

# Introduction to Watson Studio

Power of Data. Simplicity of Design. Speed of Innovation

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Healthcare Executive Architect



IBM

IBM



# The AI Ladder

A prescriptive approach to accelerating the journey to AI



AI

**INFUSE** – decision making ,bias detection, explainability, decision audits

**INFUSE** – Operationalize AI with trust and transparency

**ANALYZE** – Build, test, deploy and manage AI models

**ORGANIZE** - Create a trusted analytics foundation

**COLLECT** - Make data simple and accessible

Data of every type,  
regardless of where it lives



**MODERNIZE**

your data estate for an  
AI and multicloud world

**You can't do AI without Machine Learning**

**You can't do Machine Learning without Analytics**

**And you can't do Analytics without the right data architecture!**

**You need a platform for data management**

**You need a platform for unified data governance & integration**

**You need a platform for data science and business analytics**



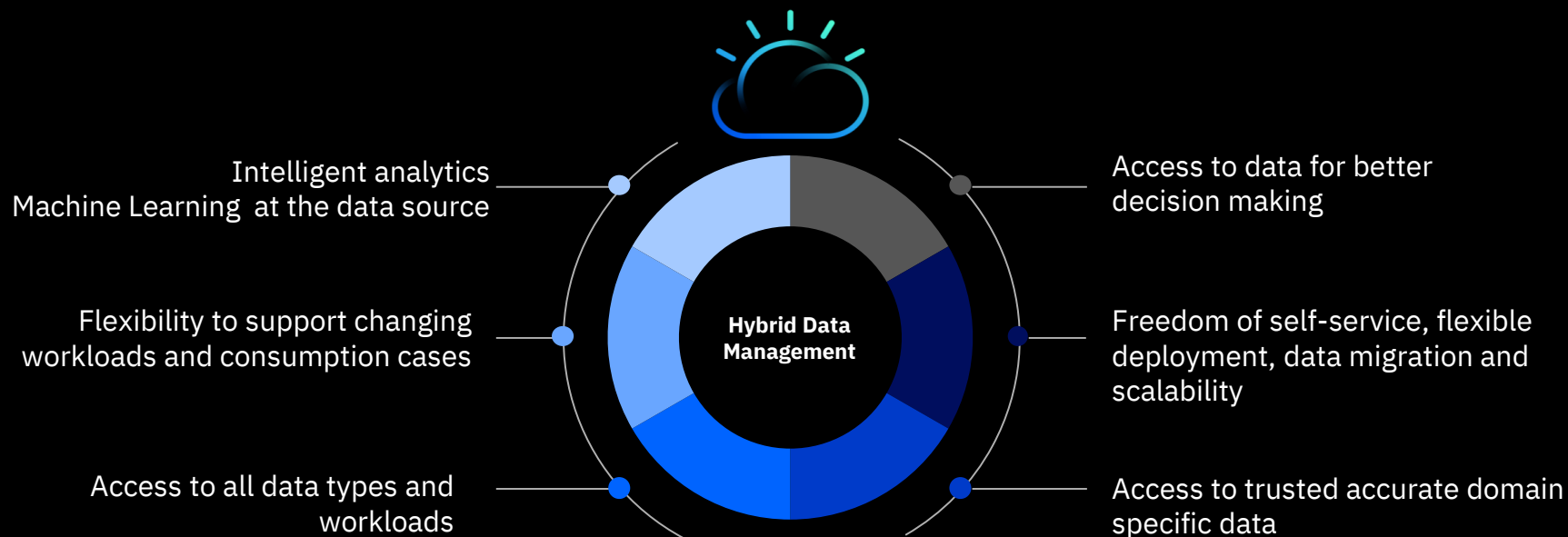
# Collect Data

Make data simple and accessible

Challenges:

- Data held captive in rigid platform choices – segregated & splintered views
- Lack of access to trusted, consistent data across the enterprise
- Data resides in higher volumes, in greater variety and across the enterprise

All data should be discoverable, well documented, trusted and obtainable



# Organize Data

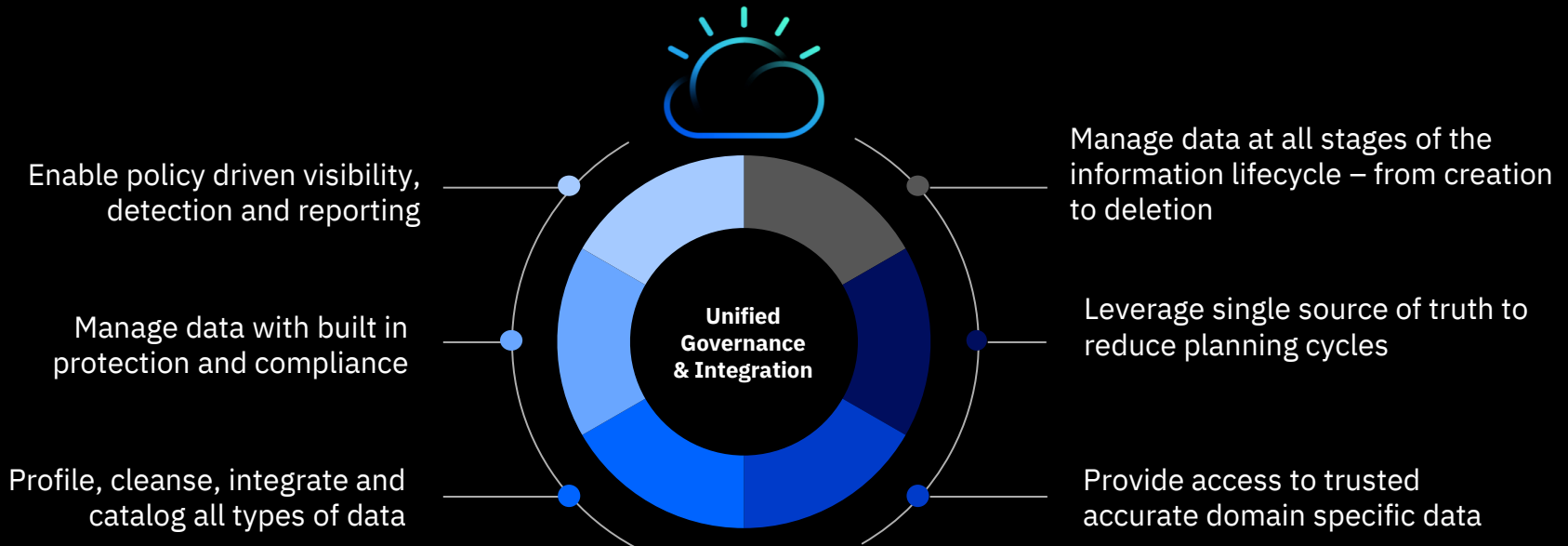
Create a trusted, business-ready analytics foundation

Challenges:

- Lack of data quality and data governance
- Lack of data consistency and completeness
- Lack of trust in the data



Data is trustworthy, complete and consistent



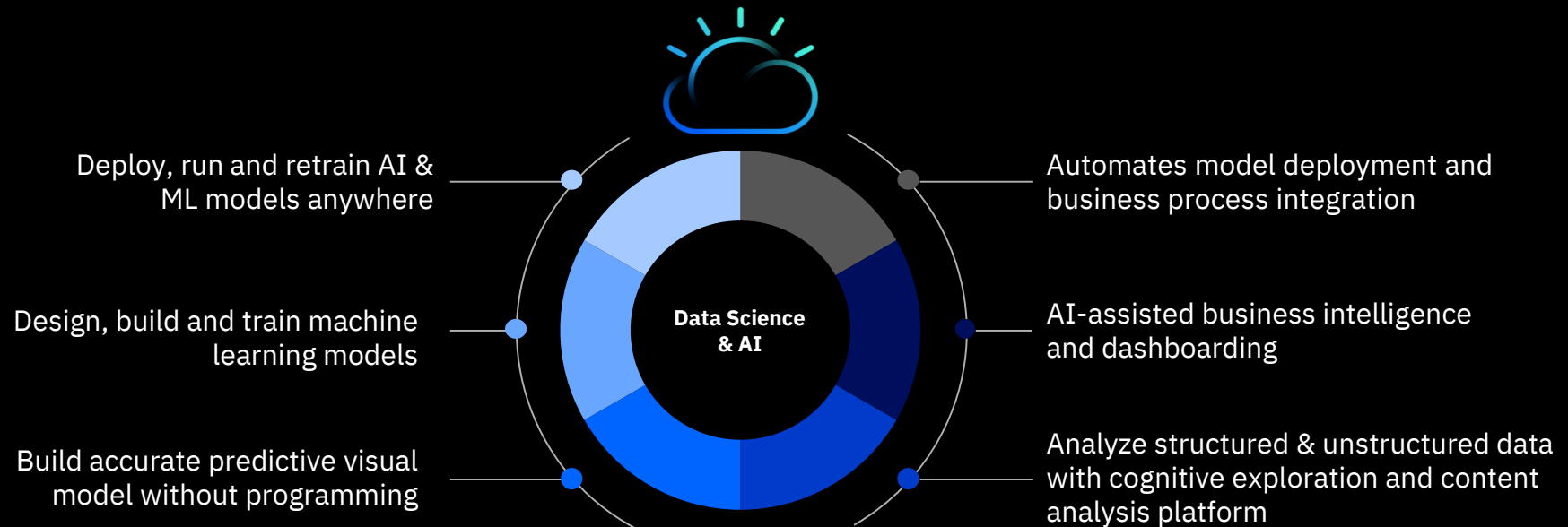
# Analyze Data

Scale insights on demand with AI everywhere

Challenges:

- Point solutions create complexity in integration, maintenance and support
- Lack of a unified analytics platform often results in poor ROI
- Inability to leverage the data to drive better business outcomes with AI & ML

Leverage AI and Data Science Platform to leverage the trusted data sets, build, manage, train and deploy ML models



Data Science Platform to make analyzing data and building AI models easier and more accessible

