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# Einführung ins **Machine Learning**

WIEN 26. September 2024

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Ziel dieser **Präsentation**

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# Ziel dieser **Präsentation?**

- Allgemeines Verständnis
- Grundkonzepte von Machine Learning
- Machine Learning Algorithmen
- Mögliche Einsatzmöglichkeiten
- Herausforderungen

# Einführung in **Machine Learning**.

01

**Was ist  
Machine  
Learning?**

02

Supervised  
Learning

03

Unsupervised  
Learning

04

**Reinforcement  
Learning**

05

Zusammenfassun  
g

01

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**Was ist**

**Machine Learning?**

# Was ist **Machine Learning**?

## Artificial Intelligence



### Artificial Intelligence

- Imitiert menschliche Intelligenz
- Lösung von komplexen Problemen

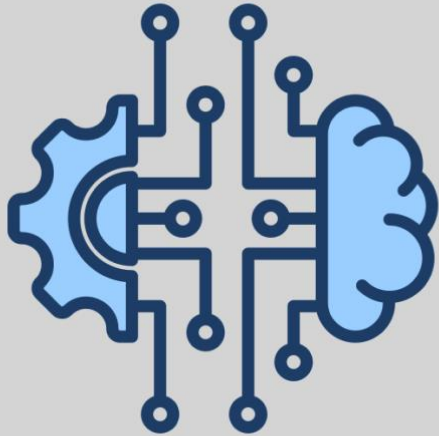
### Beispiele

- Sortieralgorithmen
- Logikbasierte Chatbots
- Heuristikbasierte Systeme

# Was ist **Machine Learning**?

## Artificial Intelligence

### Machine Learning



## Machine Learning

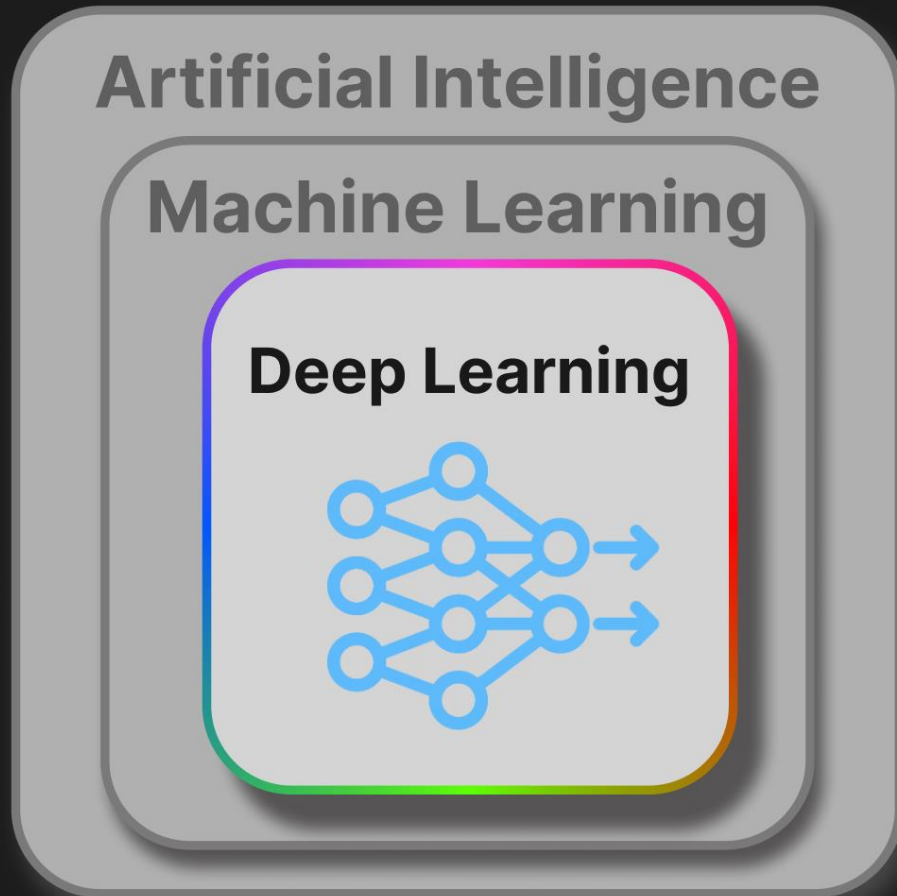
- Teil von Artificial Intelligence
- Lernen und optimieren durch Erfahrungen

