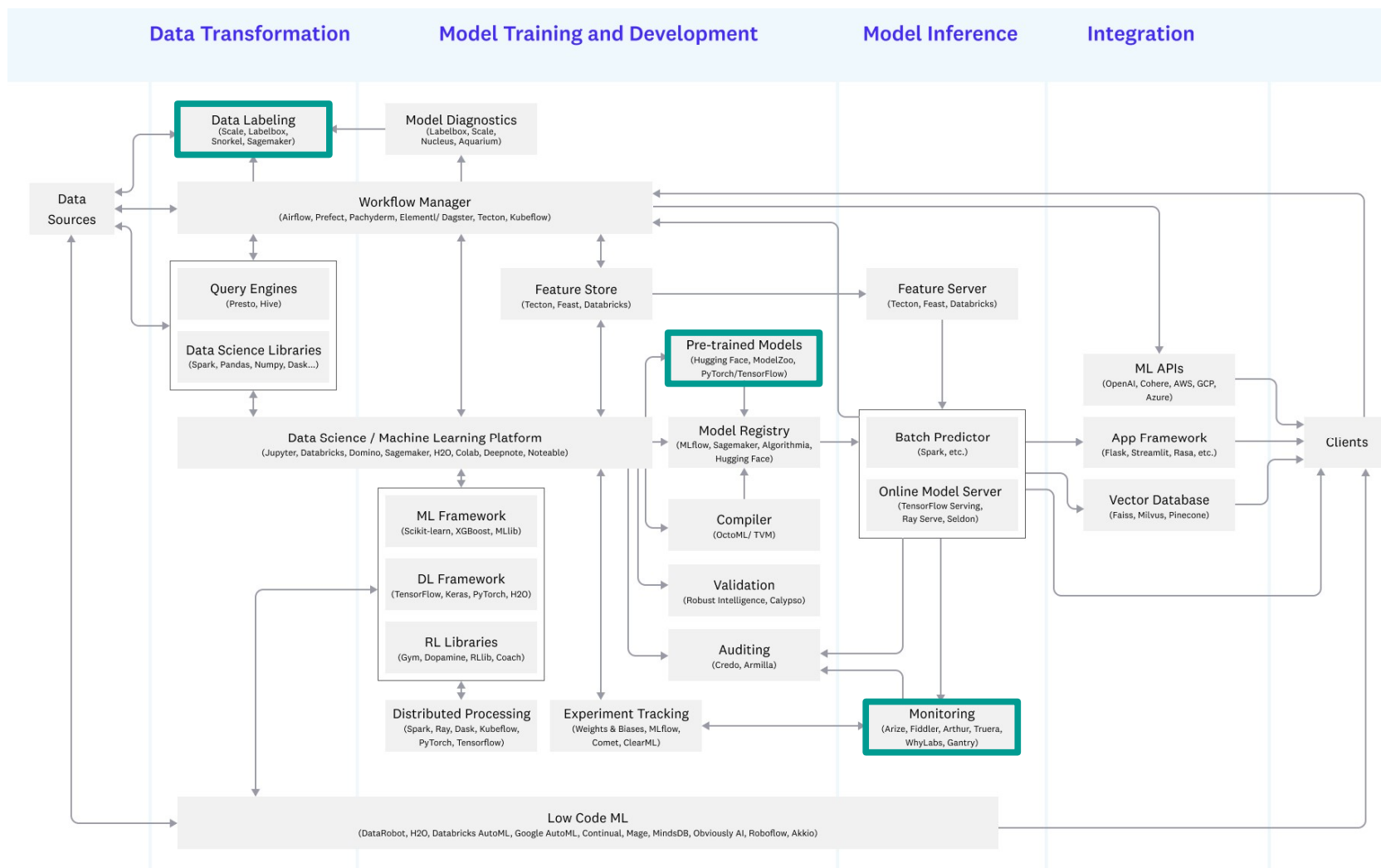


MSI-Seminar MLOps

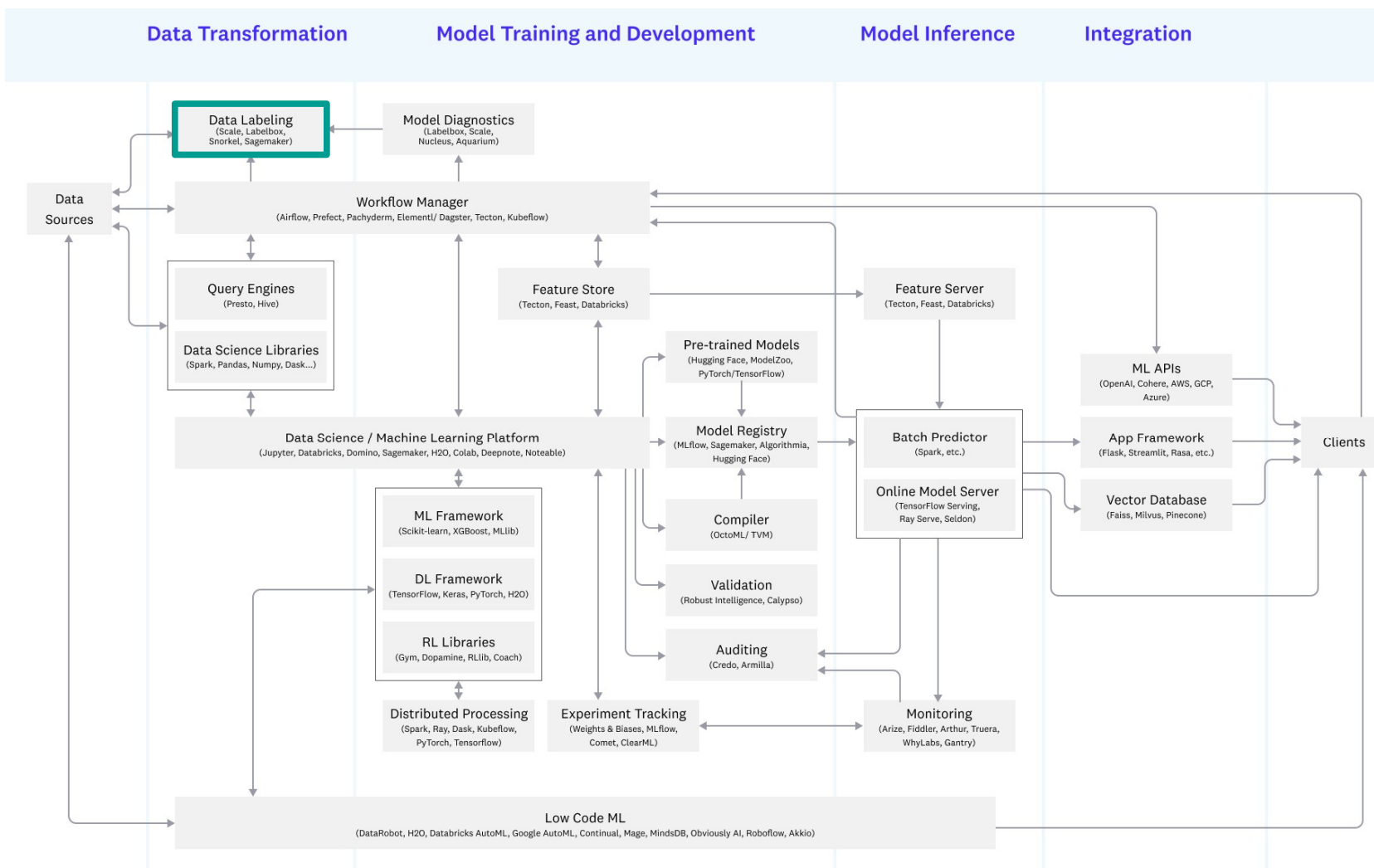
Data Labeling

Leon Auer

Machine Learning Infrastructure (2.0)