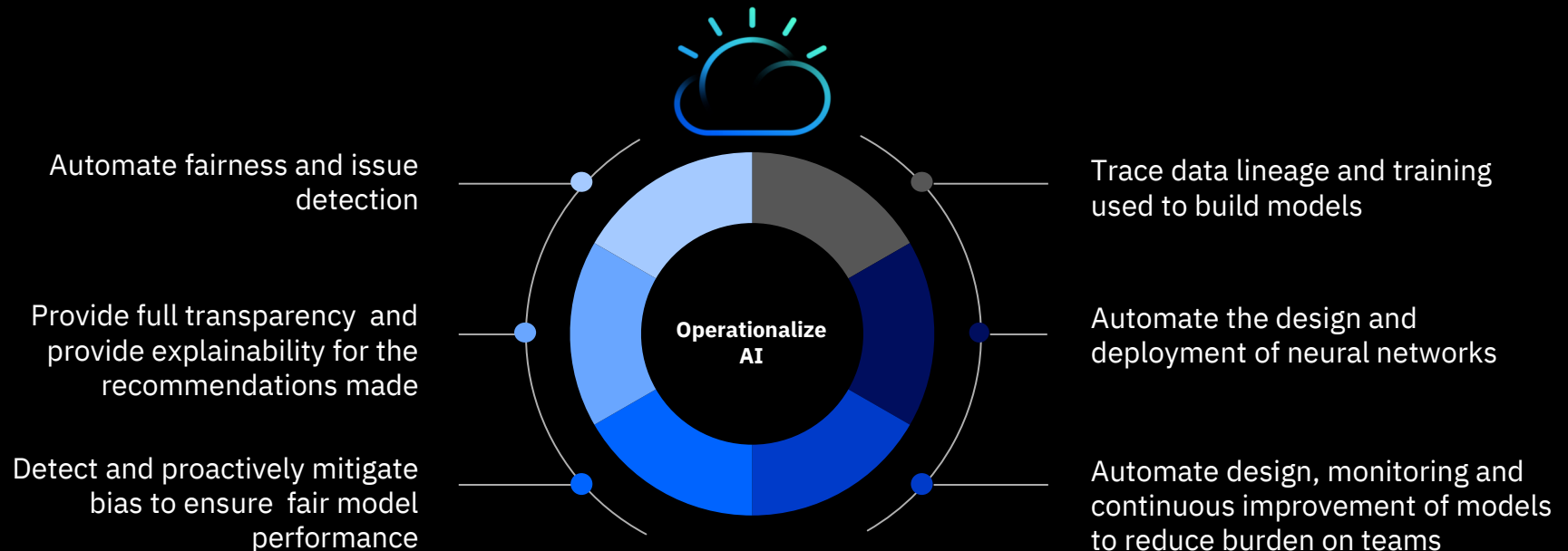
# Infuse AI

## Operationalize AI with trust and transparency

Ability to trust AI deployed models in production. Ensure fairness, bias mitigation and provide explainability for AI decisions/predictions

### Challenges:

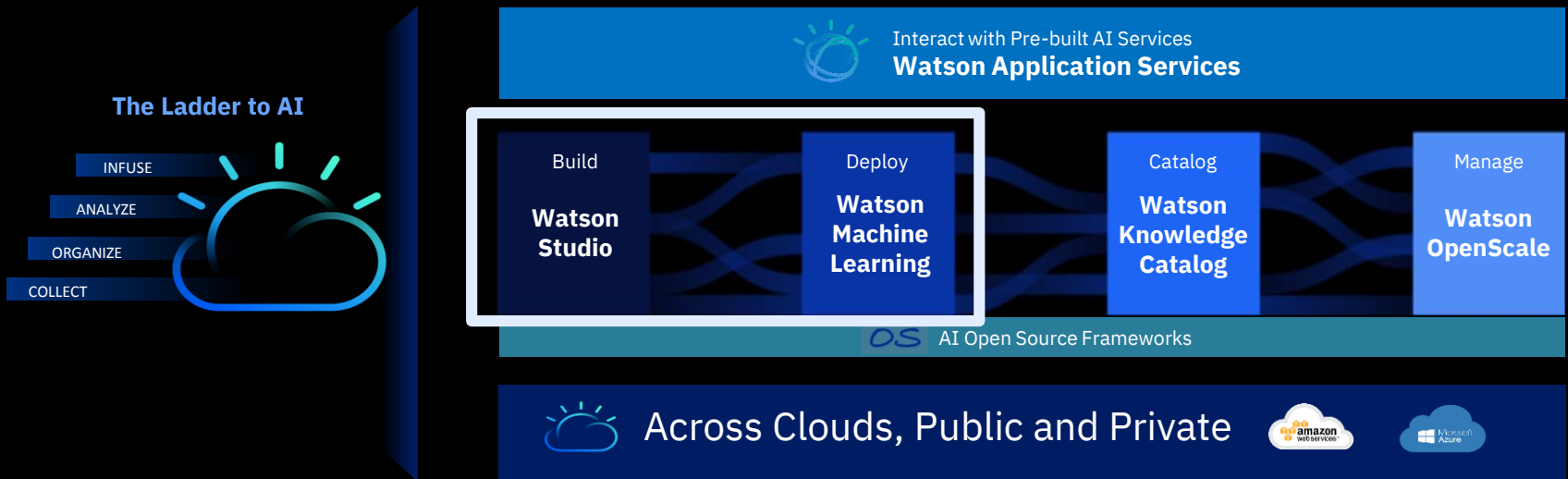
- Do I trust the performance of AI enabled applications?
- If data used to train the models has unfair bias, resulting recommendations aren't transparent & trusted
- Does the AI model provide any explanation for the recommendation made? Lack of explainability





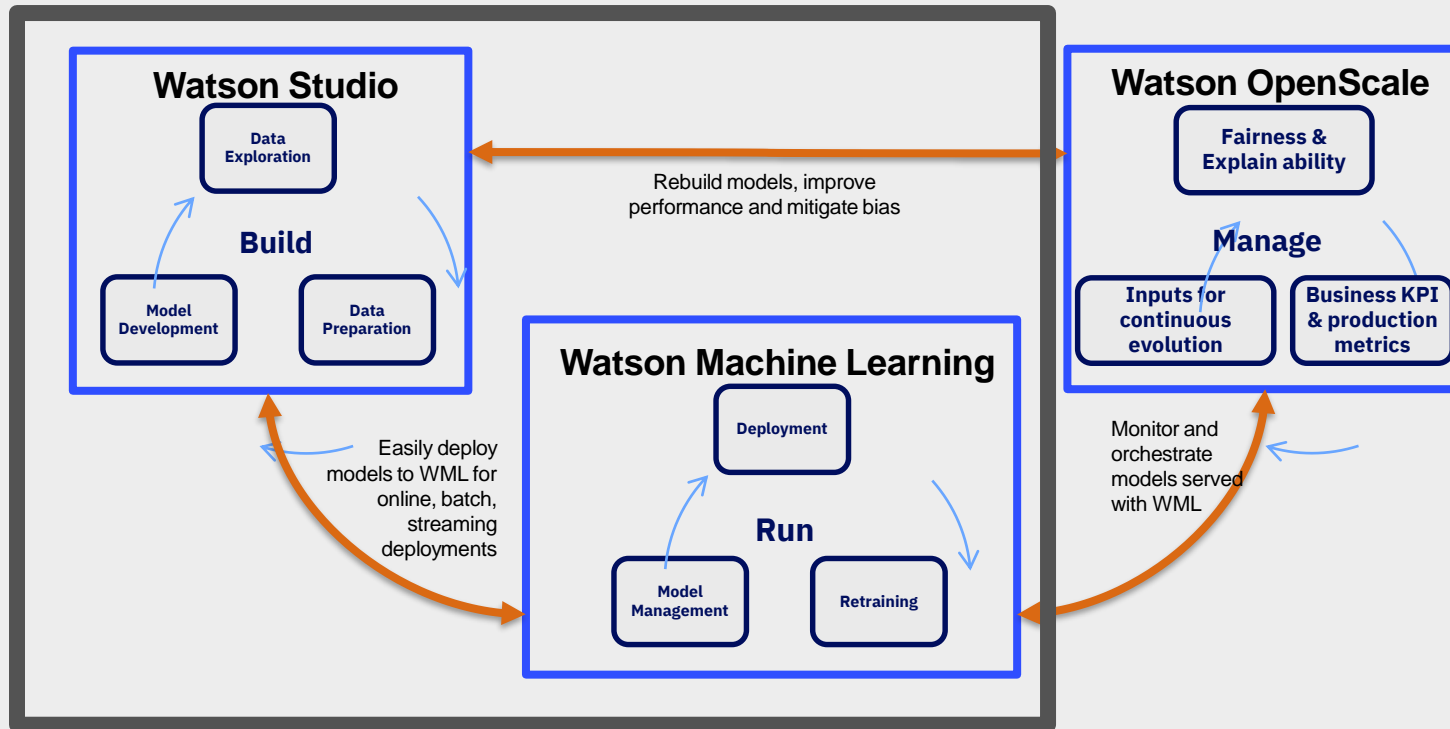
# IBM AI Portfolio

Everything you need for Enterprise AI, on any cloud





# Accelerate your data science lifecycle from discovery to production







# IBM Watson Studio Platform

An integrated platform of tools, services, data, and metadata that help companies or agencies accelerate their shift to be data-driven organizations.

Drive governance policy effectiveness while tracking how data is used and its value to the company

## Data Steward

Make the insights immediately actionable and add intelligence to apps in straightforward manner

## App Developer



## Data Engineer

Easily build data pipelines that power dashboards and data platforms while ensuring high quality

