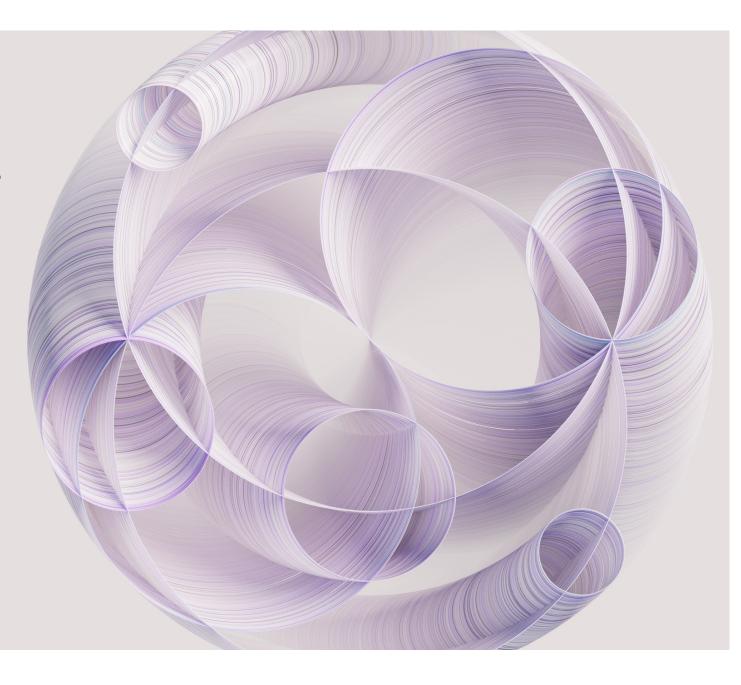
## watsonx.ai Train, validate, tune and deploy AI models



### Contents

- Introduction
- Generative AI and traditional AI
- Foundation models and generative AI
- Common generative AI tasks
- Risks and requirements for a generative AI platform
- Watsonx and watsonx.ai
  - IBM watsonx and its components
  - IBM watsonx.ai
    - Train, validate, tune, and deploy AI models
  - IBM watsonx.ai components
    - Foundation models library
    - Prompt lab
    - Tuning studio \*
- Watsonx.ai value propositions
- Getting started with watsonx.ai

AI adoption more than doubled since 2017



Source: McKinsey - The State of AI in 2022 - and a half decade in review

Foundation Models and Generative AI are bringing an inflection point in AI...

...but how enterprises adopt and execute will define whether they unlock, create value, unleash innovation at scale and with speed

### Enterprise leaders are faced with unprecedented challenges to scale AI

#### 1 in 5

Leaders cite difficulties integrating data across any cloud

#### 25%

of organizations lack the tools or platforms to develop models

#### 34%

of businesses lack the necessary AI skills, expertise or knowledge to keep up with AI innovation

#### 74%

of leaders haven't taken the necessary steps to reduce bias in the organization's AI

Source: 2022 AI Adoption Index https://www.ibm.com/downloads/cas/GVAGA3JF

# Impact of generative AI

# Massive early adoption

### Broad-reaching and deep impact

The speed, scope, and scale of generative AI impact is unprecedented

80%

of enterprises are working with or planning to leverage foundation models and adopt generative AI Generative AI could raise global GDP by

7% within 10 years Critical focus of AI activity and investment

Generative AI expected to represent

30%

of overall market by 2025

Sources: Statista; Reuters; Goldman Sachs; IBM Institute for Business Value; Gartner. Scale Zeitgeist: AI Readiness Report, a survey of more than 1,600 executives and ML practitioners

## Generative AI and traditional AI

Both traditional AI and generative AI are useful for enterprises. Neither replaces the other, generative AI opens new possibilities

#### Generative AI

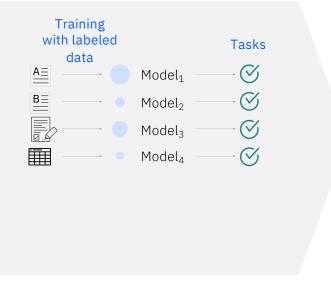
- Foundation models trained with unlabeled data
- Unsupervised
- Trained on very big data sets
- No specific task
- Transferable
- Works well for general tasks and can improve for specific tasks with less training
- Need to monitor bias and drift

### Traditional AI

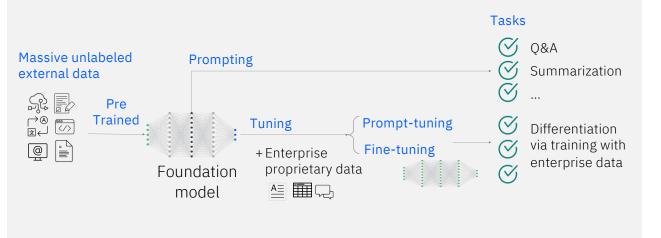
- Traditional Machine learning (ML/AI) model trained with "labeled" data
- Training is supervised
- Trained on proper, large data sets
- Trained for a specific task
- Does not transfer well to other tasks
- A tuned model can be very efficient for the specific task it was designed for
- Need to monitor bias and drift

# Foundational models enable a new paradigm of data-efficient AI development – generative AI

#### Traditional AI models



#### **Foundation Models**



- Individual siloed models
- Require task specific training
- Lots of human supervised training

- Rapid adaptation to multiple tasks with
  - small amounts of task-specific data
- Pre-trained unsupervised learning