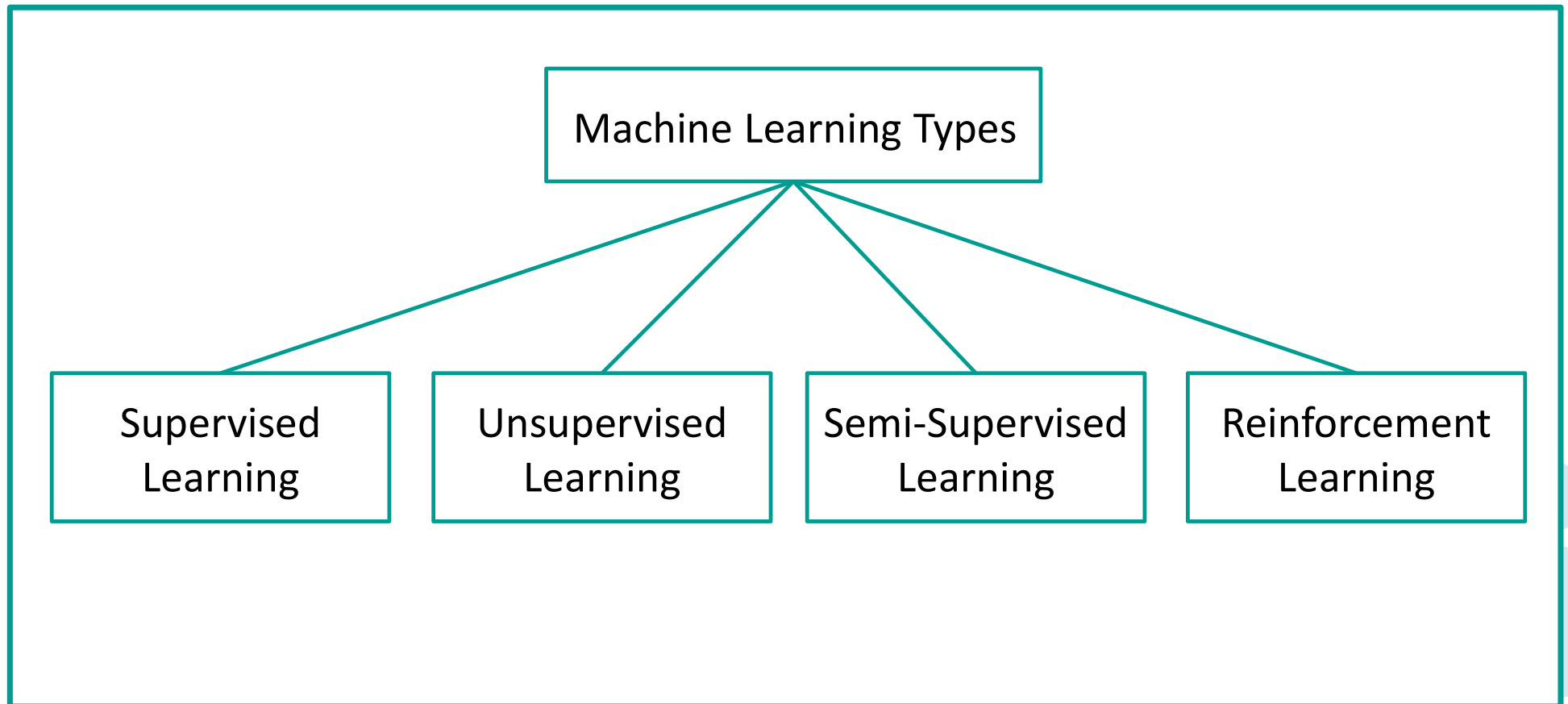
Machine Learning Infrastructure (2.0)