## Business Analyst

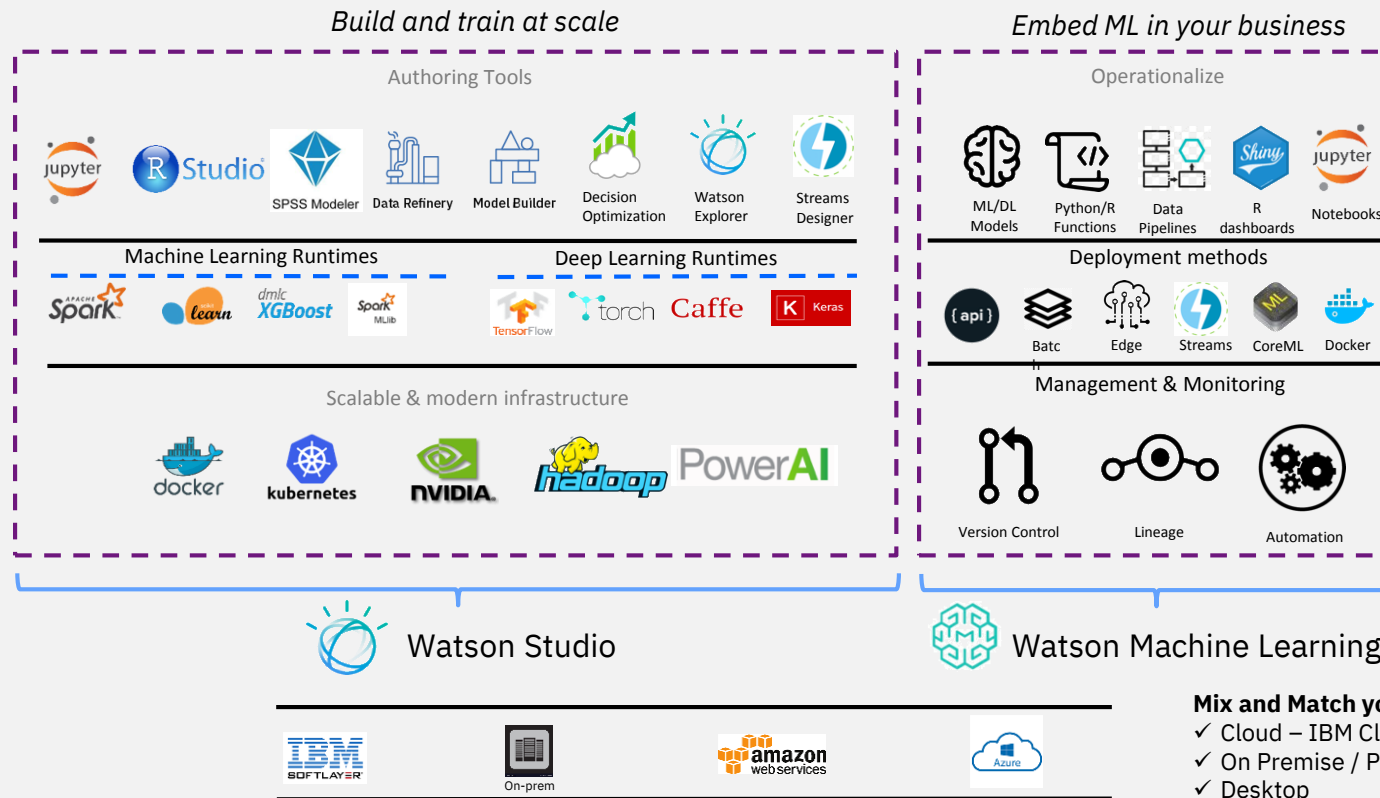
Build dashboards and reports to visualize insights to the business

## Data Scientist

Access powerful tools to tease out the insights using advanced analytics



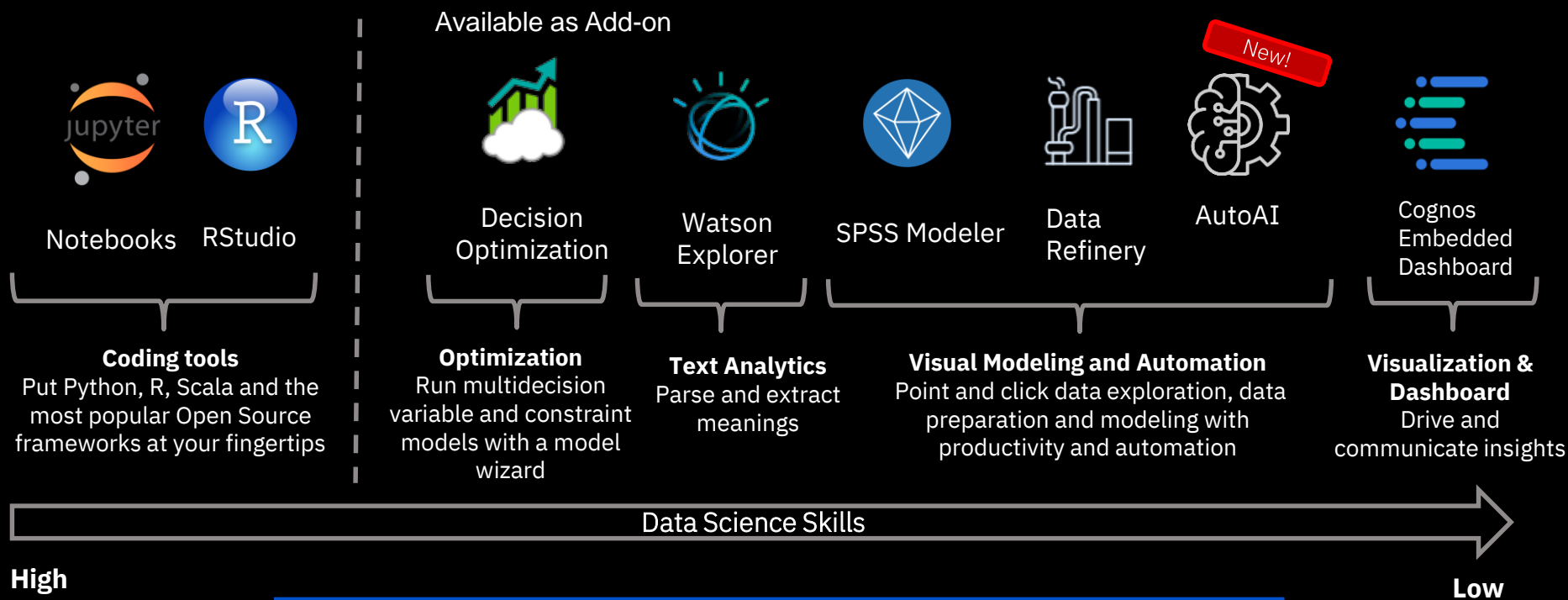
# Watson Studio and Watson Machine Learning inject AI firepower into your business





# Watson Studio and Watson Machine Learning Add-ons

*More powerful and flexible tools built for teams*



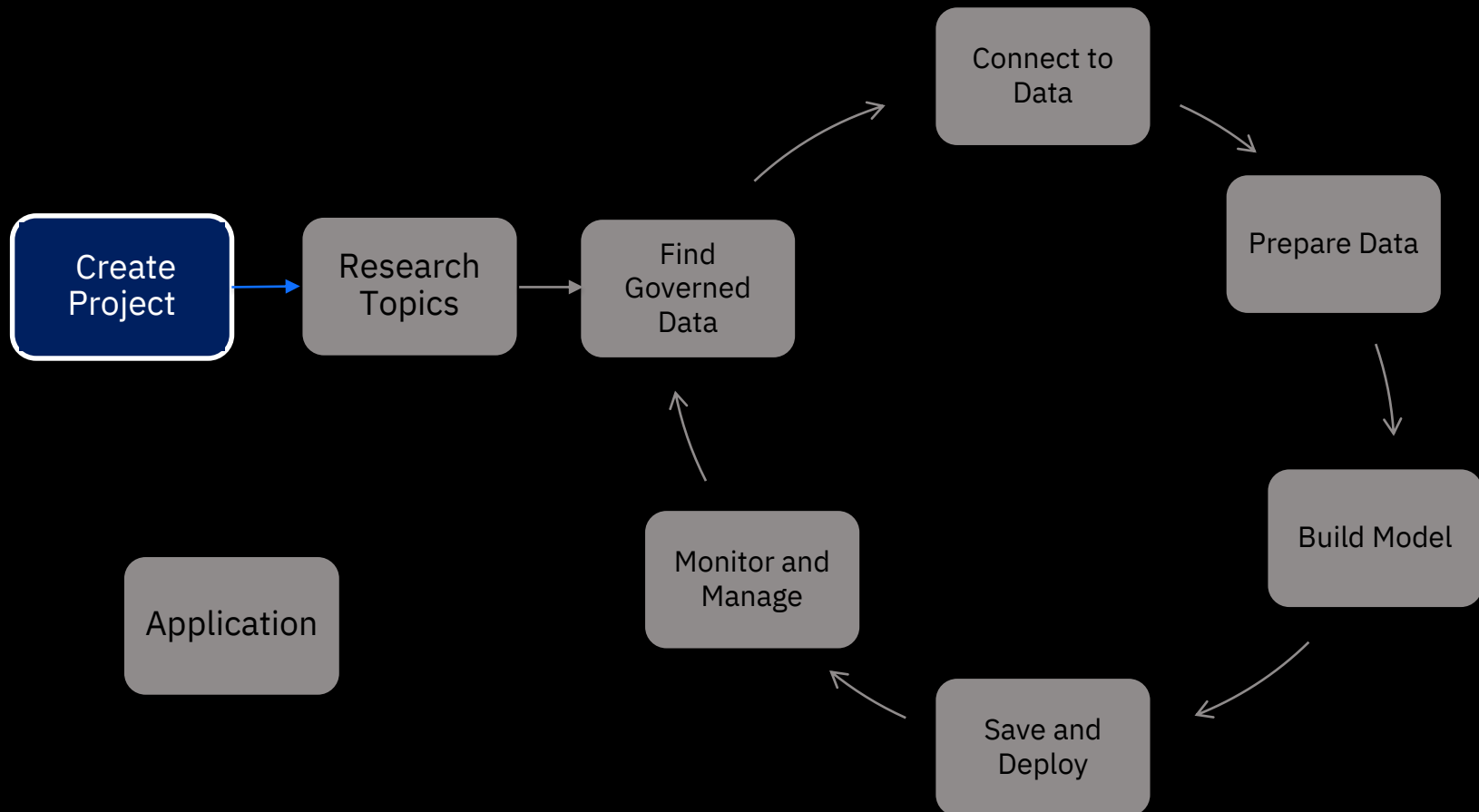
Data science skills are scarce – maximize productivity with IBM Watson Studio

# IBM Watson Studio Platform



## Watson Studio supports the Data Science Lifecycle

*Build, train, deploy, and monitor at scale ML/DL workflows to infuse AI into the enterprise to drive innovation.*