### The AI Ladder IBM's prescriptive approach to the journey to AI

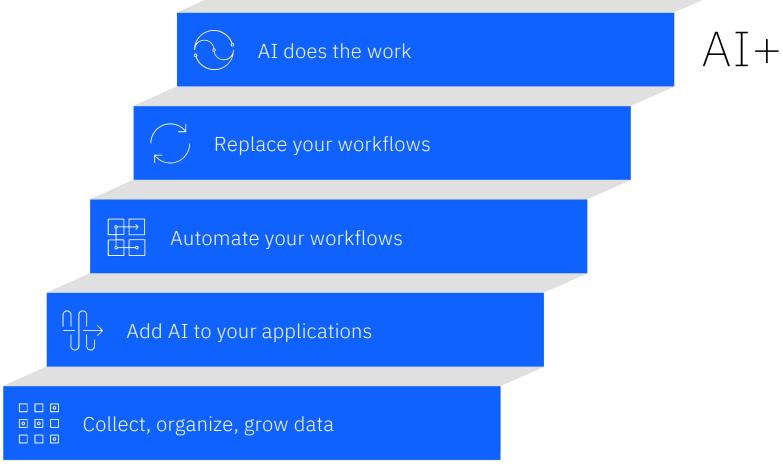
and accessible



Unlock the value of data for an AI and hybrid, multi-cloud world

#### The modern-day AI ladder

+AI



Introducing...

# watsonx

### watsonx

and its 3 components

The platform for AI and data

Scale and accelerate the impact of AI with trusted data.

#### watsonx.ai

Train, validate, tune and deploy AI models

A next generation enterprise studio for AI builders to train, validate, tune, and deploy both traditional machine learning and new generative AI capabilities powered by foundation models. It enables you to build AI applications in a fraction of the time with a fraction of the data.

#### watsonx.data

Scale AI workloads, for all your data, anywhere

Fit-for-purpose data store, built on an open lakehouse architecture, supported by querying, governance and open data formats to access and share data.

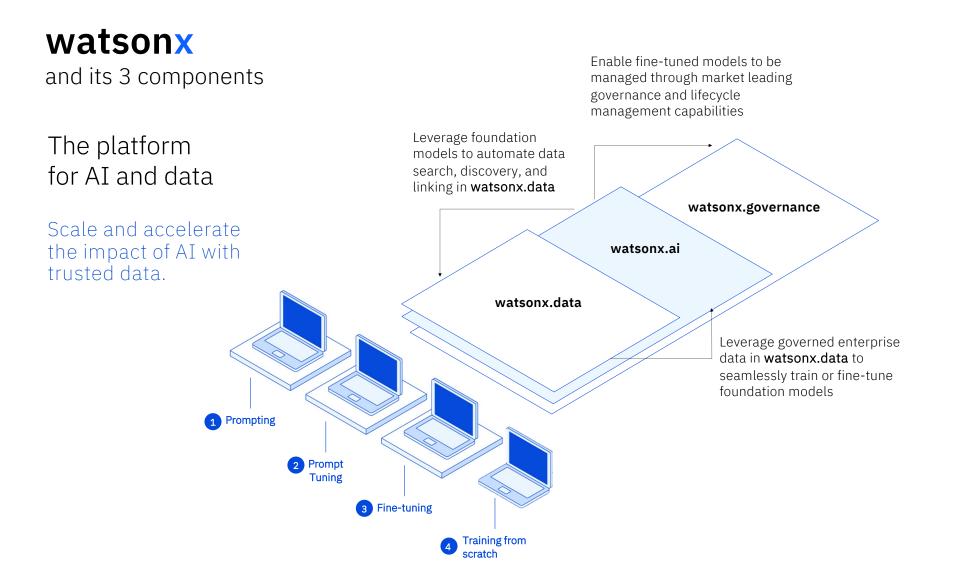
#### watsonx.governance

Enable responsible, transparent and explainable AI workflows

End-to-end toolkit encompassing both data and AI governance to enable responsible, transparent, and explainable AI workflows.

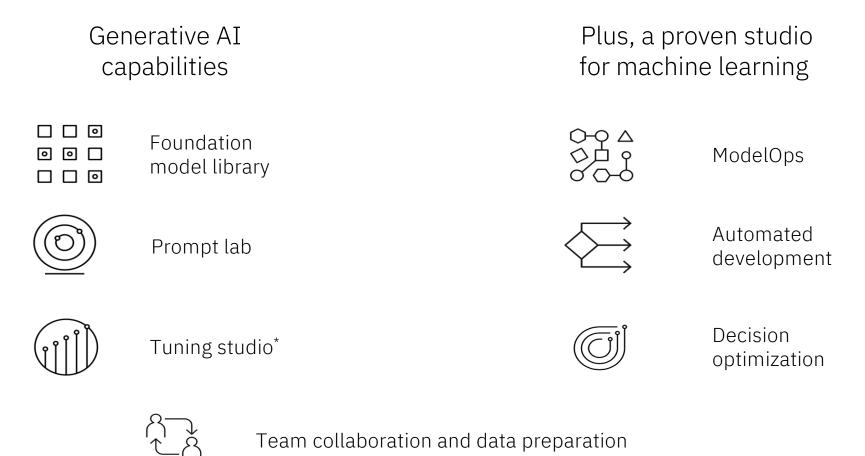
# Unleash the intelligence in your business with IBM Software