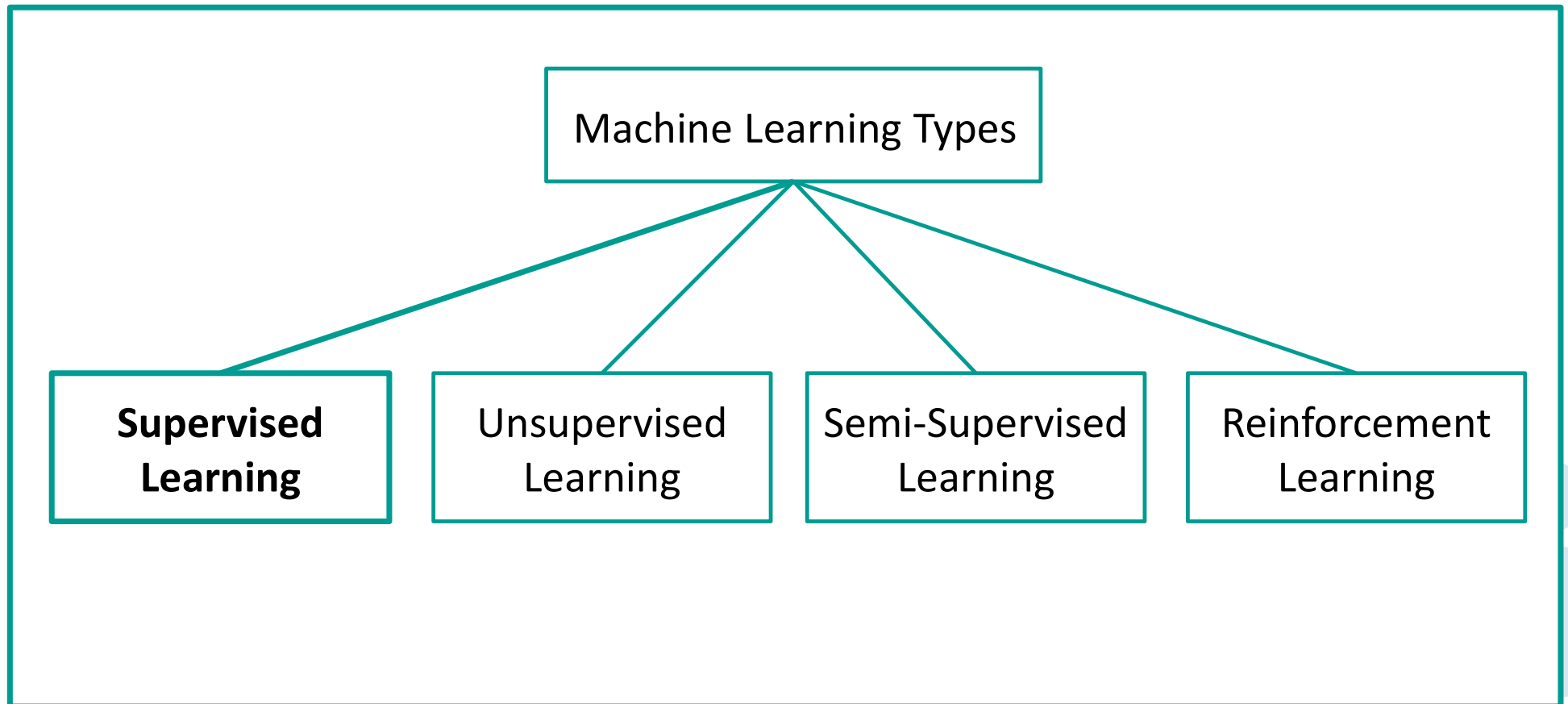
Agenda



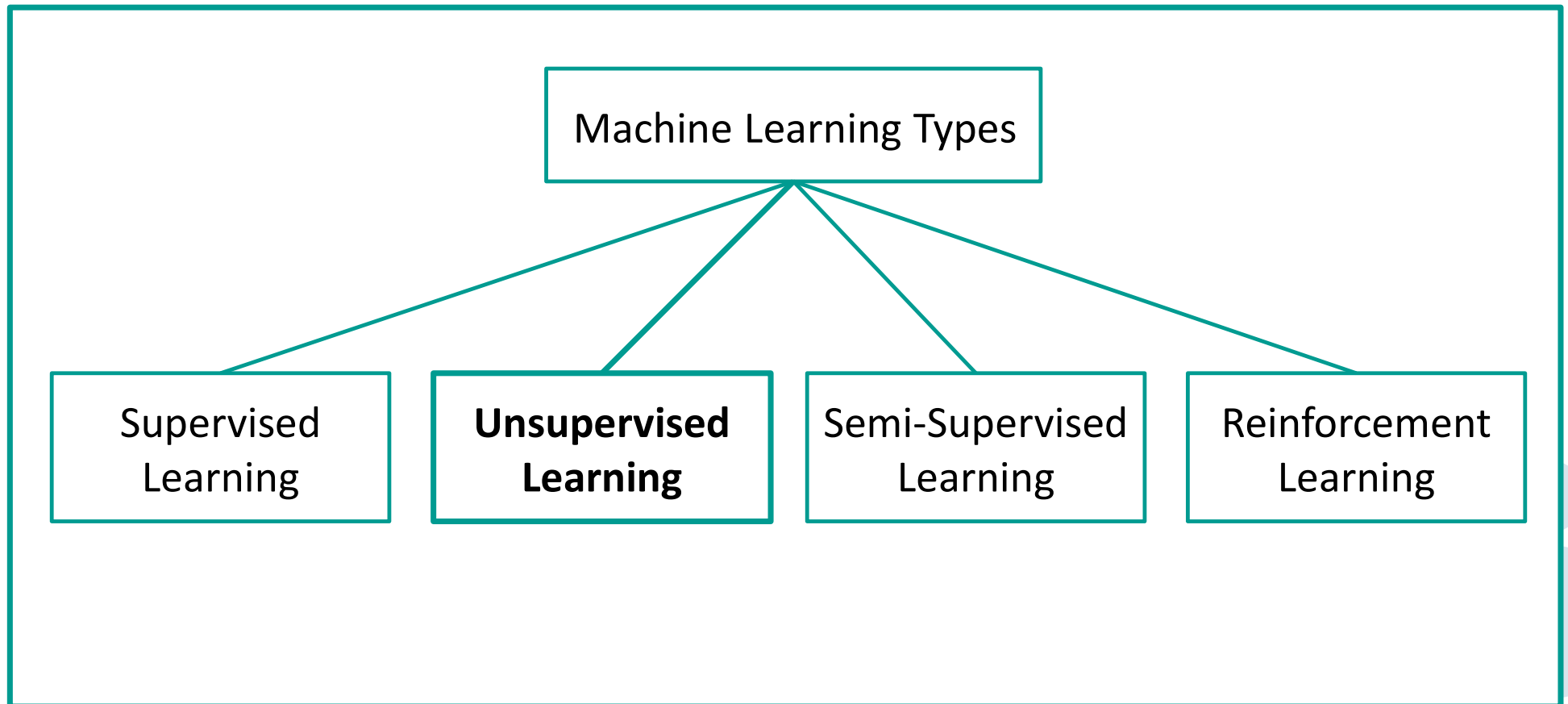
Types of Machine Learning



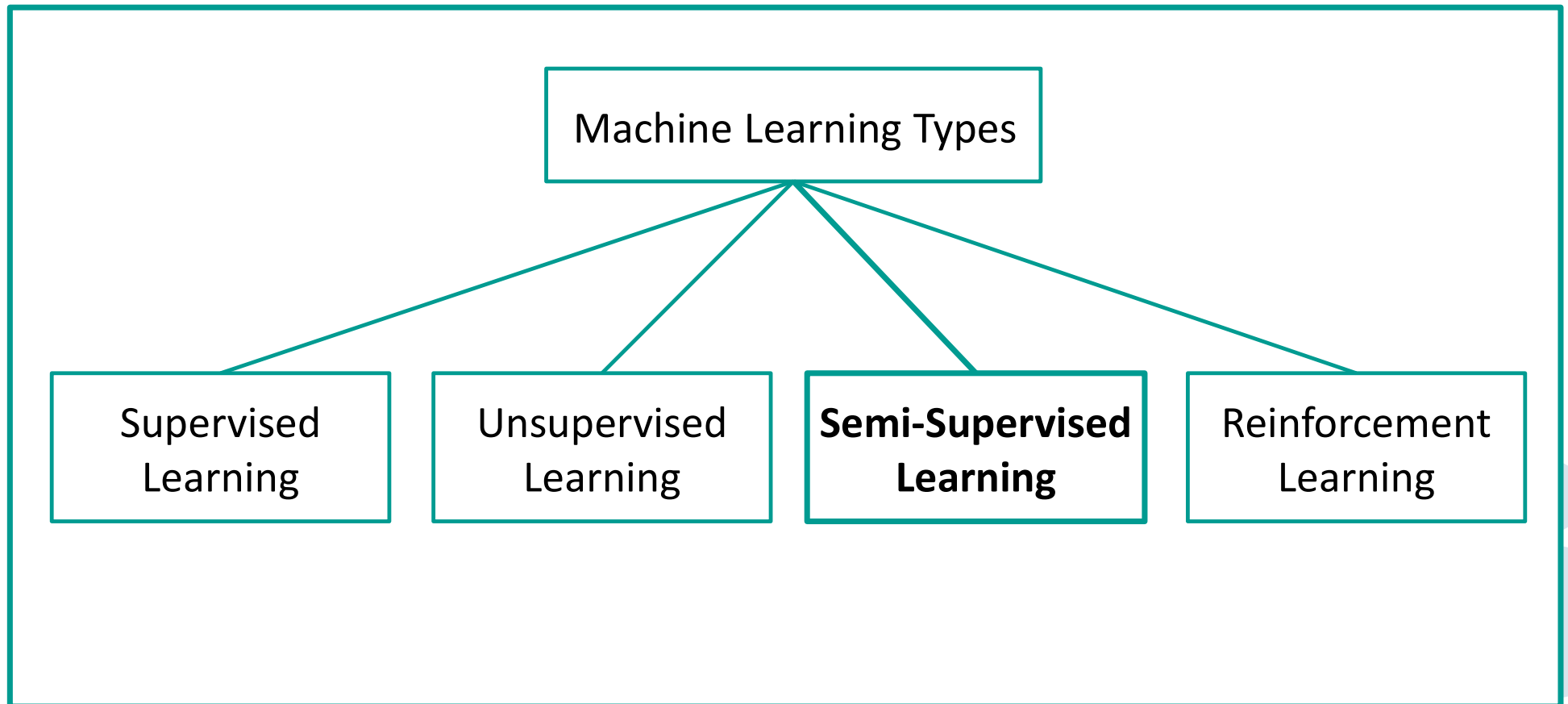
Types of Machine Learning