# IBM Watson Studio Platform



## Watson Studio Project Features

*Making Data Science a Team Sport*

Create  
Project

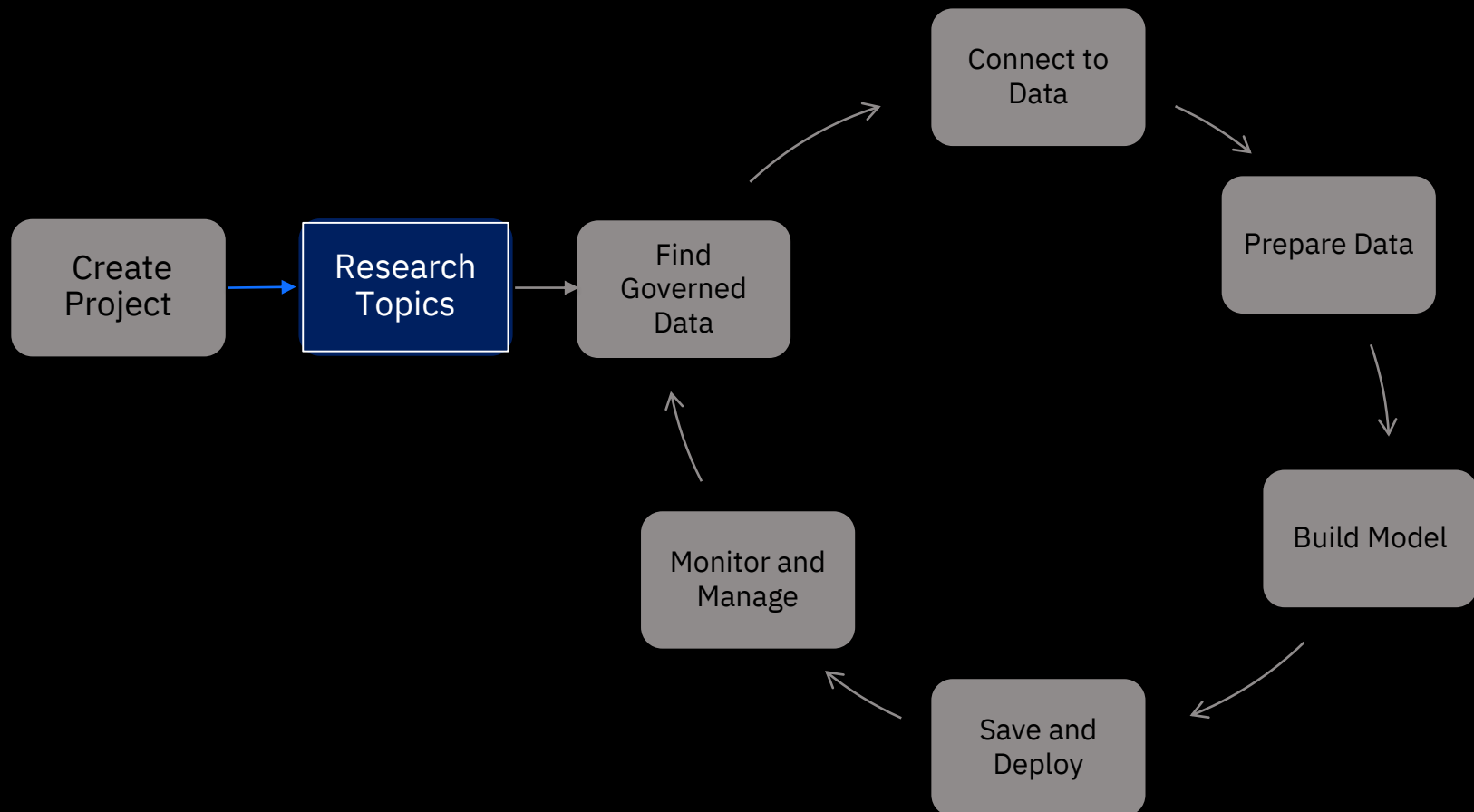
- Organize resources to achieve a particular data analysis goal
- Support role-based collaboration (Admin, Editor, Viewer)
- Share Assets from all IDEs across one Watson Studio project: notebooks, data sources, flows, models, etc.
- Export/Import Projects

# IBM Watson Studio Platform



## Watson Studio supports the Data Science Lifecycle

*Build, train, deploy, and monitor at scale ML/DL workflows to infuse AI into the enterprise to drive innovation.*



# IBM Watson Studio Platform



## Watson Studio Project Features

*Built in learning to get started*

Research  
Topics

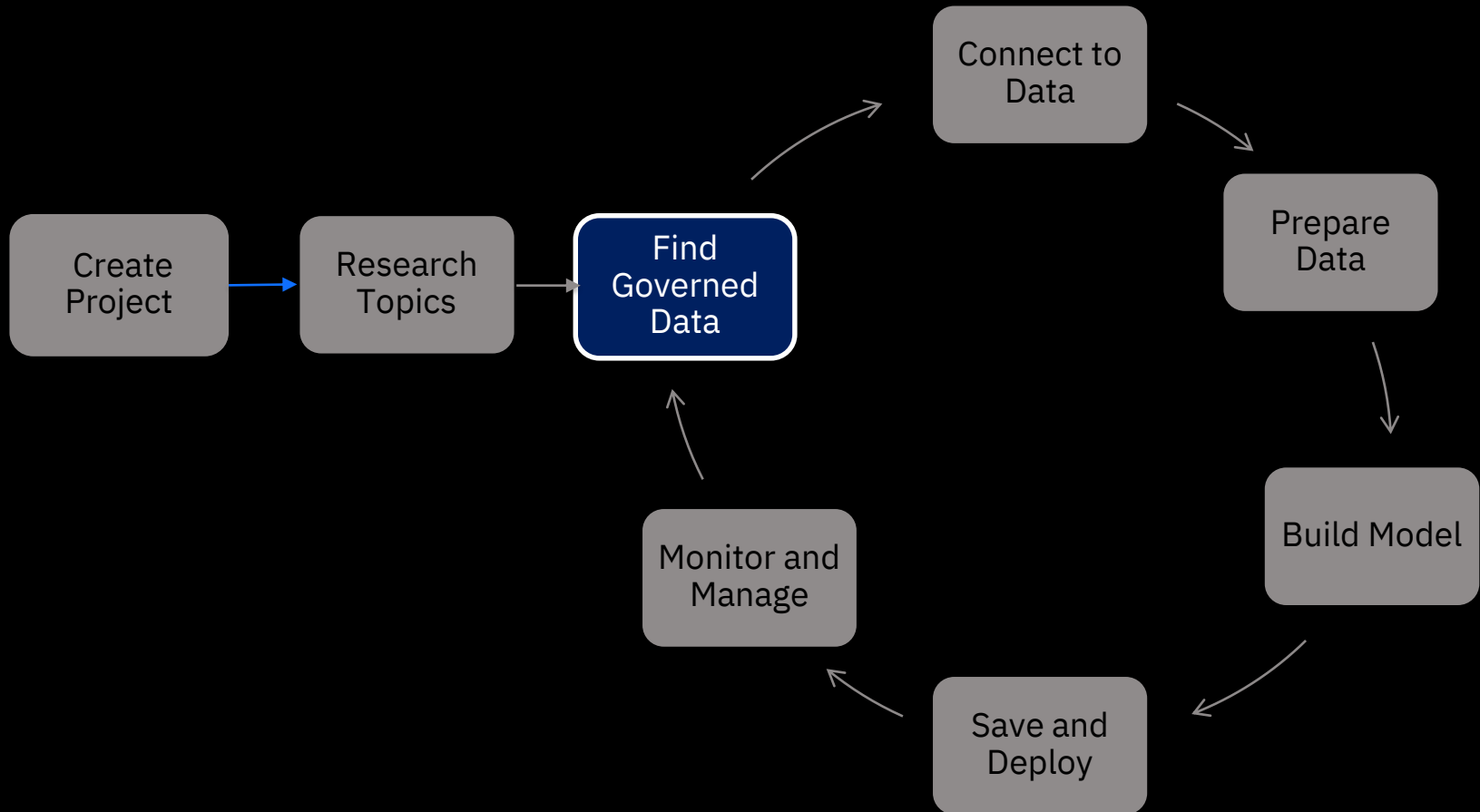
- Enable Community Card Feature that include curated articles, tutorials, notebooks, data sets, and papers
- Enable Bookmark in Projects
- Copy notebooks or Data Sets into projects
- Continuously update IBM's managed services

# IBM Watson Studio Platform



## Watson Studio supports the Data Science Lifecycle

*Build, train, deploy, and monitor at scale ML/DL workflows to infuse AI into the enterprise to drive innovation.*





# IBM Watson Studio Platform



## Watson Knowledge Catalog Features

*Unlock tribal knowledge and unleash knowledge workers*

Find  
Governed  
Data

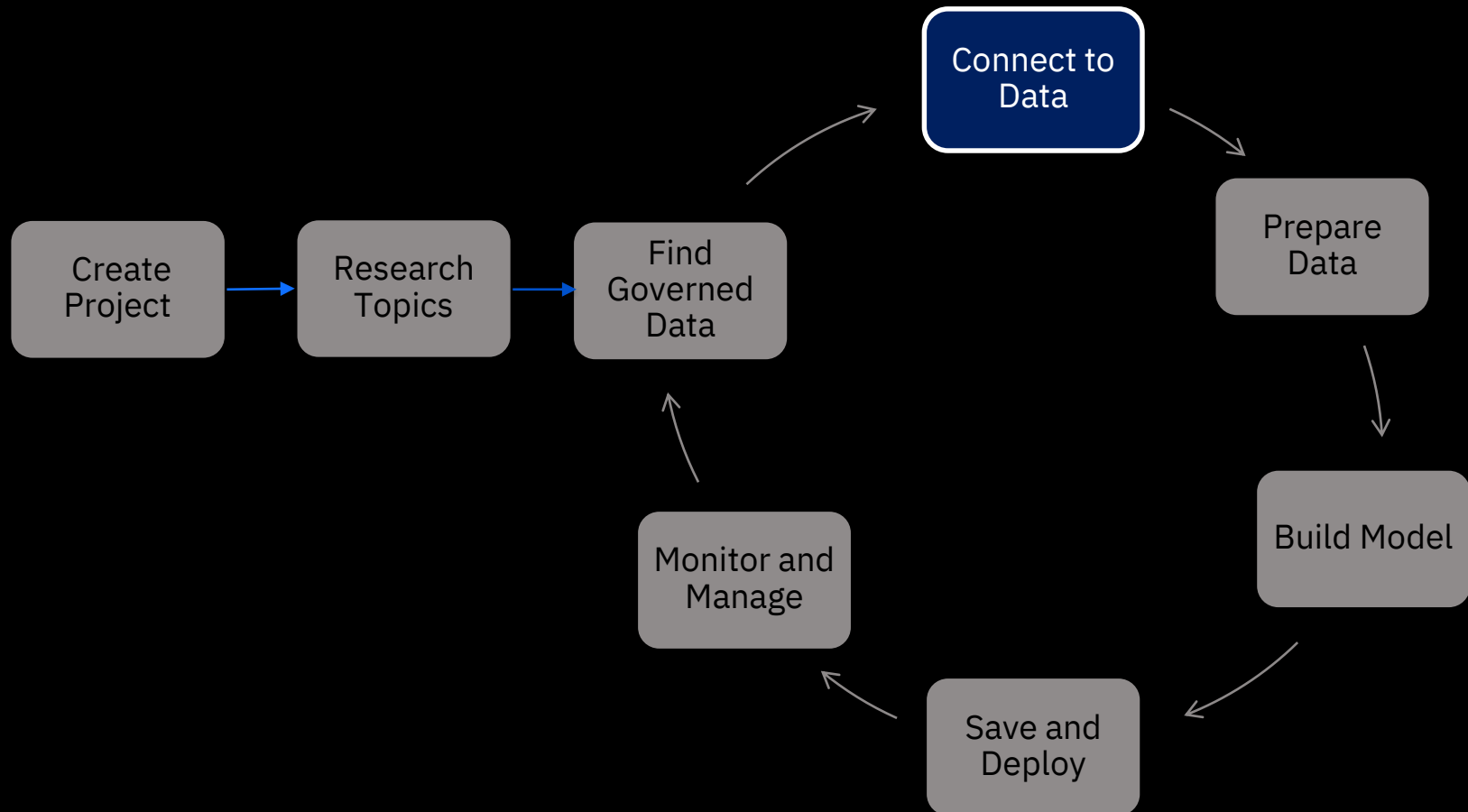
- **Find** data (structured, unstructured) and AI assets (e.g., ML/DL models, notebooks, Watson Data Kits) in the **Knowledge Catalog** with intelligent search and giving the right access to the right users.
- Discover assets, profiling, classification
- Author policies and rules
- Enforce policies and rules
- Provide asset usage statistics