AI products	Digital Labor Watson Orchestrate Watson Assistant Watson Code Assistant Watson Discovery Planning Analytics	<b>IT Automation</b> Turbonomic Instana AIOps Insights Hybrid Cloud Mesh SevOne	<b>Security</b> QRadar Randori Recon Guardium MaaS360   Verify Trusteer	Sustainability Envizi EIS Maximo Sterling	Application Modernization API Connect App Connect Event Automation	Software and SaaS partners
AI and data platform	watsonx.ai watsonx.data watsonx.governance Cloud Paks					
Hybrid cloud platform	Red Hat OpenShift Enterprise Linux Ansible Automation Pla	ıtform				



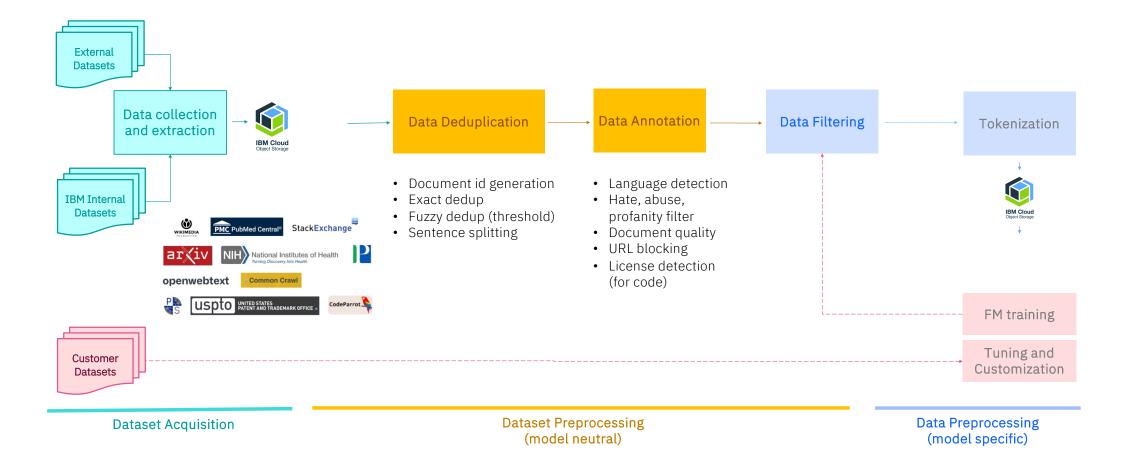
### watsonx.ai – generative AI with traditional AI features

Train, validate, tune, and deploy AI models with confidence



### watsonx.data: curated IBM Data Pile

Enterprise-ready data acquisition, curation, provenance, and governance



### Foundation model libraries

IBM watsonx.ai provides open foundation models as well as IBM's securely trained models including encoder, decoder, & encoder-decoder foundation models.

#### Encoder

Powers search engines and customer-service chatbots, including <u>IBM Watson Assistant</u>.

Encoder-only models are widely used for non-generative tasks like classifying customer feedback and extracting information from long documents.

Encoders are not trained to predict, but rather to find & extract useful information from models trained with relatively smaller sets of data.

Google's Bidirectional Encoder Representation from Transformer (BERT) is an example

#### Decoder

Trained to predict the next word without an encoded representation.

Decoder-only models are used with chat platforms like ChatGPT to generate new responses, answers, or text based on simple input from customers.

Decoders are trained for predictive, generative tasks based on their massive pre-trained data sets.

The Generative Pre-Trained Transformer (GPT) is an example

#### Encoder-decoder

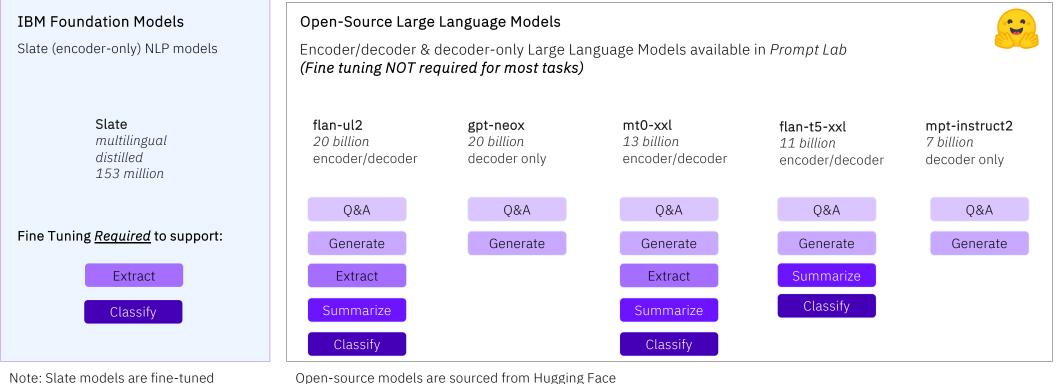
Combines features of both encoder and decoder models.

They can do many of the generative tasks that decoder-only models can, but their compact size makes them faster and cheaper to tune and serve.

Google's Text-to-Text Transfer Transformer (T5) is an example.

### watsonx.ai Foundation Model Library

Model variety to cover enterprise use cases and compliance requirements



Note: Slate models are fine-tuned via notebooks + API



Model responds to a question in natural language Model generates content in natural language Extract Summarize

Model extracts entities, facts, and info. from text

Classify

Model classifies text (e.g. sentiment, group, etc..)

Immarize Model creates summaries of natural language

### watsonx.ai and its own foundation models

Model architectures	Architecture name	Use case
Encoder-only	Slate (use through a Watson Studio notebook)	Best cost performance trade-off for <b>non-generative use</b> <b>cases</b> but require task-specific labeled data for fine tuning.
Decoder-only	Granite Post July 2023	Designed explicitly for <b>generative AI</b> use cases; represents the architectures used in GPT-3 and other popular LLMs.
Encoder-decoder	Sandstone Post July 2023	Support <b>both generative and non-generative</b> use cases. Best cost performance trade-off for generative use cases when input is large but generated output is small.