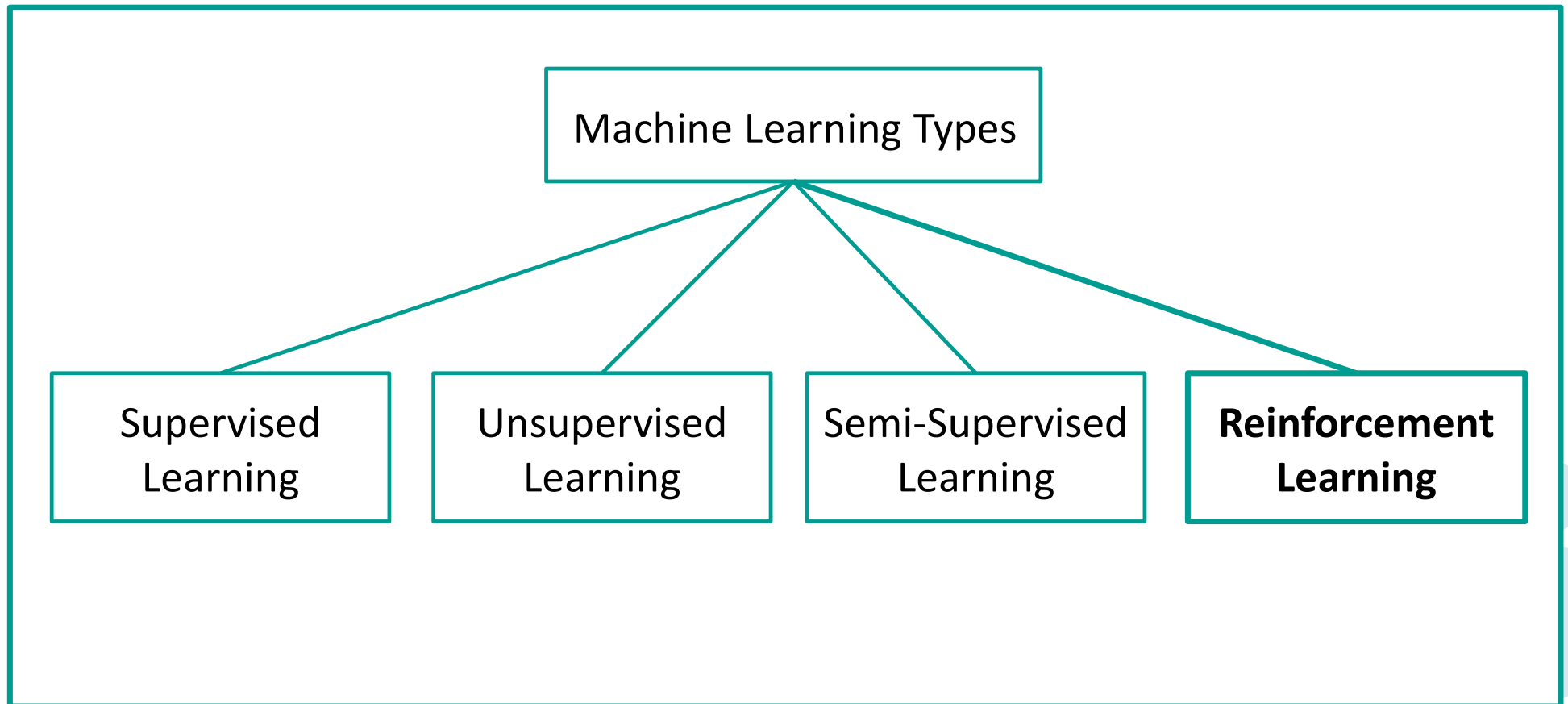
Types of Machine Learning



Types of Machine Learning



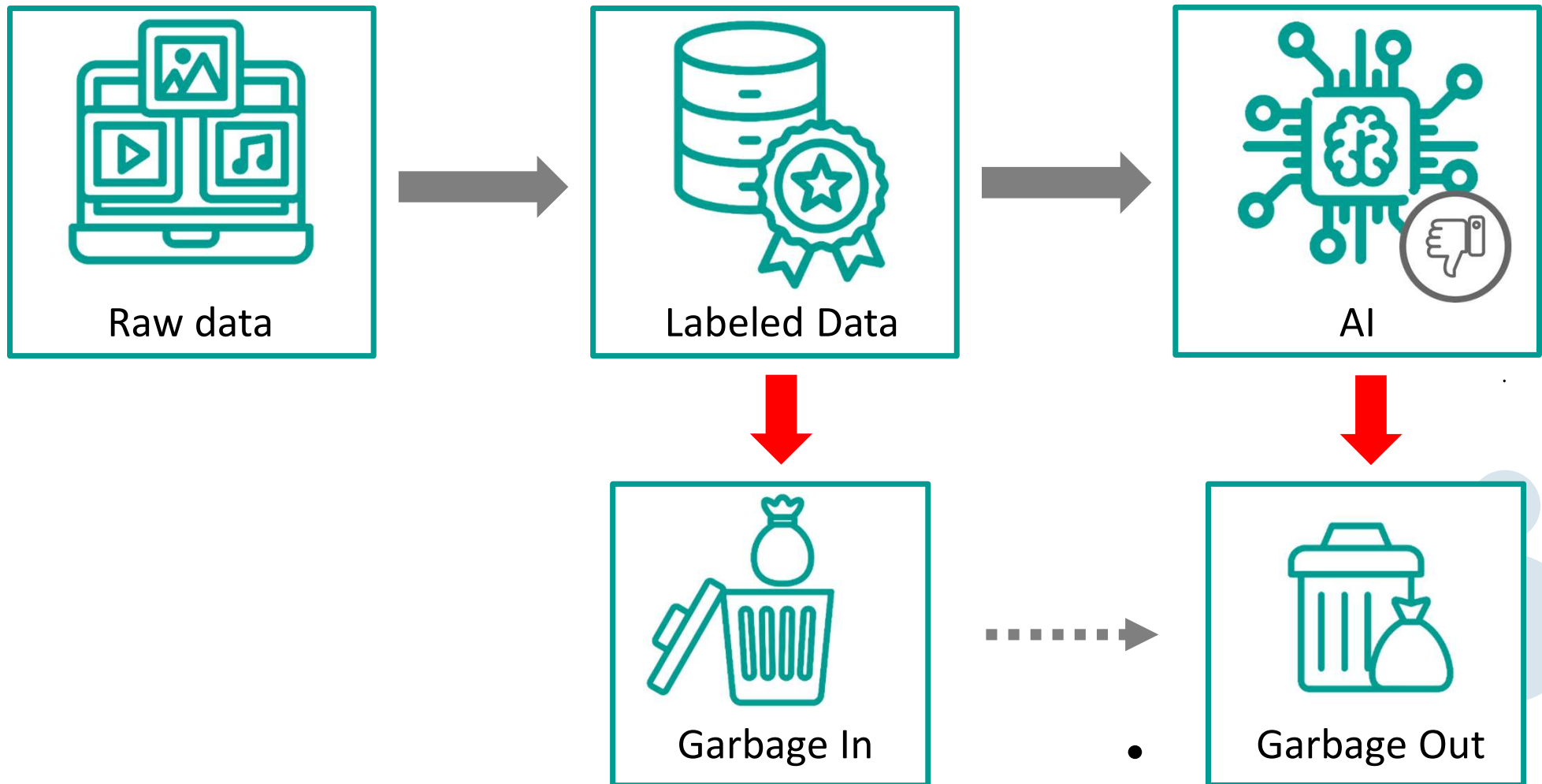
Types of Machine Learning



Data Labeling - Basics