# IBM Watson Studio Platform



## Watson Studio supports the Data Science Lifecycle

*Build, train, deploy, and monitor at scale ML/DL workflows to infuse AI into the enterprise to drive innovation.*



# IBM Watson Studio Platform



## Watson Studio Connection Features

*Unlock tribal knowledge and unleash knowledge workers*

Connect to  
Data

- Upload files
- Connect to Structured and Unstructured, On-prem and Cloud data sources.
- Wizard based connection definition and code generation

# IBM Watson Studio Platform





















## Watson Studio Connection Features

*Unlock tribal knowledge and unleash knowledge workers*























Connect to  
Data

### New connection

#### IBM services

 BigInsights HDFS	 Cloud Object Storage	 Cloud Object Storage (infrastructure)	 Cloudant
 Cognos Analytics	 Compose for MySQL	 Compose for PostgreSQL	 Db2
 Db2 Big SQL	 Db2 for i	 Db2 for z/OS	 Db2 Hosted
 Db2 on Cloud	 Db2 Warehouse	 Informix	 Object Storage OpenStack Swift (infrastructure)
 PureData for Analytics	 Watson Analytics		

#### Third-party services

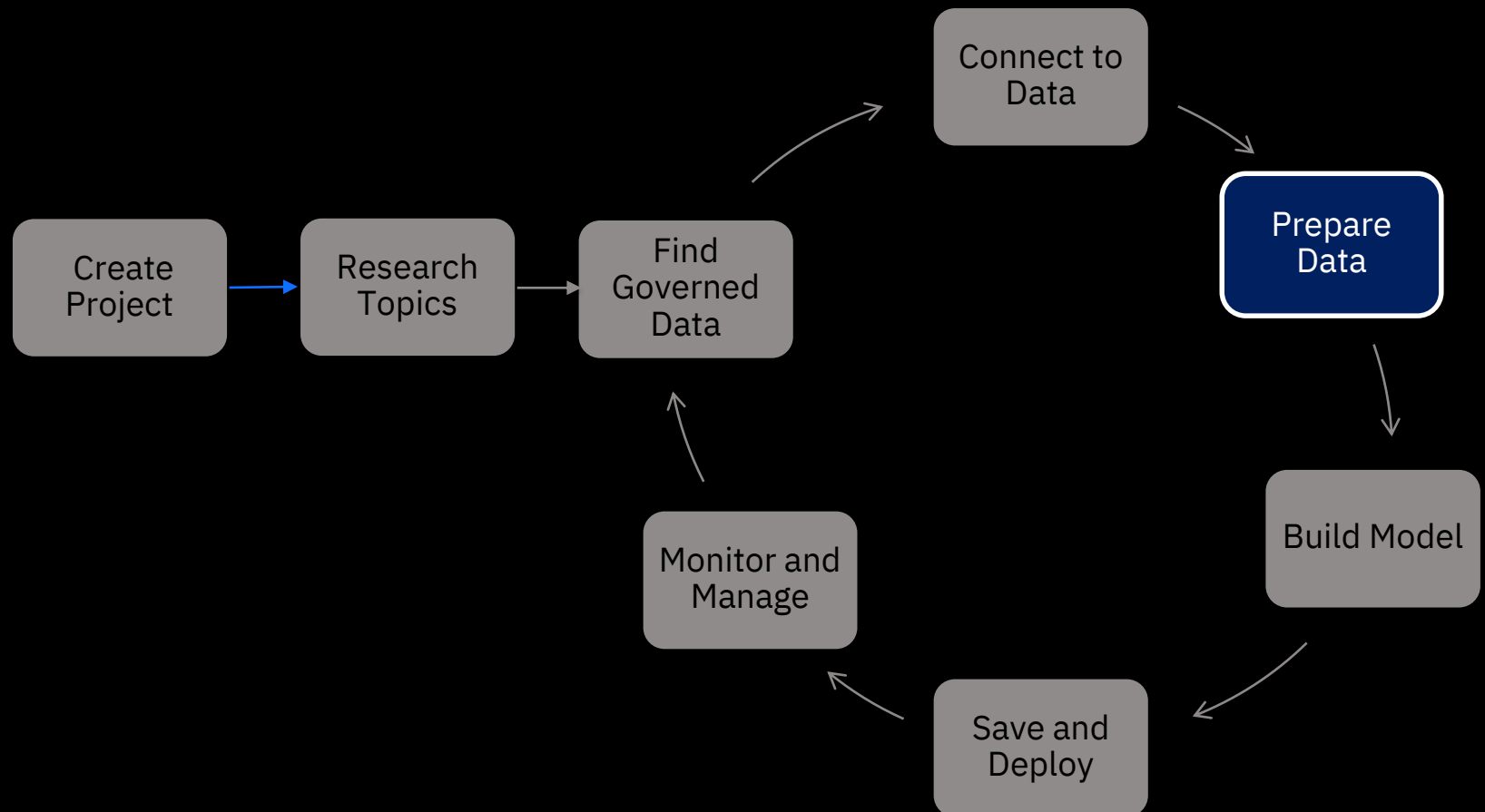
 Amazon Redshift	 Amazon S3	 Apache Hive	 Cloudera Impala
 Dropbox	 FTP	 Google BigQuery	 Google Cloud Storage
 Hortonworks HDFS	 Looker	 Microsoft Azure Data Lake Store	 Microsoft Azure SQL Database
 Microsoft SQL Server	 MySQL	 Oracle	 Pivotal Greenplum
 PostgreSQL	 Salesforce.com	 Sybase	 Sybase IQ
 Tableau	 Teradata		

# IBM Watson Studio Platform



## Watson Studio supports the Data Science Lifecycle

*Build, train, deploy, and monitor at scale ML/DL workflows to infuse AI into the enterprise to drive innovation.*



# IBM Watson Studio Platform



## Watson Studio Data Refinery Features

*Making data fit for work*

Prepare  
Data

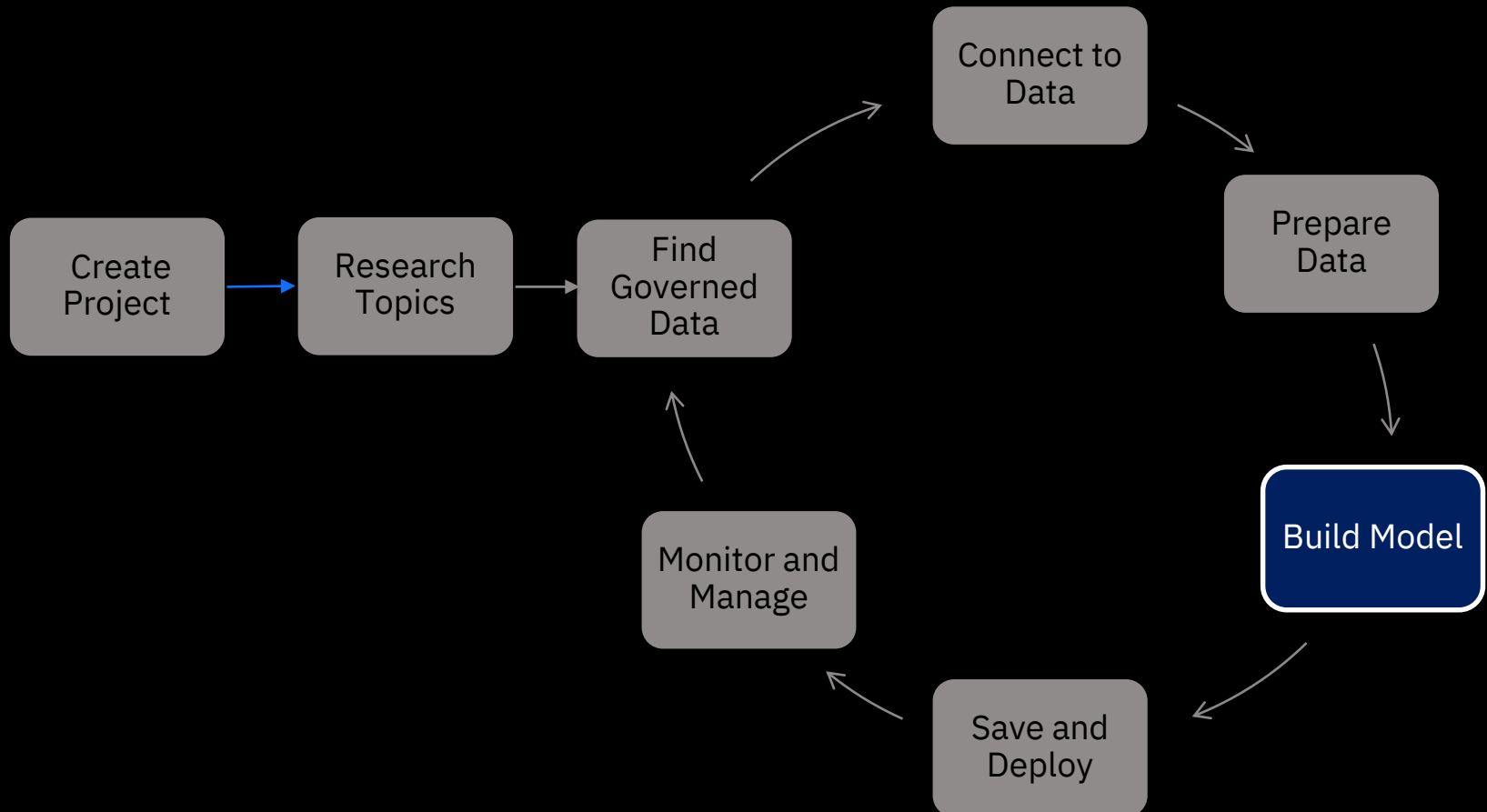
- Use the Data Refinery tool to profile, visualize, and shape data.
- Create data preparation pipelines via point and click capability on subset of data
  - ✓ Cleanse the data: fixing or removing data that is incorrect, incomplete, improperly formatted, or duplicated
  - ✓ Shape the data: customize data by filtering, sorting, combining, or removing columns, and performing operations
- Run the pipeline on all the data
  - Manually (on demand)
  - Automated (scheduled)