The initial focus is on two categories for each model: language and code. A model's name will identify its characteristics

Model naming convention: <category>/<architecture><opt sub arc>.<size>.<opt info> where the 2 initial categories are fm.code and fm.language or fm.code/<architecture> where fm is the name of the foundation model

Examples:

- fm.language/sandstone.3b is the Encoder-decoder model on language-related tasks with 3b parameters.
- fm.code/granite.350m.ansible is the Decoder model on code-related tasks with 350m parameter for ansible

### watsonx.ai Foundation Model Library

Model variety to cover enterprise use cases and compliance requirements

#### IBM models

IBM's suite of foundation models is designed to ensure model trust and efficiency in business applications. Our suite of models features:



### Transparent Pre-Training on IBM's trusted Data Lake

- One of the largest repositories of enterprise-relevant training data
- Verified legal and safety reviews by IBM
- Full, auditable data lineage available for any IBM Model



### Compute-Optimal Model Training and Architectures

- Granite Decoder only transformers
- Sandstone Encoder-decoder transformers
- Obsidian (in progress) Sparse universal transformers



#### Efficient Domain and Task Specialization

Models Coming Soon:

- Finance
- Cybersecurity
- Legal, etc.

#### Opensource models

Experiment with opensource models

...

IBM and Hugging Face partnership demonstrates our shared *commitment to delivering to clients an open ecosystem approach* that allows them to define the best models for their business needs.

#### Bring-your-own-model

Optional add-on for more flexibility Partner with IBM Research to pre-train your own foundation models.

### watsonx.ai: Prompt Lab

# Experiment with foundation models and build prompts

Interactive prompt builder

# Experiment with prompt engineering

Includes prompt examples for various use cases and tasks

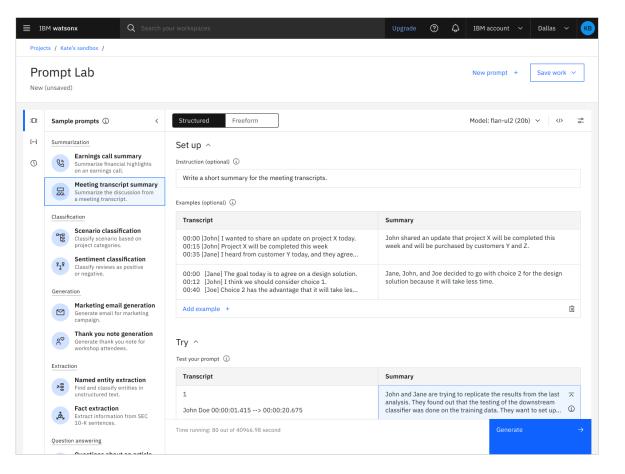
Experiment with different prompts, save and reuse older prompts, use different models and vary different parameters

Experiment with zero-shot, one-shot, or few-shot prompting to get the best results Choice of foundation models to use based on task requirements

Prevent the model from generating repeating phrases

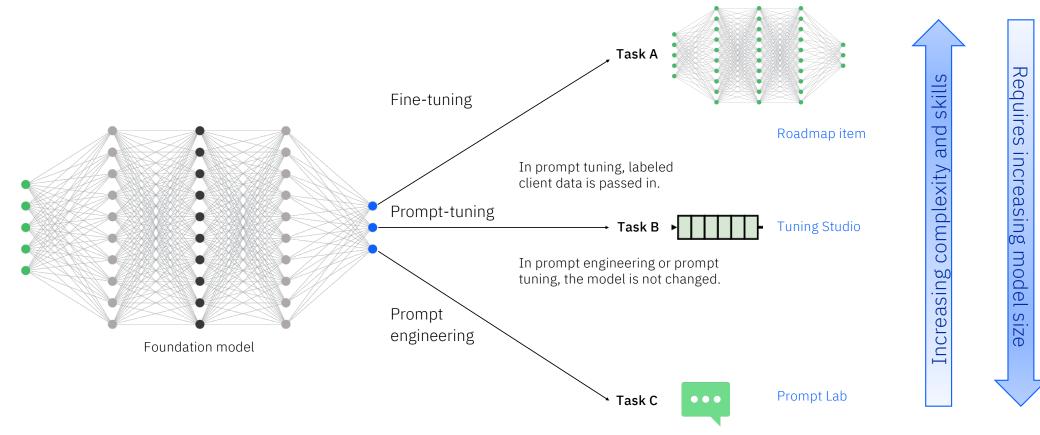
Number of min and max new tokens in the response

Stop sequences – specifies sequences whose appearances should stop the model



Rapid adaptation to multiple tasks with small amounts of task-specific data

Fine-tuning requires labeled data and more resources to tune the model. When a model is fine-tuned, some of the weights are modified and clients get a private instance of the model.





# Prompt engineering

#### Benefits to clients:

- There is no change to the model (no need for an expensive rebuild)
- No need to pass in labeled data
- Much faster way of training the prompt to properly respond to requests
- Can be passed in via APIs once a prompt has been properly engineered
- Can be used by anyone to guide the model to respond in a desirable way



#### Benefits to clients

- There is no change to the model (no need for an expensive rebuild)
- Requires labeled data but can achieve better performance even with using a smaller size model.
- Can achieve close to fine-tuning results without model modification
- Can be passed in via API
- Can be used by anyone to work with the model



# Prompt Engineering

Prompt engineering is an art – and watsonx.ai Prompt Lab provides a rich and guided learning experience. Foundation models are adaptable. One way to adapt the model is using prompt engineering.