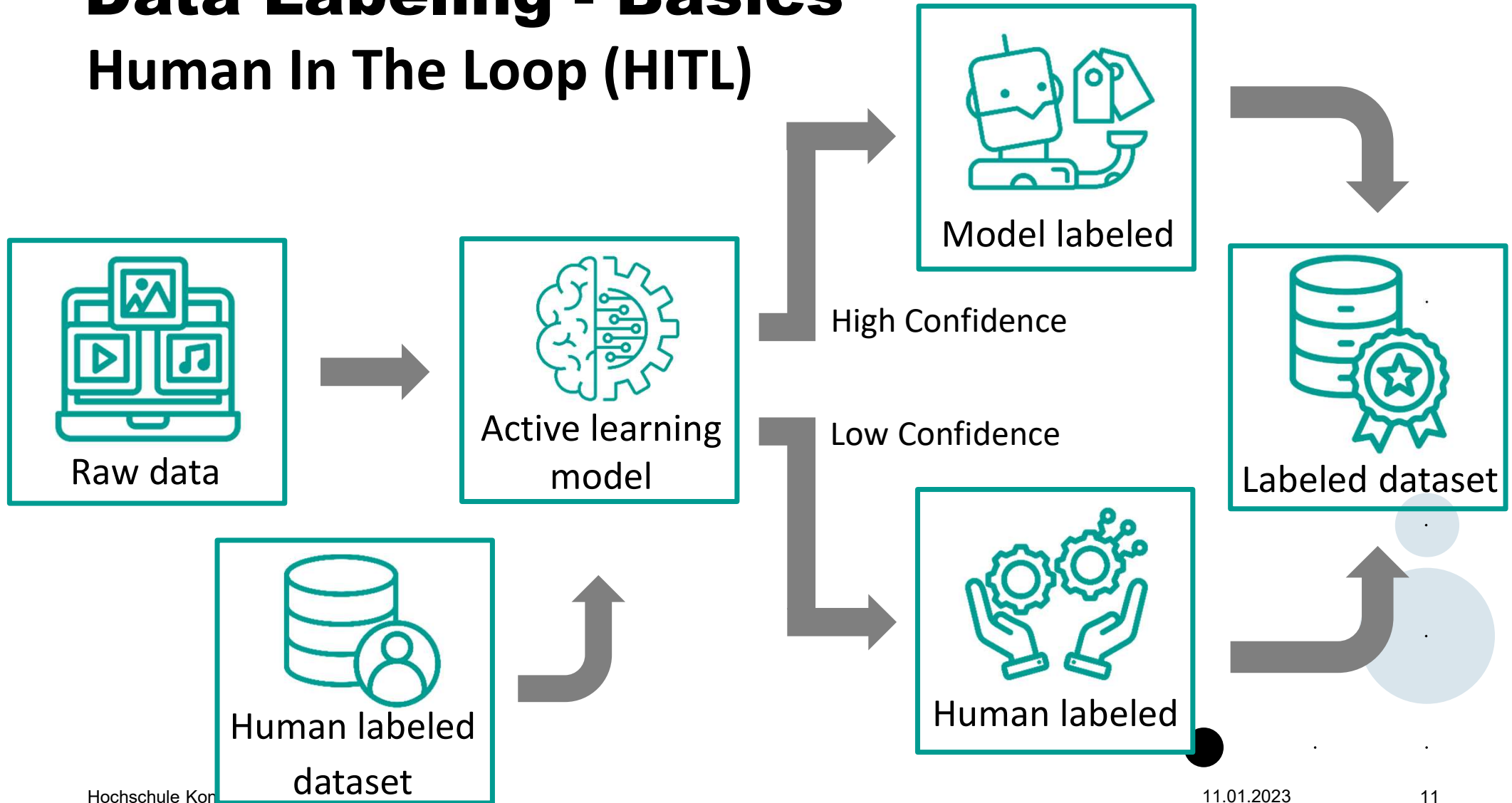


Data Labeling - Basics

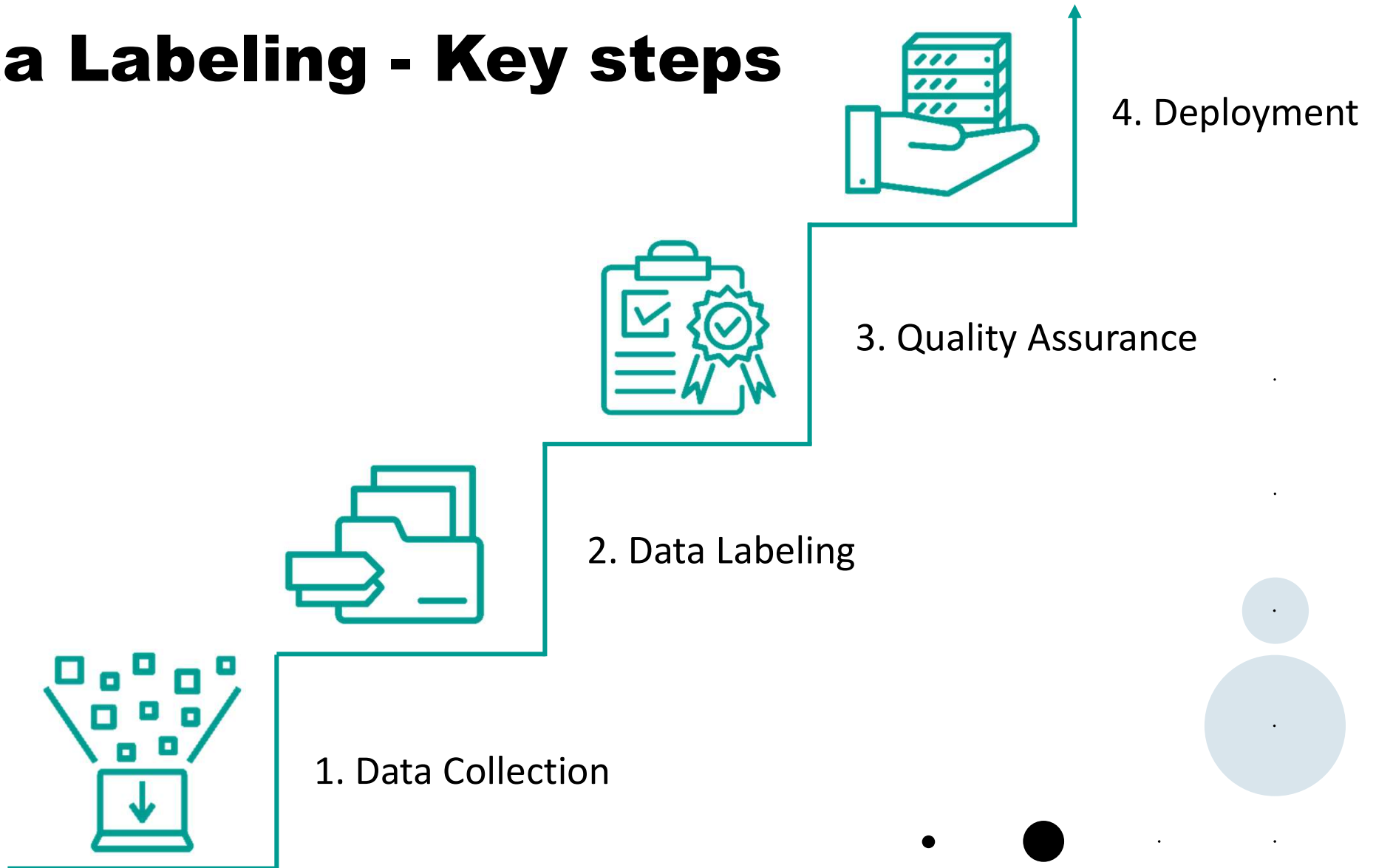


Data Labeling - Basics

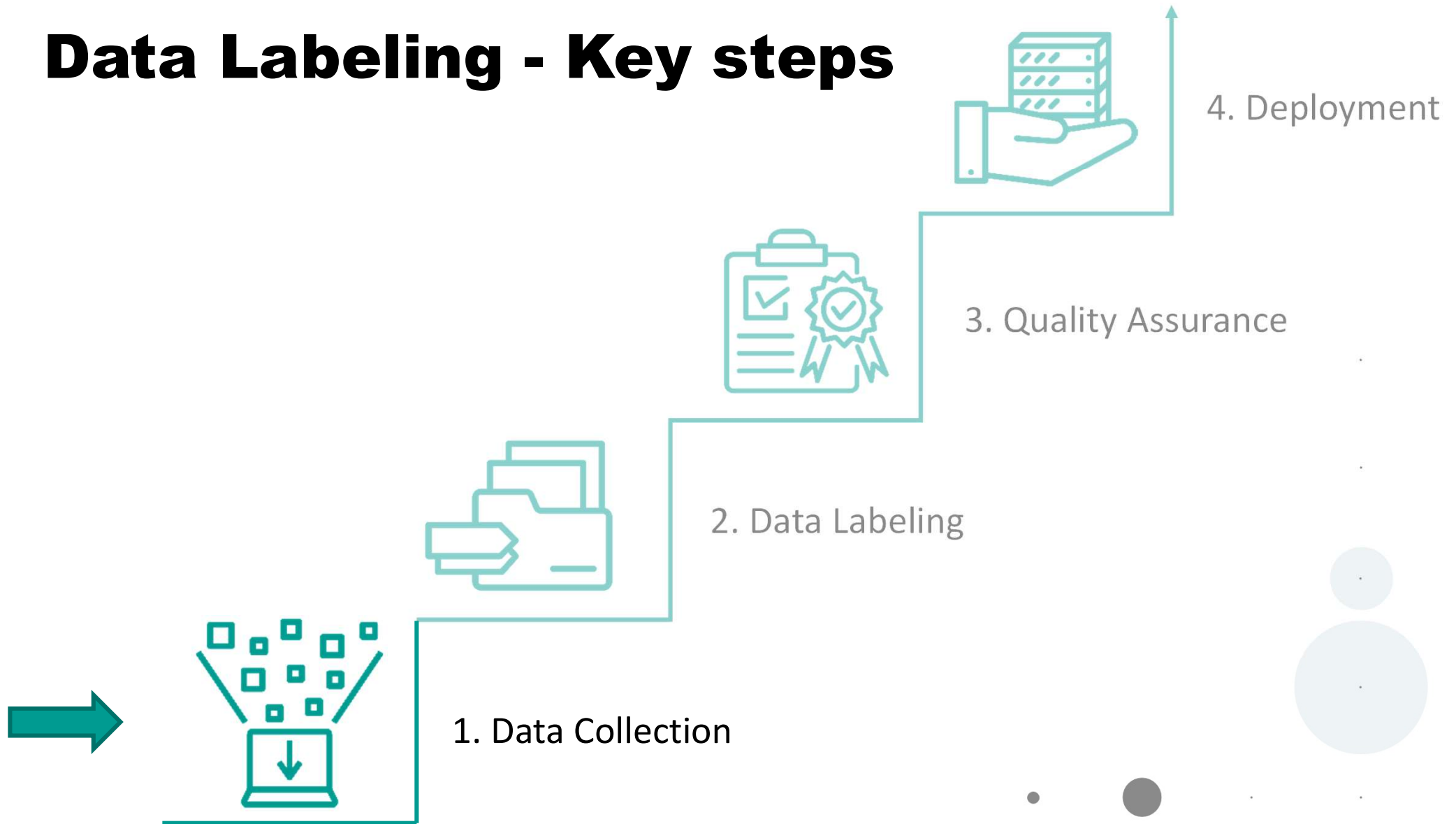
Human In The Loop (HITL)