# IBM Watson Studio Platform



## Watson Studio supports the Data Science Lifecycle

*Build, train, deploy, and monitor at scale ML/DL workflows to infuse AI into the enterprise to drive innovation.*



# IBM Watson Studio Platform

## Watson Studio Model Building Features



*The best of Open Source and IBM Watson Tools to create state of the art data products*

### Open Source Tools

- Jupyter Notebooks\*\*
- RStudio and Shiny
- Libraries- scikit-learn\*\*, XGBoost\*\*, Spark, TensorFlow\*\*, Caffe, Keras, PyTorch

Build Model

### IBM Tools

- Auto AI \*\*
- SPSS Modeler\*\*
- Neural Network Modeler\*\*
- Experiment Builder\*\*
- Natural Language Classifier Model
- Visual Recognition Model\*\*

Train at scale on **GPUs** and **distributed** compute

\*\* in hands-on labs



Build Model

# IBM Watson Studio Platform

## Watson Studio Jupyter Notebook



My Projects / Watson Studio Labs / Machine Learning with SparkML

Not Trusted | Python 3.6 with Spark

File Edit View Insert Cell Kernel Help

Format Markdown

### Read Data Asset - female\_human\_trafficking - See Lab Instructions

```
In [ ]: # Insert SparkSession DataFrame code in this cell after the comments.
# make CERTAIN to rename the default dataframe name (df_data_1 or df_data_2 or df_data_3, etc) to trafficking_df
# Put cursor on the next line to Insert to code.
```

### Read Data Asset - Occupations - See Lab Instructions

The occupations listed in the female human trafficking file are too numerous to use as input to a machine learning model. We will categorize these occupations into 15 categories by joining with two other files. The Occupation.csv file contains a mapping of the occupations in the female human trafficking table to a category code. The Categories.csv file contains each code followed by the category name. This information needs to be joined to the female human trafficking table.

Follow the same procedure as above to insert a SparkDataFrame for Occupations

```
In [ ]: # Insert SparkSession DataFrame code in this cell after the comments
# make CERTAIN to rename the default dataframe name (df_data_1 or df_data_2 or df_data_3,etc) to occupations
#Put cursor on the next line to Insert to code
```

### Read Data Asset - Categories - See Lab Instructions

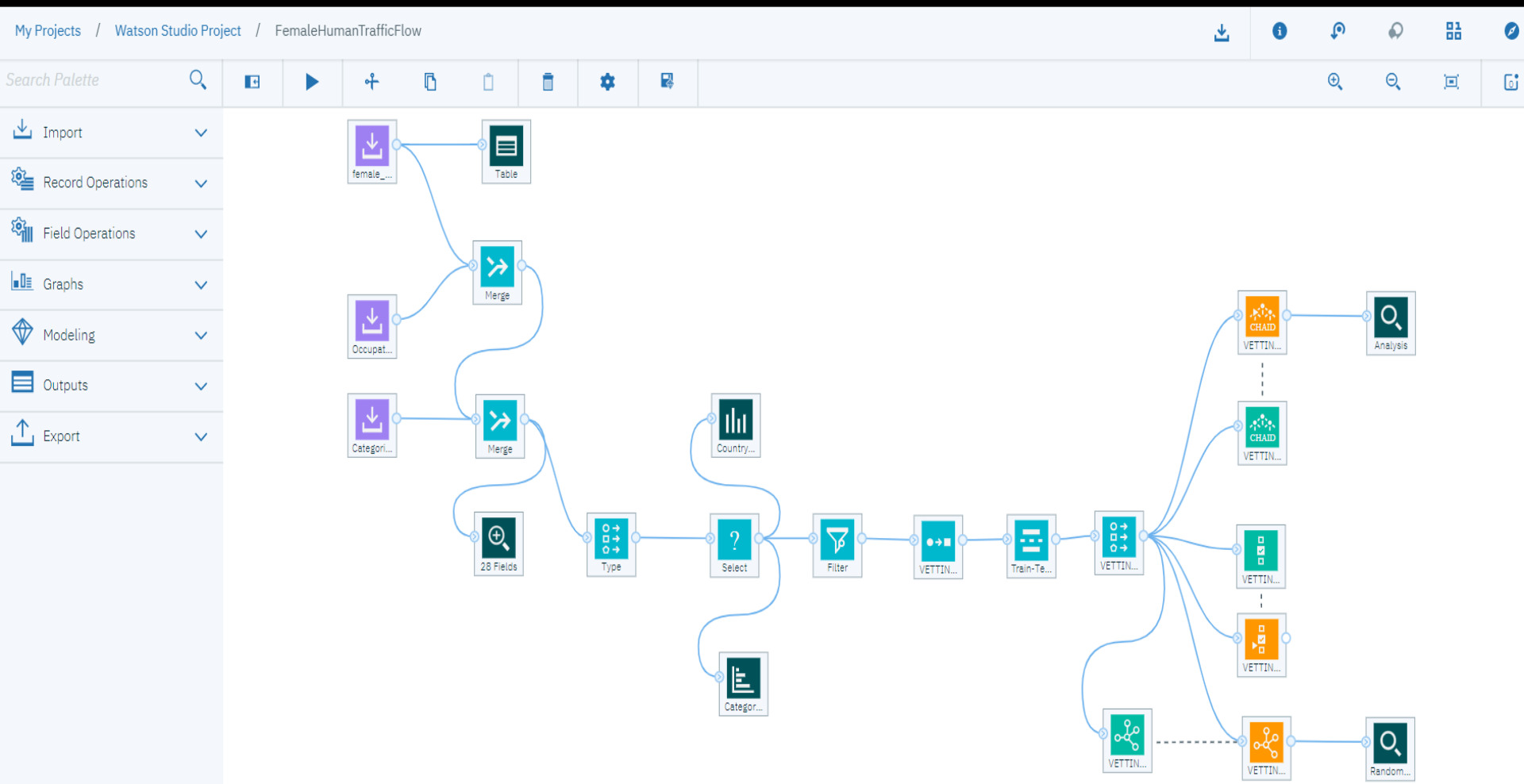
Follow the same procedure as above to insert a SparkDataFrame for Categories

```
In [ ]: # Insert SparkSession DataFrame code in this cell after the comments
# make CERTAIN to rename the default dataframe name (df_data_1 or df_data_2 or df_data_3,etc) to categories
#Put cursor on the next line to Insert to code
```

