d0b	8	0.0	0.0	0.0	0.0	0.0	0.0	0.0	14.0	14.0	4.0	1.0	5.0	



# Vertex AI



## Feature Store