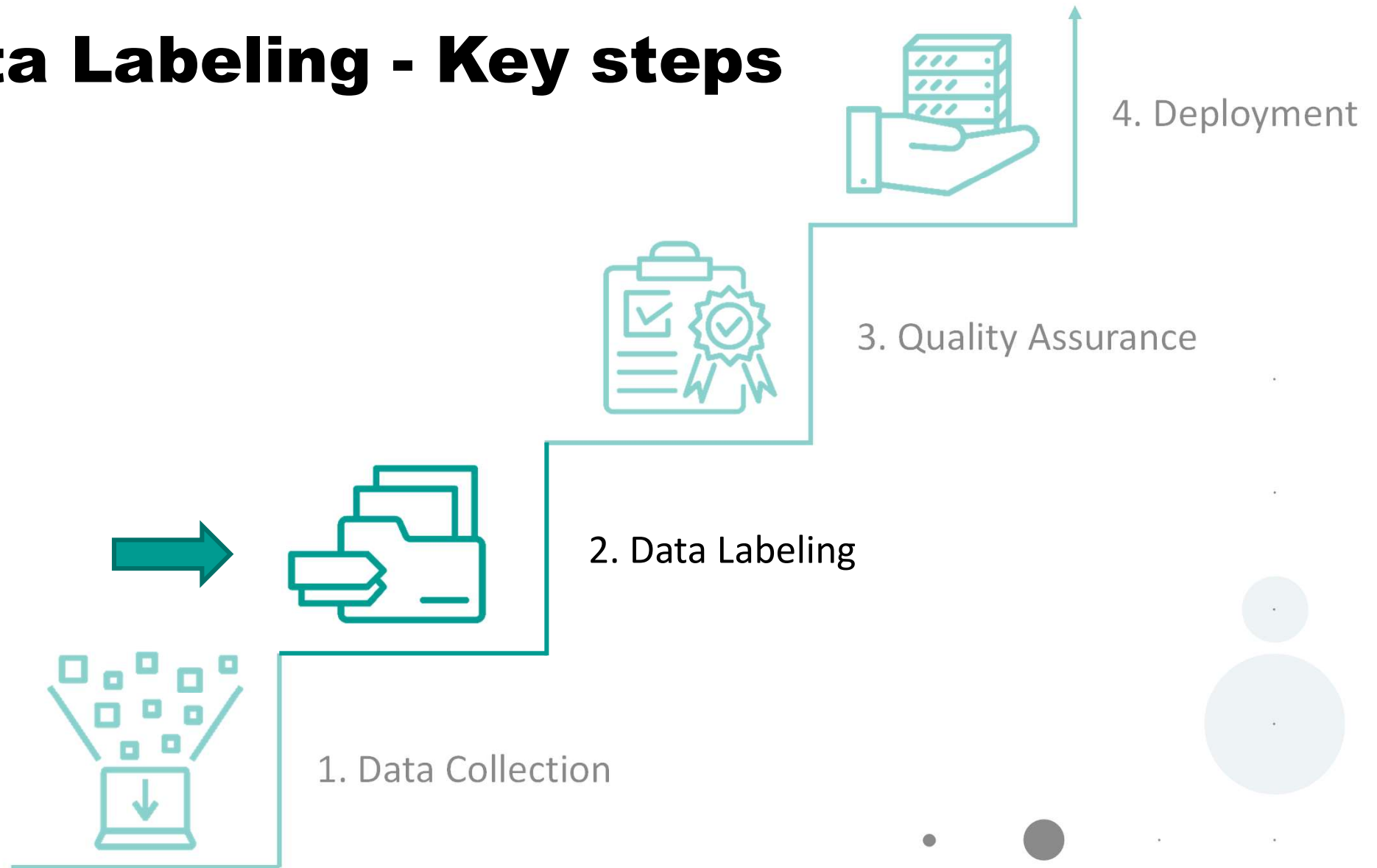
Data Labeling - Key steps



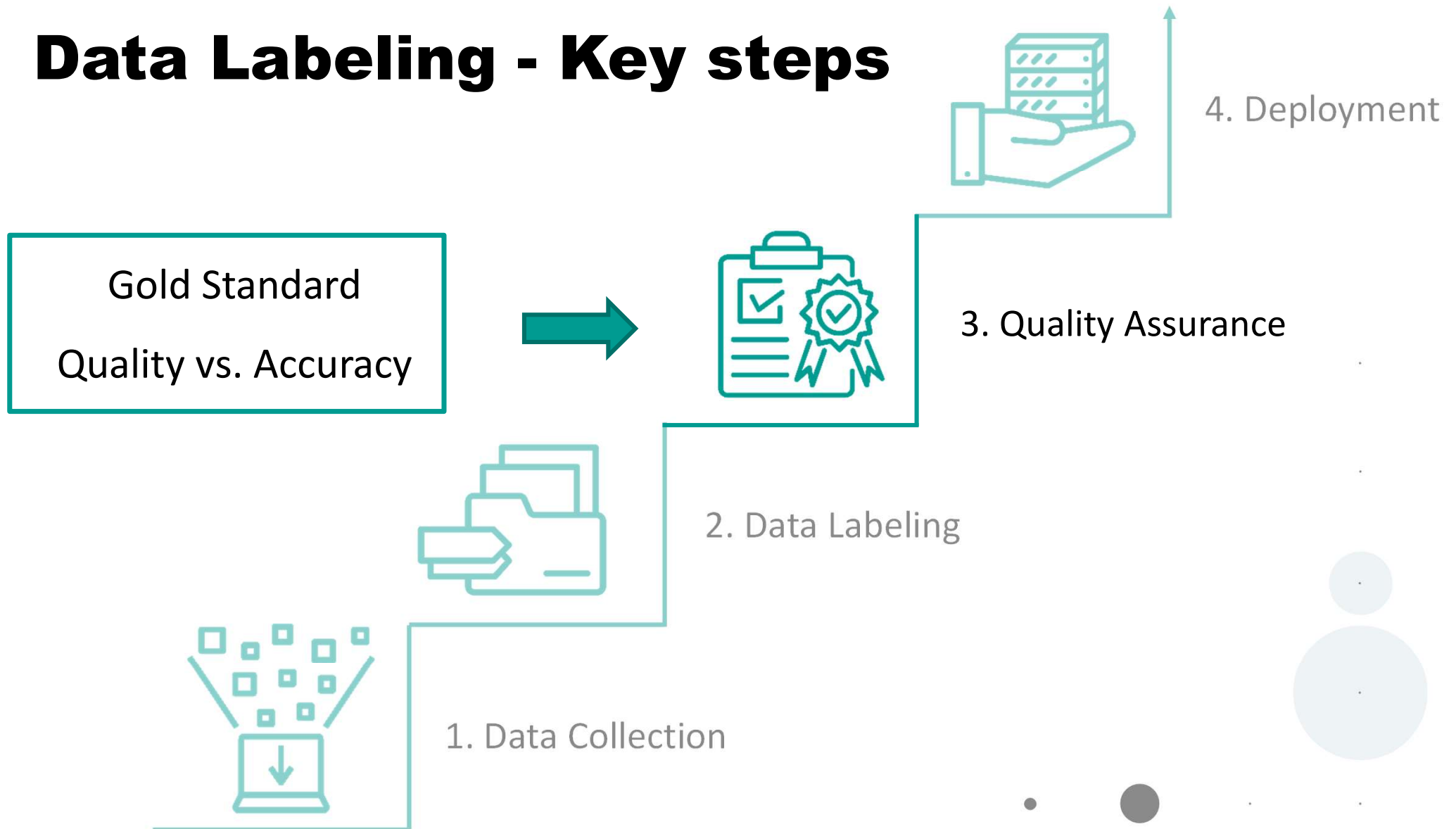
Data Labeling - Key steps



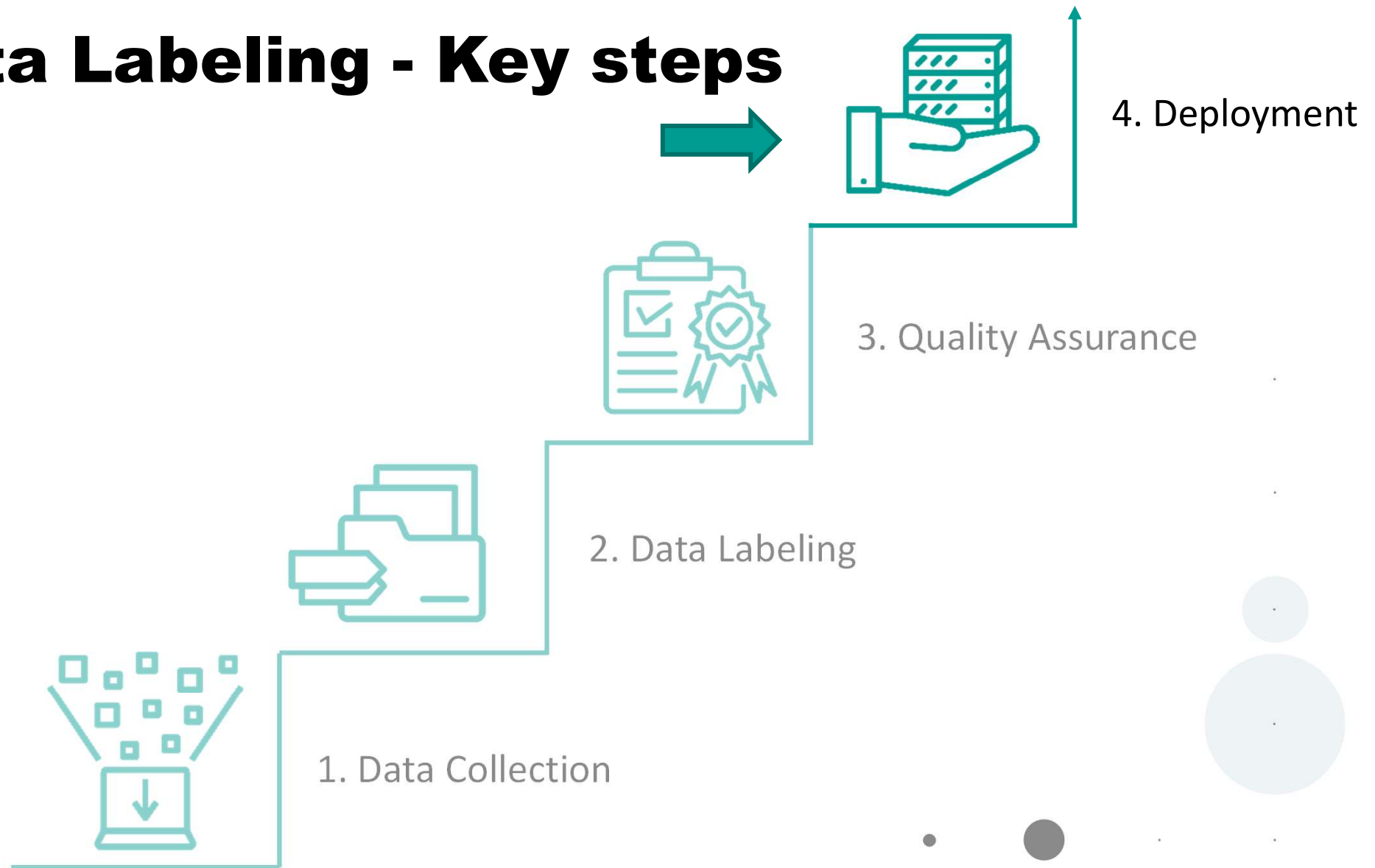
Data Labeling - Key steps



Data Labeling - Key steps

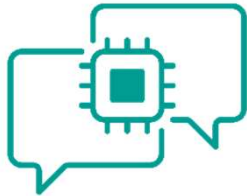


Data Labeling - Key steps



Data Labeling - Types

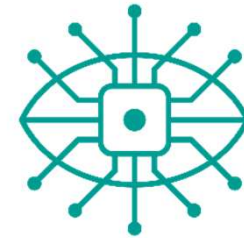
**Natural Language
Processing (NLP)**



Audio Processing

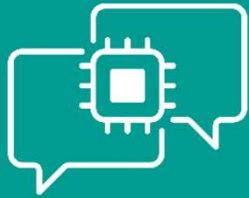


Computer Vision (CV)



Data Labeling - Types

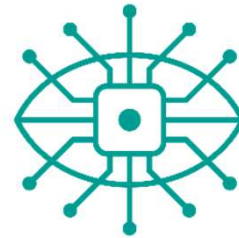
Natural Language Processing (NLP)



Audio Processing



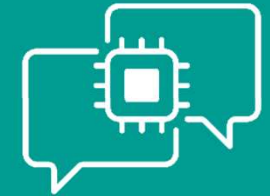
Computer Vision (CV)



Text Labeling



- Text Classification
- Phonetic Labeling
- Entity Labeling & Linking



Data Labeling - Types

| Person^[1] | Object^[2] | Action^[3]

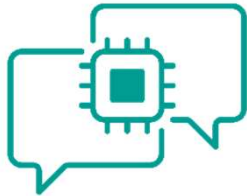
My husband^{Person} bought^{Action} a car^{Object} that^{Object} is broken.

REFERS TO

<https://labelstud.io/blog/10-important-considerations-for-nlp-labeling/>

Data Labeling - Types

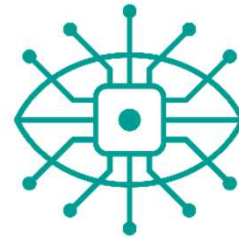
**Natural Language
Processing (NLP)**



Audio Processing



Computer Vision (CV)



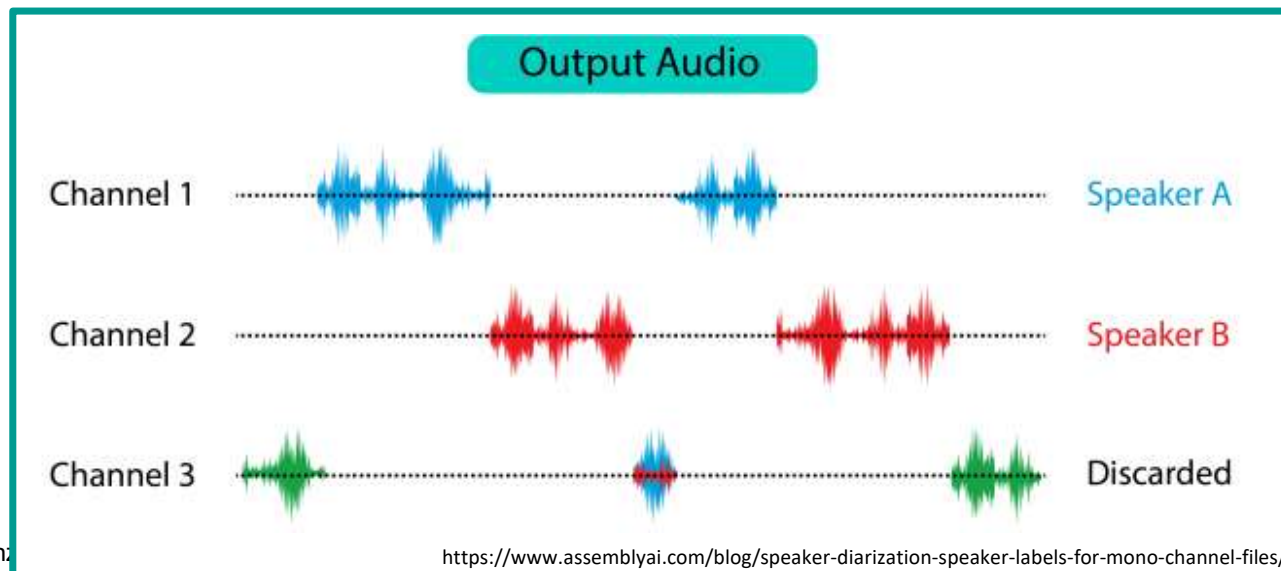
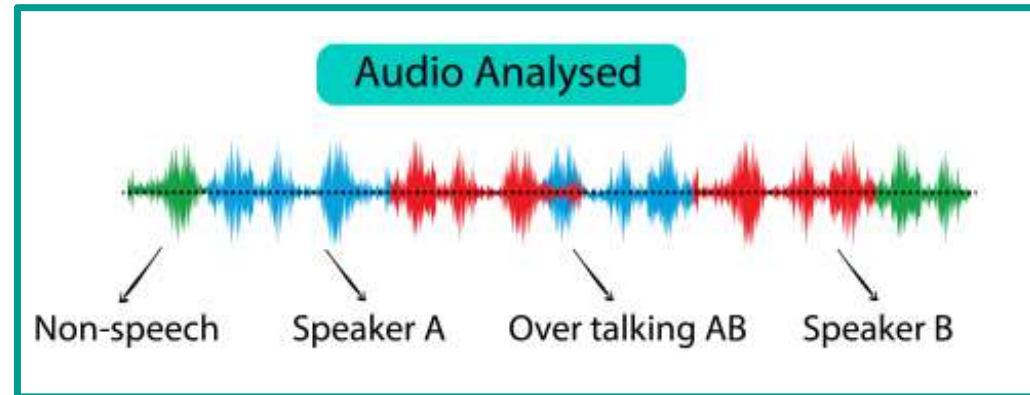
Audio Labeling