Build Model

# IBM Watson Studio Platform

## Watson Studio SPSS Modeler

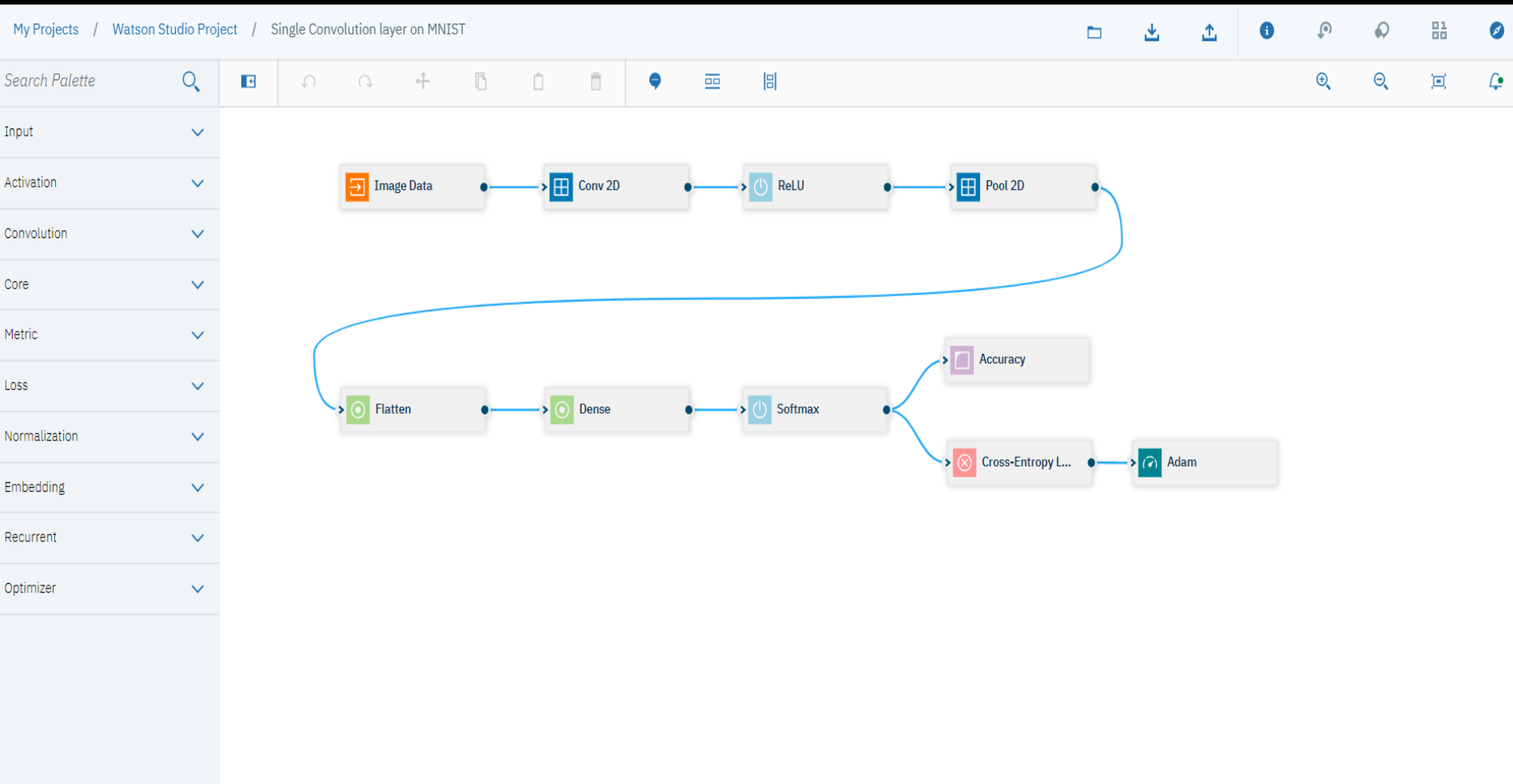


Build Model

# IBM Watson Studio Platform

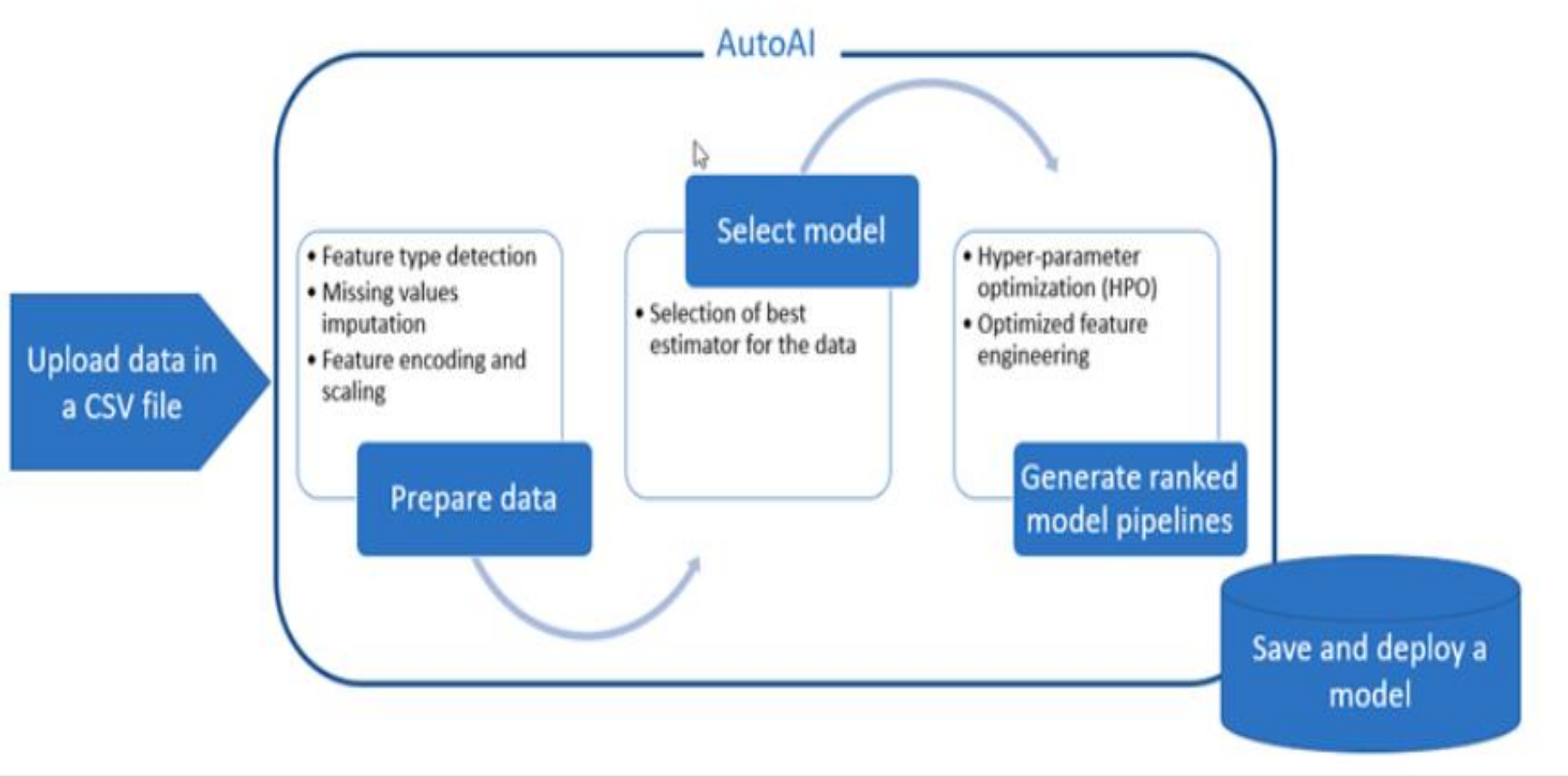


## Watson Studio Neural Network Modeler



# IBM Watson Studio Platform

## Watson Studio Auto AI

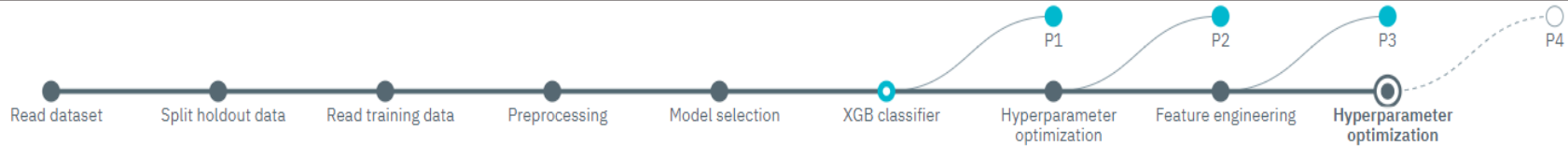


Build Model

# IBM Watson Studio Platform



## Watson Studio Auto AI



### Pipeline leaderboard

[Compare pipelines](#)

Ranking based on:

Accuracy

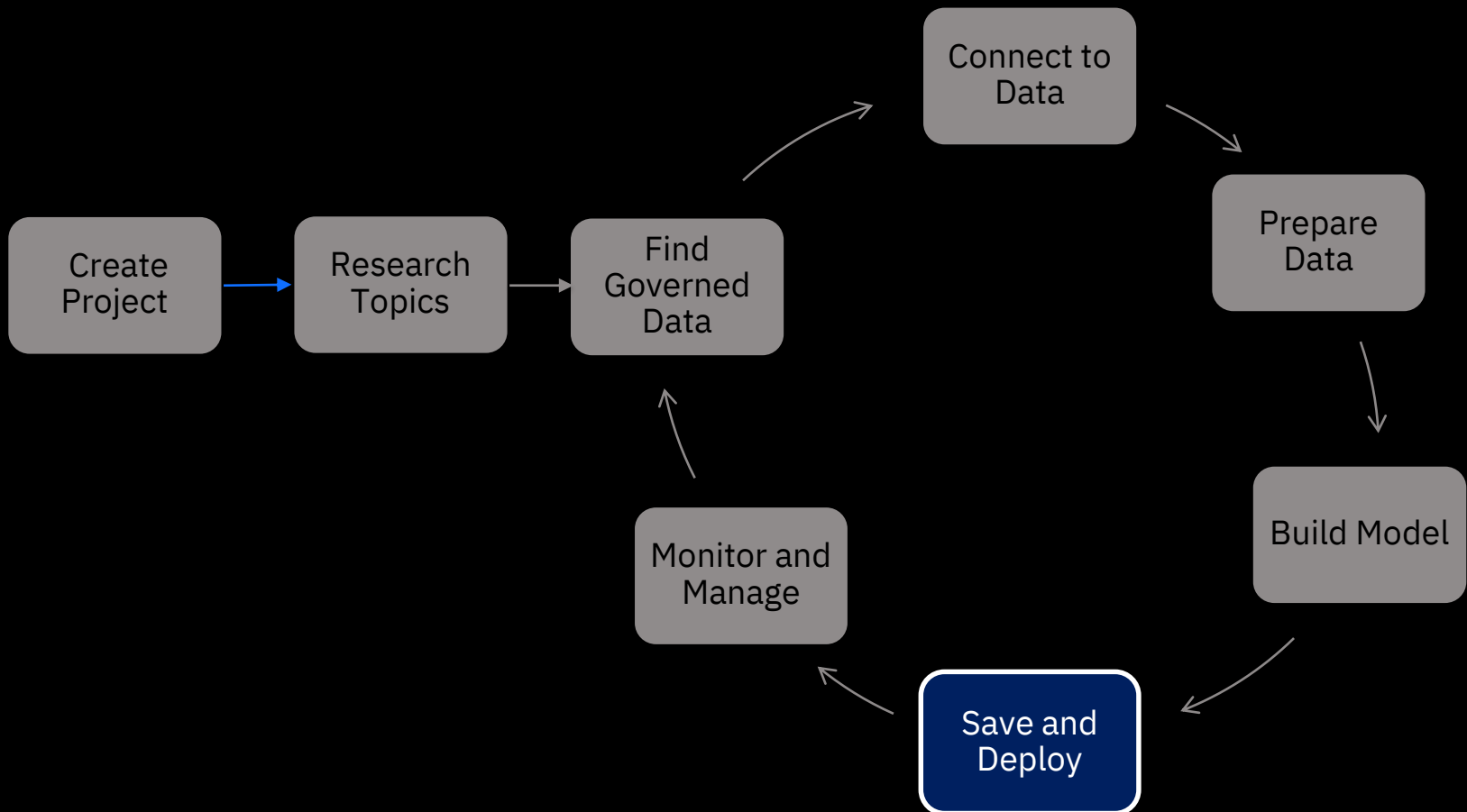
	RANK	ACCURACY	PIPELINE INFORMATION		
>	1	0.897	P3 - XGB classifier estimator Transformers (8): Preprocessing > Standard scaler > Univariate feature selection > Sine > Univariate feature selection > Tangent > ...	<a href="#">View details</a>	<a href="#">Save as model</a>
>	2	0.884	P1 - XGB classifier estimator Transformers (2): Preprocessing > XGB classifier estimator	<a href="#">View details</a>	<a href="#">Save as model</a>
>	3	0.884	P2 - XGB classifier estimator Transformers (2): Preprocessing > XGB classifier estimator	<a href="#">View details</a>	<a href="#">Save as model</a>

# IBM Watson Studio Platform



## Watson Studio supports the Data Science Lifecycle

*Build, train, deploy, and monitor at scale ML/DL workflows to infuse AI into the enterprise to drive innovation.*



# IBM Watson Studio Platform

## Watson Studio Save and Deploy Features



*Save and deploy models with Machine Learning in Watson Studio Platform*

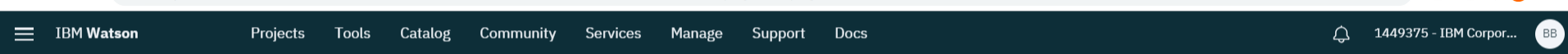
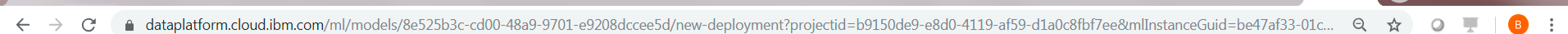
Save &  
Deploy

- Provide Watson Machine Learning API to save/load models to/from repository
- Provide Watson Machine Learning API to deploy saved models easily and have them scale automatically.
- Provide Watson Machine Learning API to invoke deployed models