#### What is prompt engineering?

 Prompt engineering is a new discipline for finding the optimal prompt to use with a foundation model for the best performance.

#### Why is it important?

- For most generative AI, it is not so much "answering" a question than simply appending the most likely text
- Simply asking a straightforward question may not yield the best result

- A prompt is a way to communicate with the foundation model to:
  - Pass additional instructions on how the model should respond
  - Feed task-specific context to the model
- IBM **watsonx.ai** provides a Prompt Lab with an interactive prompt builder:

•

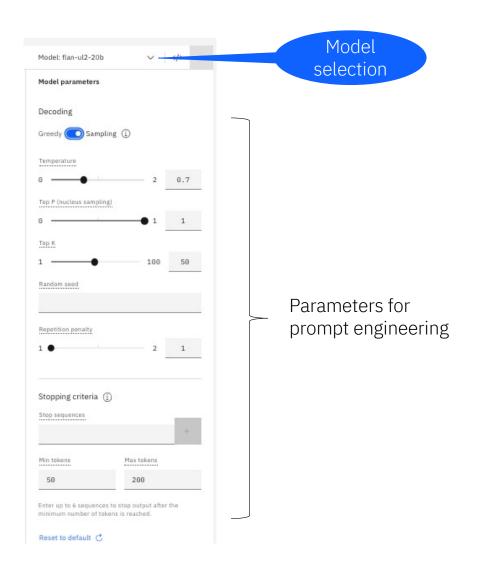
- Includes prompt examples for various use cases
- Clients can experiment with different prompts, save and reuse older prompts, use different models and vary different parameters



## Prompt Lab

The Prompt Lab allows other modifications on various parameters such as:

- Choice of foundation models to use some are better at certain tasks than others
- Types of decoding used the process the model uses to generate the output
- **Repetition penalty** prevent the model from generating repeating phrases
- Stop sequences specifies sequences whose appearances should stop the model
- Number of min and max new tokens specifies boundaries of the number of tokens in the response





# Prompt Lab: email generation

**Prompt:** Write a thank you note for attending a workshop. Attendees: Enterprise clients Topic: Introduction to IBM watsonx Tone: Appreciative

#### Output:

We would like to thank all the attendees that came out and participated in today's introduction to watsonx workshop. It was a great turnout, and you are making an impact by engaging your enterprise with Watson. Thank you for taking the time, spending the day, and sharing your experience with it. We hope that you enjoyed the workshop and learned something new. If you have any questions about watsonx, just let me know!

### Append prompt with additional context

**Prompt:** Write a thank you note for attending a workshop. Attendees: Enterprise clients Topic: Introduction to IBM watsonx Tone: Appreciative Expectation: discuss business opportunities

#### Output:

We would like to thank you for taking the time to attend our workshop today. It was a great day, and we are pleased that you were able to participate. This is an exciting time for Watson Health as we continue to expand our capabilities in clinical care, cognitive computing, analytics and mobile technology. As IBM watsonx continues to expand, we hope that you will reach out to us with questions or concerns regarding the product. In addition, we welcome feedback on how we can improve your experience with watsonx. Thank you again



# Prompt Lab: client complaint

#### The following paragraph is a consumer complaint.

The complaint is about one of these options: credit cards, credit reporting, mortgages and loans, retail banking, or debt collection. Read the following paragraph and list all the issues.

I called your helpdesk multiple times and every time I waited 10-15 minutes before I gave up. The first time I got through, the line got cut suddenly and I had to call back. This is just ridiculous. When I finally got through like after 3 days (yes, 3 days) your agent kept going over a long checklist of trivial things and asking me to verify, after I repeatedly told the agent that I am an experienced user and I know what I am doing. It was a complete waste of time. After like an eternity of this pointless conversation, I was told that an SME will contact me. That – was 2 days ago. What is the problem with your support system? In this example, a modified prompt with an example is provided to the model to teach it what is expected.

I bought a GPS from your store and the instructions included are in Spanish, not English. I have to use Google Translate to figure out. The mounting bracket was broken, and so I need information on how to get a replacement. Moreover, the information seems to be outdated because I cannot see the new roads put in around my house within the last 12 months.

The list of issues is as follows:1) The instructions are in Spanish, not English.2) The mounting bracket is broken.3) The information is outdated.

Retail banking

The next page shows the new output with this additional "one shot" input.



## Prompt Lab: client complaint continue

#### The following paragraph is a consumer complaint.

The complaint is about one of these options: credit cards, credit reporting, mortgages and loans, retail banking, or debt collection. Read the following paragraph and list all the issues.

I called your helpdesk multiple times and every time I waited 10-15 minutes before I gave up. The first time I got through, the line got cut suddenly and I had to call back. This is just ridiculous. When I finally got through like after 3 days (yes, 3 days) your agent kept going over a long checklist of trivial things and asking me to verify, after I repeatedly told the agent that I am an experienced user and I know what I am doing. It was a complete waste of time. After like an eternity of this pointless conversation, I was told that an SME will contact me. That – was 2 days ago. What is the problem with your support system?