- Audio Classification
- Audio Segmentation
- Audio Transcription

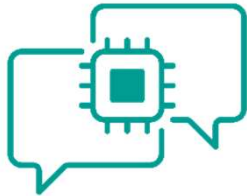


Data Labeling - Types



Data Labeling - Types

**Natural Language
Processing (NLP)**



Audio Processing



Computer Vision (CV)

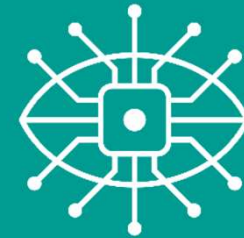


Image Labeling

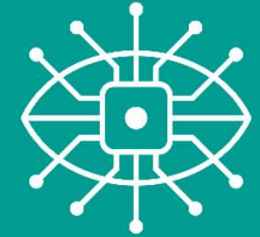


Video Labeling



3D Labeling

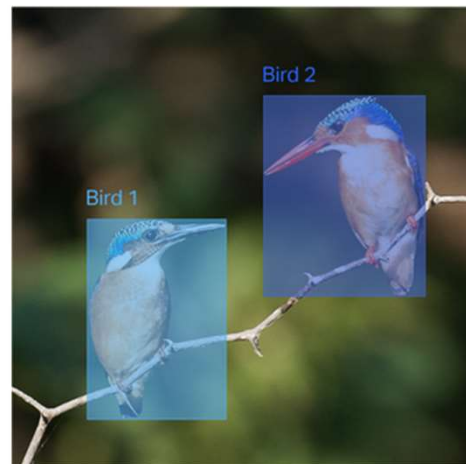




Data Labeling - Types



Classification



Object detection

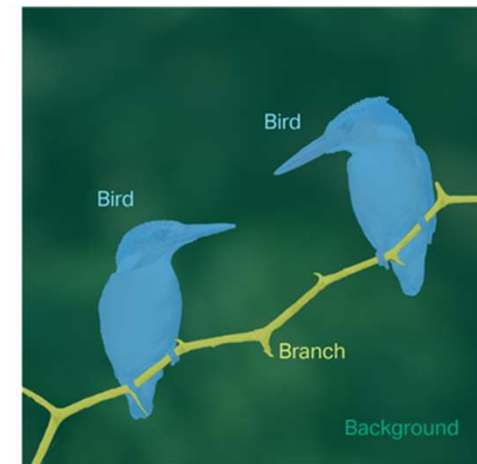
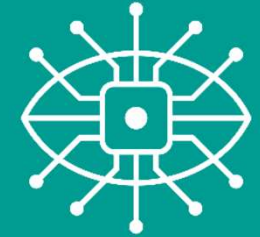


Image segmentation

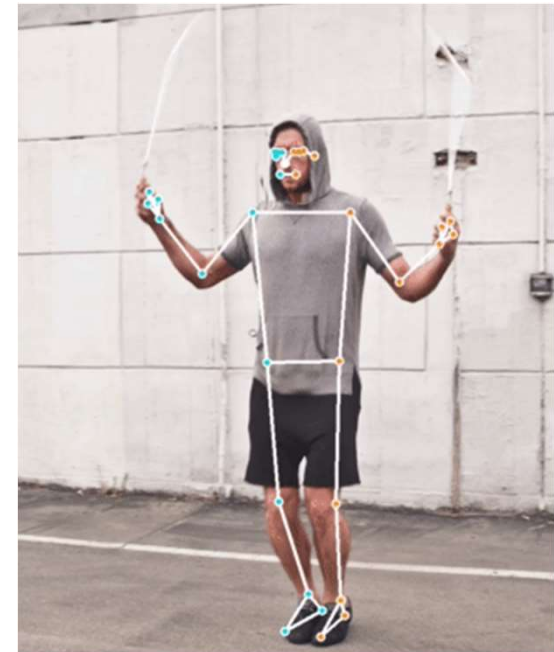
<https://labelbox.com/guides/image-segmentation/>



Data Labeling - Types



<https://www.analytics.ai/3d-cuboid-annotation/>

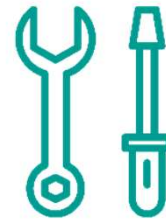


<https://developers.google.com/ml-kit/vision/pose-detection>

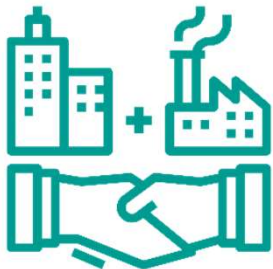
Data Labeling - Approaches



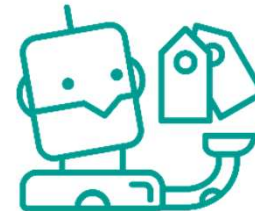
Inhouse



Tool-based



Outsourcing



Machine-based



Crowdsourcing

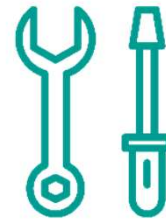


Programmatic

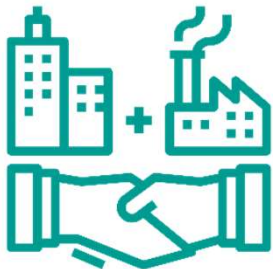
Data Labeling - Approaches



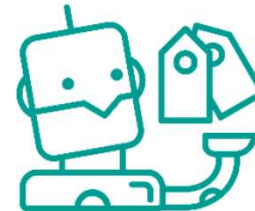
Inhouse



Tool-based



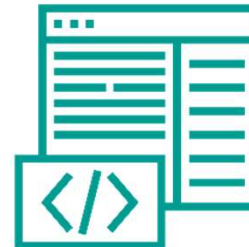
Outsourcing



Machine-based



Crowdsourcing

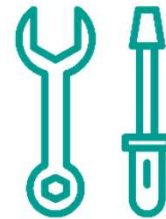


Programmatic

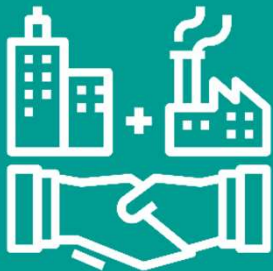
Data Labeling - Approaches



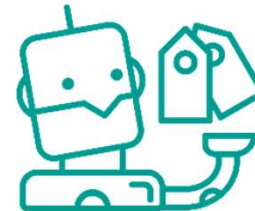
Inhouse



Tool-based



Outsourcing



Machine-based



Crowdsourcing

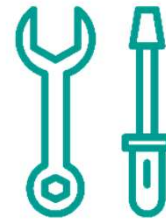


Programmatic

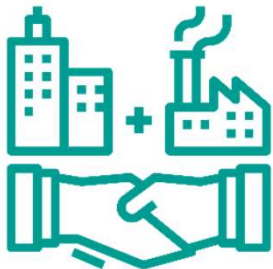
Data Labeling - Approaches



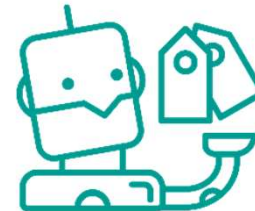
Inhouse



Tool-based



Outsourcing



Machine-based



Crowdsourcing



Programmatic

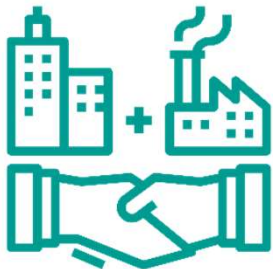
Data Labeling - Approaches



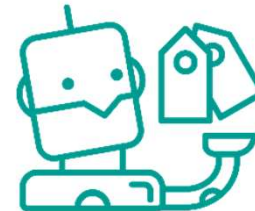
Inhouse



Tool-based



Outsourcing



Machine-based



Crowdsourcing

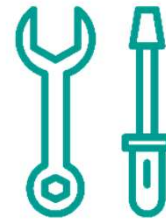


Programmatic

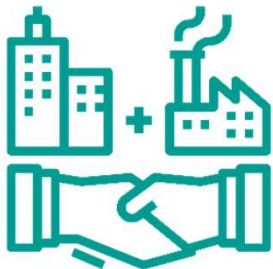
Data Labeling - Approaches



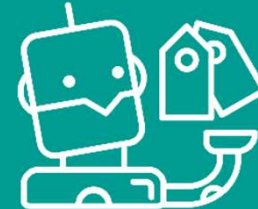
Inhouse



Tool-based



Outsourcing



Machine-based



Crowdsourcing

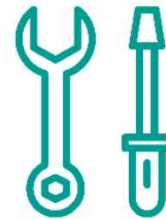


Programmatic

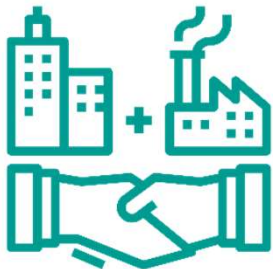
Data Labeling - Approaches



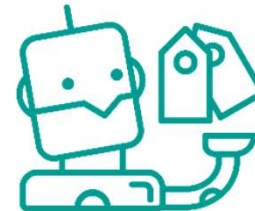
Inhouse



Tool-based



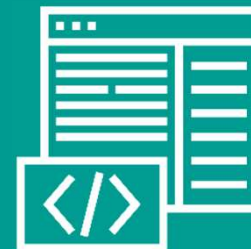
Outsourcing



Machine-based



Crowdsourcing



Programmatic

Data Labeling - Best practices

Labelbox Labeling Instructions Template

Objective

In a sentence or two describe the purpose of the project.