Save & Deploy

# IBM Watson Studio Platform

## Watson Studio Save and Deploy Features



### Create Deployment

#### Define deployment details

Name

Model

Description

Deployment description

300

Deployment type

- ☒ Web service
- ☐ Batch prediction
- ☐ Realtime streaming prediction

Cancel

Save



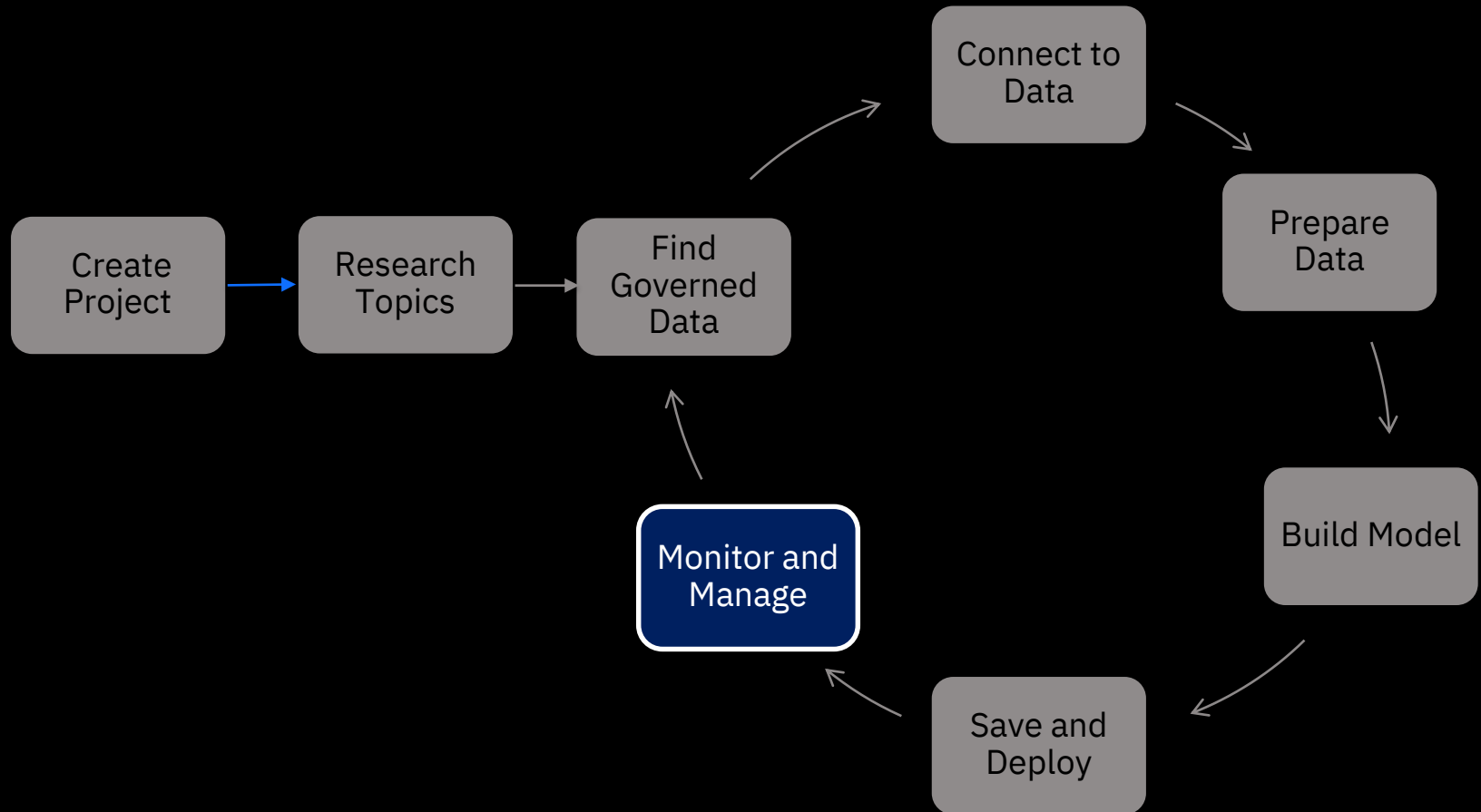


# IBM Watson Studio Platform



## Watson Studio supports the Data Science Lifecycle

*Build, train, deploy, and monitor at scale ML/DL workflows to infuse AI into the enterprise to drive innovation.*



# IBM Watson Studio Platform

## Watson Studio Monitor and Manage Features



*Save and deploy models with Machine Learning in Watson Studio Platform*

Monitor &  
Manage

- Monitor the performance of the models in production and trigger automatic retraining and redeployment of models.



# Watson Studio Monitor and Manage Features

*Monitor and Manage with Watson Studio Platform*

## Configure performance monitoring

### Spark Service or Environment

Only Spark environments supporting Scala kernels can be used for continuous learning.

Spark ▼

### Prediction type

binary ▼

### Metric details (type / optional threshold)

areaUnderPR ▼ 0.8 ⊕

### Feedback data connection (IBM Db2 Warehouse on Cloud - [Create new connection](#))

dashdb: BLUDB / FeedbackBLB [Change feedback data reference](#)

### Record count required for re-evaluation

500

### Auto retrain

when model performance is below threshold ▼

### Auto deploy

never ▼

# IBM Watson Studio Platform

## Watson Studio Open Scale



*Build trust, transparency and explain ability with IBM Open Scale*

### **Trust and Transparency**

- Intelligently deliver bias mitigation
- Provide traceability & auditability of AI predictions made in production applications
- Tracks AI accuracy in applications
- Explains an outcome in business terms

### **Automation**

- Automatically detects and mitigates bias in model output, without affecting currently deployed model or outcomes
- \*NeuNetS (beta) – automatically generate Neural Networks

### **Open By Design**

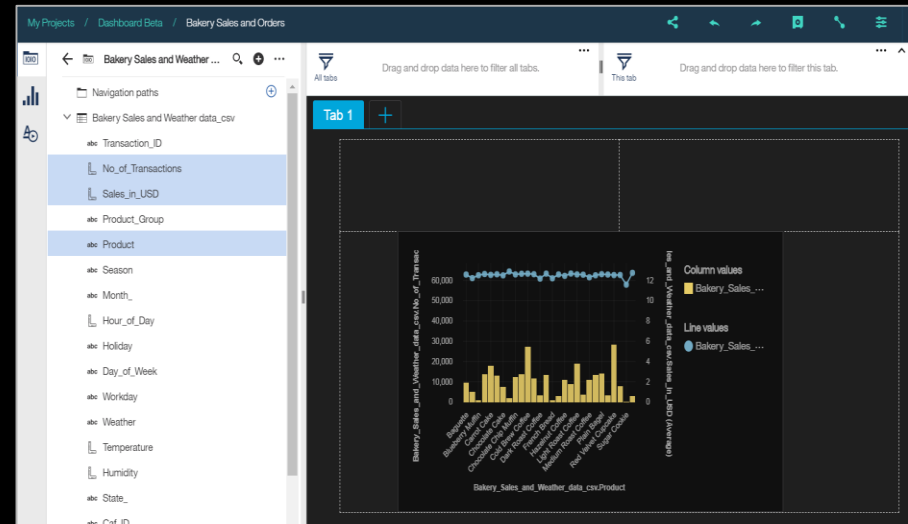
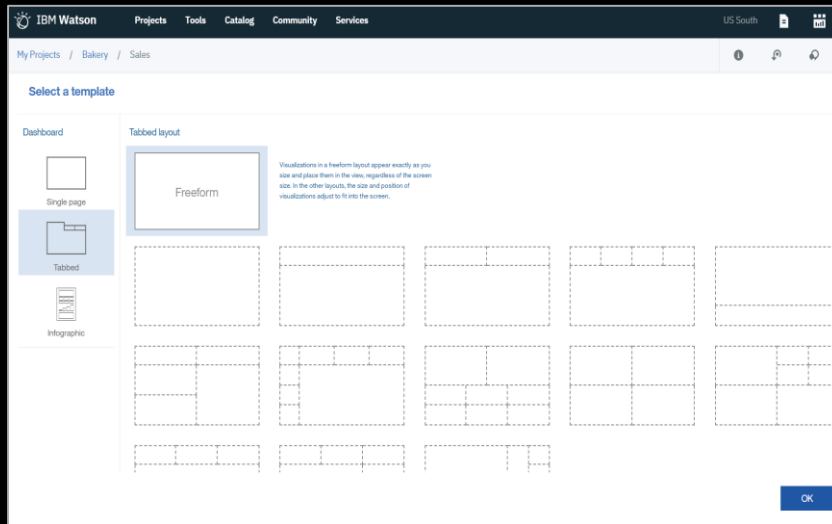
- Monitor models deployed on third party model server engines
- Deploy behind enterprise firewall or on IaaS provider

\* <https://arxiv.org/abs/1901.06261>

# IBM Watson Studio Platform

## Watson Studio Dynamic Dashboard Features

*Making insights available to all*



NAME	TYPE	SERVICE	CREATED BY	LAST MODIFIED	ACTIONS
UNdata_agri_value_add.csv	Data Asset	Project	Alex Jones	7 Mar 2018, 9:37:13 am	...
EuropeanCountryStats.csv	Data Asset	Project	Alex Jones	7 Mar 2018, 9:37:12 am	...
Bakery Sales and Weather data.csv	Data Asset	Project	Alex Jones	8 Feb 2018, 3:07:05 pm	...

NAME	SHARED	SCHEDULED	STATUS	LANGUAGE	LAST EDITOR	LAST MODIFIED	ACTIONS
Sales Predictions					Alex Jones	7 Mar 2018	...

NAME	SHARED	LAST EDITOR	LAST MODIFIED	ACTIONS
Bakery Dashboard		Alex Jones	9 Feb 2018, 4:58:46 pm	...



# IBM Watson Studio Platform

## Watson Studio Dynamic Take Away



### Integrated Collaboration Environment

- Data Scientists, Subject Matter experts, Business Analysts & Developers all in one environment to accelerate innovation, collaboration and productivity
- Built-in learning to get started or go the distance with advanced tutorials

### Choice of Tools for the full AI lifecycle

- Best in-breed open source and IBM tools that support the end-to-end AI lifecycle
- Choice of code or no-code tools to build and train your own ML/DL models or easily train and customize pre-trained Watson APIs

### Support for all levels of expertise

- Use Watson smarts and recommendations for the best algorithms to use given your data, OR
- Use the rich capabilities and controls to fine tune your models

### Multiple Deployment Options

- Watson Studio on IBM Cloud – Managed offering
- Watson Studio – IBM Cloud Pak for Data OpenShift Container Platform, Private Cloud, Public Cloud-(IBM, Azure, AWS)
- Watson Studio Desktop

### Model lifecycle & management

- Deploy models into production then monitor them to evaluate performance.
- Capture new data for continuous learning and retrain models so they continually adapt to changing conditions.

### Integrated with Knowledge Catalog

- Intelligent discovery of data and AI assets that enables reuse & improves productivity
- Seamlessly integrated for productive use with Machine Learning and Data science
- Powerful governance tools to control and protect access to data