### With the added instructions from the previous slide, this is the new output:

The list of issues are as follows;

- 1) Waited 10-15 minutes every time I called
- 2) The line got cut suddenly
- 3) The agent kept going over a long checklist of trivial things
- 4) I was told that an SME will contact me
- 5) No one called

#### This is the expected results.

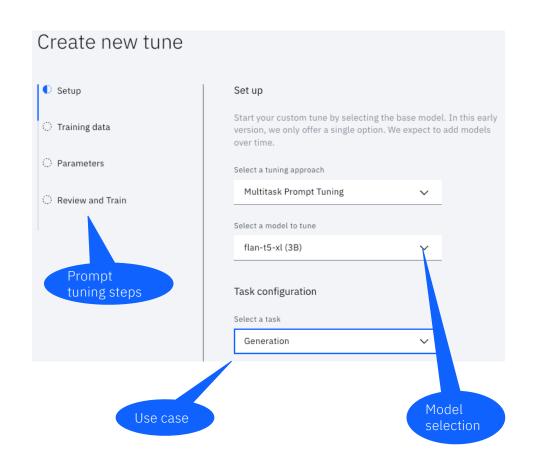
With the added instructions, the model further understands that the task is to extract a list of issues raised by the customer.



# Prompt tuning

Another useful feature of **watsonx.ai** is the prompt tuning in the tuning studio.

- Watsonx.ai allows clients to further tune the prompts
- Unlike prompt engineering, prompt tuning allows clients to further train a model with focused, business data.
- In prompt tuning, the underlying model is not changed.
- The input prompt is changed via augmenting input with examples.

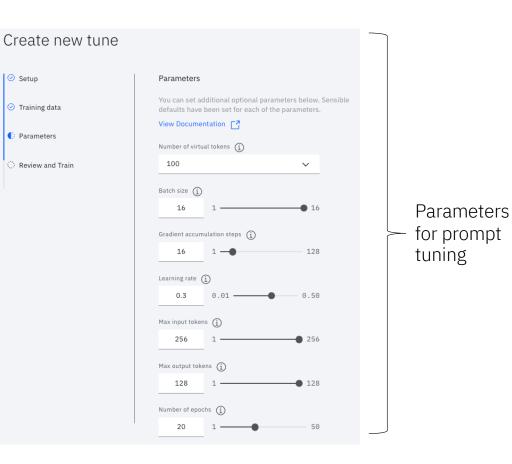




# Prompt tuning

#### Clients can:

- Name the finished model name
- Select a model to tune
- Provide their own training data
- Tune training parameters such as:
  - Batch size
  - Gradient accumulation steps
  - Learning rate
  - Max input and output tokens
  - Number of epochs
- Train and automatically deploy the model



IBM partnership with opensource models provider



### **HUGGING FACE**

- IBM watsonx.ai clients have access to the latest and greatest open-source foundation models from Hugging Face.
- The IBM and Hugging Face partnership demonstrates a joint commitment to deliver an open ecosystem to clients, allowing them to find the best foundation models for their business needs.

# watsonx.ai: Data Science and MLOps

Build machine learning models automatically in the studio

Model training and development

Build experiments quickly and enhance training by optimizing pipelines and identifying the right combination of data

AutoAI, including preparing data for machine learning and generating and ranking candidate model pipelines

Use predictions to optimize decisions, create and edit models in Python, in OPL or with natural language

Integrated visual modeling

Prepare data guickly and develop models visually to help visualize and analyze enterprise data to identify patterns and trends, explore opportunities, and make informed, insightful business decisions

- Uncover correlations
- Insight for hypotheses ٠
- Find relationships and • connections within the data

What do you want to Select a task based on your goal. You		that goal.		Open in: Kate's sandbox 🗸
All	Q. Search for a task or tool			All coding types $$
Prepare data				
Work with models	Prepare data 🛈			
Automate model lifecycle	Q AI	AI AI		
	Connect to a data source	Prepare and visualize data		
	with Connections	with Data Refinery		
	Work with models ③			
	[••••] AI	AI	AI	IA
	Experiment with foundation models and build prompts	Build machine learning models automatically	Build models as a visual flow	Work with data and models in Python or R notebooks
	with Prompt Lab	with AutoAI	with SPSS Modeler	with Jupyter notebook editor
	AI Solve optimization	AI Train models on	AI AI Write R notebooks and	
	problems	distributed data	script	

## watsonx.ai: Tuning Studio\*

Tune your foundation models with labeled data

#### Prompt tuning

Efficient, low-cost way of adapting an AI foundation model to new downstream tasks

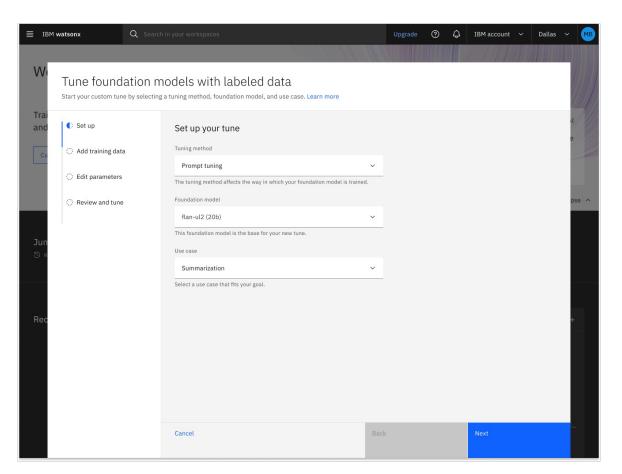
Tune the prompts with no changes to the underlying base model or weights

Unlike prompt engineering, prompt tuning allows clients to further train the model with focused, business data Task support in the Tuning Studio

Models support a range of Language Tasks: Q&A, Generate, Extract, Summarize, Classify

Requires a small set of labelled data to perform specialized tasks

Can achieve close to finetuning results without model modification, at a lower cost to run



\*Coming soon, available post-GA

### watsonx.ai differentiators

### Open

#### Built on open technologies

- IBM's hybrid cloudnative stack based on Red Hat OpenShift enables a flexible and secure deployment of watsonx.ai.
- Hugging Face partnership provides access to the best open-source model collection.