Example for Objects (bounding boxes): In this project we will identify dogs in images and annotate their faces with bounding boxes.

Example for Classification: In this project we want to classify bananas by their degree of ripeness ranging from "underripe" to "overripe".

Labeling Steps

Describe each step in the labeling process of one image/video.

If your projects contain several objects to be labeled or several classifications to choose from, explain each object, each classification in sufficient detail.

Example for Objects (bounding boxes):

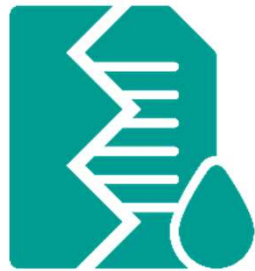
1. Look at the image and identify if a dog or dogs are visible.
2. If the image does not contain any dogs, please skip it.
3. For each dog select the Dog Face object from the tools section and draw a bounding box around the dog's face.

Labeling instructions



Management of data labelers
& QA checks

Data Labeling - Challenges

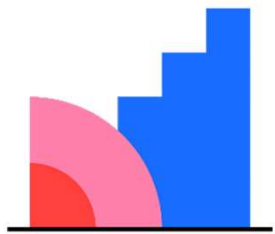


Label leakages



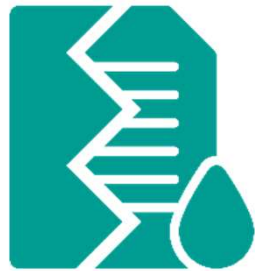
Human error &
Inconsistency

Data Labeling - Challenges



Mentimeter

Data Labeling - Challenges



Label leakages



Human error &
Inconsistency



Domain expertise



Expensive &
time-consuming



Data Labeling - Security / DSGVO



People & Workforce



Technology & Network

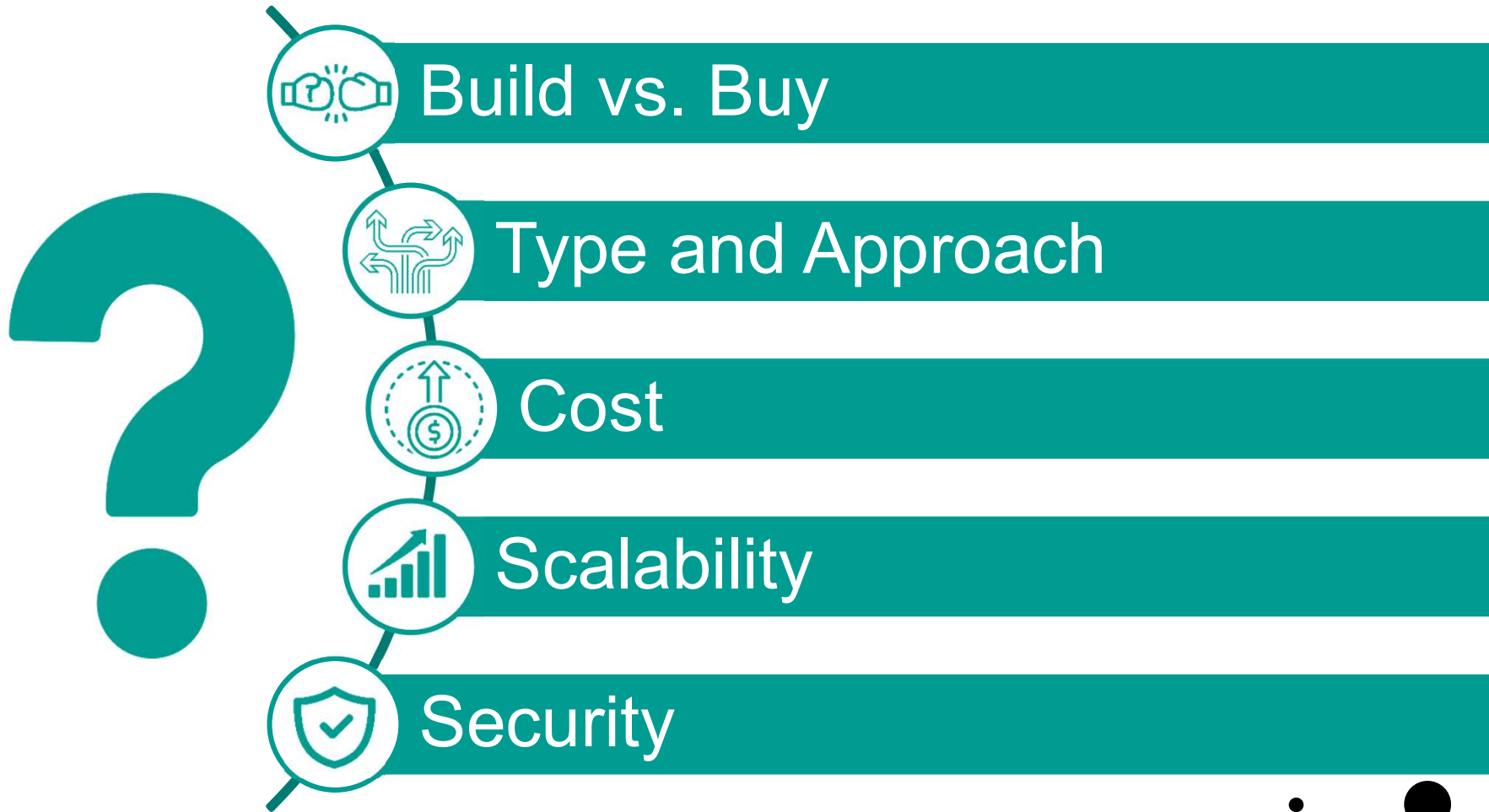


Facilities & Workspace









DSGVO







Data Labeling - Tool decision









Data Labeling - Tools

Company	Hosted	Programmatic	Out-/Crowdsourcing
scale	✗	✗	
 snorkel		✗	
 cloudfactory			✗
 Labelbox  appen	✗	✗	✗
 Amazon SageMaker  amazon mechanical turk	✗	✗	✗







Data Labeling - Tools

Company	Hosted	Programmatic	Out-/Crowdsourcing
scale	✗	✗	
 snorkel		✗	
 cloudfactory			✗
 Labelbox  appen	✗	✗	✗
 Amazon SageMaker  amazon mechanical turk	✗	✗	✗







Data Labeling - Tools

Company	Hosted	Programmatic	Out-/Crowdsourcing
scale	X	X	
 snorkel		X	
 cloudfactory			X
 Labelbox  appen	X	X	X
 Amazon SageMaker  amazon mechanical turk	X	X	X







Data Labeling - Tools

Company	Hosted	Programmatic	Out-/Crowdsourcing
scale	X	X	
 snorkel		X	
 cloudfactory			X
 Labelbox  appen	X	X	X
 Amazon SageMaker  amazon mechanical turk	X	X	X

Data Labeling - Tools

Company	Hosted	Programmatic	Out-/Crowdsourcing
scale	X	X	
 snorkel		X	
 cloudfactory			X
 Labelbox  appen	X	X	X
 Amazon SageMaker  amazon mechanical turk	X	X	X

Data Labeling - Tools

Company	Hosted	Programmatic	Out-/Crowdsourcing
scale	X	X	
 snorkel		X	
 cloudfactory			X
 Labelbox  appen	X	X	X
 Amazon SageMaker  amazon mechanical turk	X	X	X

Data Labeling - Pricing

Hosted

Inhouse

Programmatic

Out-/
Crowdsourcing



Data Labeling - Pricing

Hosted

Inhouse

Programmatic

Out-/
Crowdsourcing



Data Labeling - Pricing

Hosted



Inhouse

Programmatic

Out-/
Crowdsourcing



Data Labeling - Demo

Computer Vision	NLP (Programmatic)
 Labelbox	 snorkel

Data Labeling - Demo

<https://app.labelbox.com/signin>

Benutzer: labelbox1@proton.me

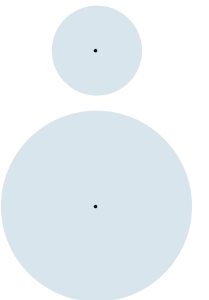
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Benutzer: labelbox2@proton.me

Passwort: XXXXXXXX

Benutzer: labelbox3@proton.me

Passwort: XXXXXXXX



Vielen Dank
für Ihre Aufmerksamkeit