### Trusted

- IBM's suite of foundation models is designed to **ensure model trust** and efficiency in business applications.
- Models trained with scrutinized and copyright-free data
- Tight integration with watsonx.governance provides clients with a trusted pathway to operationalize AI confidently and at scale.

### Targeted

- Designed for targeted business use cases, that unlock new value.
  - On-prem, hybrid cloud and IBM Cloud
  - Designed for scalability
  - Right model for the right task
- Industryleading support for use case implementations.

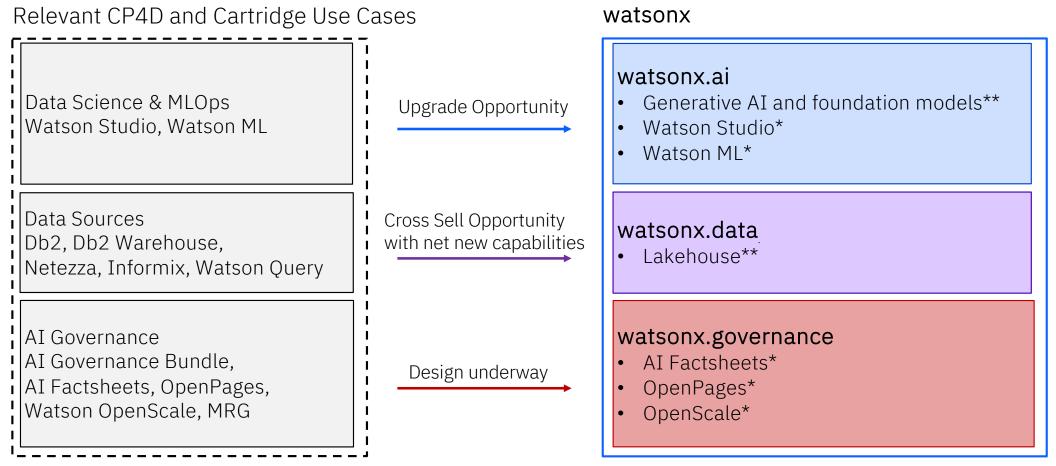
### Empowering

- For value creators, not just users
  - Tunable models at a fraction of the cost & time
  - Deploy anywhere
- An enterprise studio that allows clients build their own differentiated AI assets with their own proprietary data, creating a competitive edge.

### Why IBM?

- **Open Hybrid and Multicloud capabilities -** Can work on cloud platform of choice for client as well as on-prem (in future). No cloud vendor lock-in
- **Trusted Market leader Governance** Provides tooling and capabilities for end-to-end Data and AI governance.
- **Trusted IBM Foundation models** are trained on data which is checked and curated by legal and ethical teams and uses HAP filters, so that you can completely trust the data on which they are build.
- Empowering Integrated capabilities for generative AI and traditional AI
- **Empowering** Complete and Integrated capabilities for AI, Data and Governance.
- **Targeted IBM's Prompt Tuning** uses Multitask Prompt Tuning, developed by **MIT IBM Watson AI Labs** which is efficient, low-cost way, of adapting an AI foundation model to your custom tasks, using lesser training data and much lesser cost compared to fine tuning approach and still able to provide at par results with fine tuning models.
- **Targeted** IBM is creating smaller foundation models which can be effective for specific tasks. Idea is to use diff models for diff tasks at much lower cost instead of using one large model for all the use cases.

### Connecting current software portfolio with **watsonx**



\* capabilities that will be enhanced in **watsonx** 

\*\* brand new capabilities to watsonx

watsonx.ai is helping companies custom-build AI solutions to suit their specific needs.



Leveraged **watsonx.ai** foundation models to train their AI to create tennis commentary. Generated informative and engaging video clip narrations for fans with varied sentence structures and vocabulary.



#### **SAMSUNG SDS**

Exploring **watsonx.ai** generative AI capabilities for new solutions such as SDS's Zero Touch Mobility to deliver unprecedented product innovations to improve client experience.

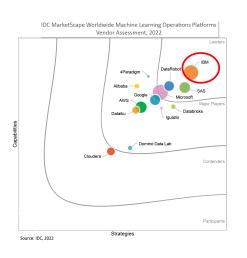
### TechD

Using **watsonx.ai** to slash delivery time from 3-4 months down to 3-4 weeks for many customer care use cases.

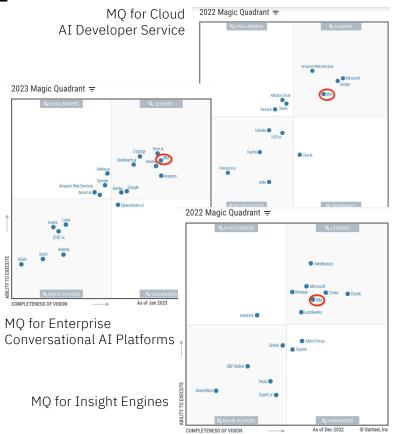
### 🗲 Seismic

An early adopter of generative AI, has been exploring watsonx.ai to improve content discoverability, summarization and classification of data to enhance productivity.

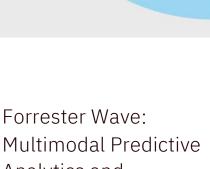
### IBM is a leader in AI



IDC Marketscape: Leader in Worldwide Machine Learning Operations Platforms 2022 Vendor Assessment



Multiple Gartner Magic Quadrants for AI-related capabilities



- Altai

Analytics and Machine Learning

### Call to action



- Challenge yourself to deliver a watsonx briefing for each of your clients
- Leverage the <u>watsonx.ai Sales Kit</u>, <u>generative AI whitepaper</u> and <u>watsonx.ai video</u> on seismic
- Engage clients in watsonx.ai pilot: <u>https://ibm.biz/watsonx-pilot</u>



Get Prepared - Complete required learning & earn your **watsonx.ai** sales foundation badge

- <u>AI Fundamentals</u>
- -<u>AI for Business</u>
- <u>watsonx.ai Level 2</u>
- watsonx.data Level 2



Participate in the **watsonx** challenge – Coming Soon...



# Backup

Supervised and Self Supervised Learning → What's the difference?

### Supervised learning

Human powered

Requires intense labeling

Long, hard, expensive

# Self-supervised learning

Computer powered

Requires little labeling

Quick, automated, and efficient

### Leveraging foundation model capabilities across various domains

	Customer Care Watson Assistant, Cloud Pak for Data	Digital Labor Watson Orchestrate, Cloud Pak for Integration/Automation, Wisdom in Ansible	<mark>IT Operations</mark> Turbonomic, Instana, Cloud Pak for Watson AIPOs	<mark>Cybersecurity</mark> QRadar, Cloud Pak for Security
Summarization Summarizing large documents, conversations, and recordings to key takeaways	<ul> <li>Call center transcripts</li> <li>Omnichannel journey summary</li> <li>Summarizing search snippets to augment chatbots</li> <li>Summarize events, analyst reports, financial info etc. for advisor</li> <li>Sentiment analysis</li> </ul>	<ul> <li>Summarize documents, contracts, technical manuals, reports, etc.</li> <li>Transcribe videos to text and summarize</li> <li>Summarizing reports on Form 10K</li> </ul>	<ul> <li>Summarize alerts, technical logs, tickets, incident reports, etc.</li> <li>Summarize policy, procedure, meeting notes, etc.</li> <li>Vendor report QBR summarization</li> </ul>	<ul> <li>Summarize security event logs</li> <li>Summarize steps to recap security incident</li> <li>Summarize security specs</li> </ul>
<b>Extraction</b> Extract structured insights from unstructured data	<ul> <li>Extracting interaction history with clients</li> <li>Extract information from specific types/categories of incidents</li> </ul>	<ul> <li>Extract answers and data from complex unstructured documents</li> <li>Extract information from media files such as meeting records, audio, and video</li> </ul>	<ul> <li>Extract key information from various sources for report automation</li> <li>Extract relevant system/network information for administration, maintenance, and support purpose</li> </ul>	<ul> <li>Extract information from incidents, content for security awareness</li> <li>Extract key security markers and attributes from new threat reports.</li> </ul>
<b>Generate</b> Generate AI to create text	<ul> <li>User stories, personas</li> <li>Create personalized UX code from experience design</li> <li>Training, and testing data for chatbots</li> <li>Automate responses to emails and reviews</li> </ul>	<ul> <li>Automate the creation of marketing material and language translation</li> <li>Automate image, text, and video creation for articles, blogs, etc.</li> <li>Create automation scripts for various workflows across applications</li> </ul>	<ul> <li>Create technical document from code</li> <li>Automate scripts to configure, deploy, and manage hybrid cloud</li> <li>Co-pilot to create code across multiple programming languages</li> </ul>	<ul> <li>Automate report generation</li> <li>Social engineering simulation</li> <li>Security documentation creation</li> <li>Automate threat detection by looking for anomaly patterns</li> </ul>
<b>Classify</b> For sentiment or topics	<ul> <li>Classify customer sentiments from feedback or chatbot interaction</li> <li>Classify typical issues raised by clients for focused improvements</li> </ul>	<ul> <li>Classify documents by different criteria – types, contents, keywords</li> <li>Sort digital contents in storage into pre-defined categories</li> </ul>	<ul> <li>Classify incident reports</li> <li>Automate workflow based on analysis of items/status/reports</li> </ul>	<ul> <li>Classify flagged items properly as threats or other categories</li> <li>Classify the type of security risks and find the best response</li> <li>Classify log and other monitoring output to determine the next action</li> </ul>
<b>Question answering</b> Knowledge base search across the company's proprietary data.	<ul> <li>Knowledgebase articles</li> <li>Augment chatbot w/search</li> <li>Agent assist</li> <li>Contract intelligence</li> <li>mart search in technical manuals, HR documents, ethics codes, product documentation, etc.</li> </ul>	<ul> <li>Analyze emails, attachments, documents, invoices, reports, etc.</li> <li>Knowledge search for company information to provide in-house day-to-day assistance and automation</li> </ul>	<ul> <li>Knowledge search for IT helpdesk</li> <li>Ticket resolution by suggesting solutions from resolved tickets</li> <li>Error log and root cause analysis</li> <li>Compliance monitoring</li> </ul>	<ul> <li>Knowledge search across security spec documents</li> <li>External threat intelligence</li> <li>Error log and root cause analysis</li> <li>Security incident search @ forensics</li> </ul>