## Beispiele

- Spam-Filter
- Risikoanalyse
- Personalisierte Werbung



# Was ist **Machine Learning**?



## Deep Learning

- Teil von Machine Learning
- Neuronale Netze mit mehrere Schichten

## Beispiele

- Bilderkennung
- Sprachverarbeitung
- Large Language Models

# Was ist Machine Learning?

## Phase 1: Training



Daten

# Was ist Machine Learning?

## Phase 1: Training



Daten



ML Modell

# Was ist Machine Learning?

## Phase 1: Training



Daten



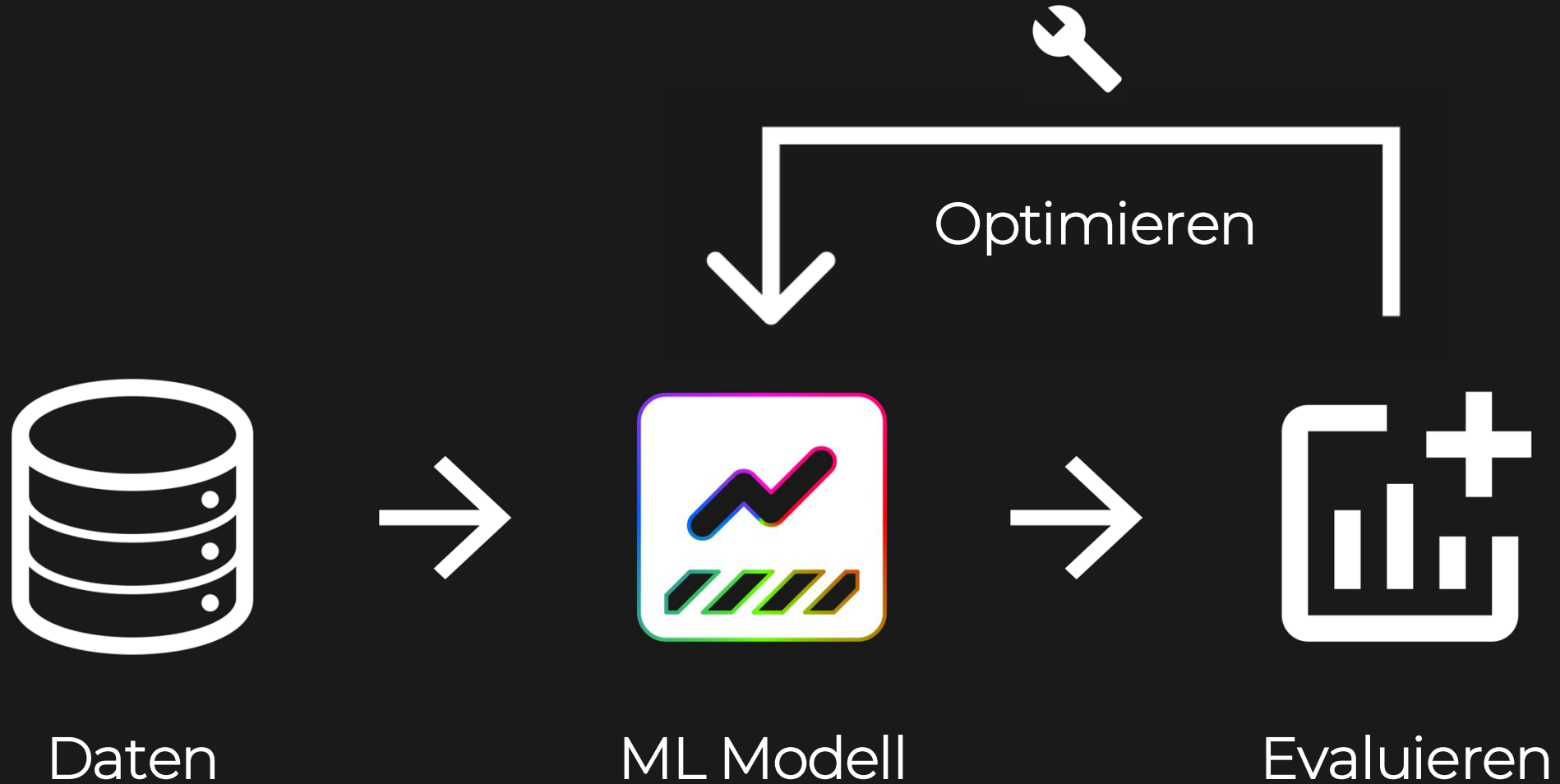
ML Modell



Evaluiieren

# Was ist Machine Learning?

## Phase 1: Training



# Was ist **Machine Learning**?

## Phase 2: **Production**



Daten

# Was ist Machine Learning?

## Phase 2: Production



Daten



ML Modell

# Was ist Machine Learning?

## Phase 2: Production



Daten



ML Modell



Vorhersage



# Was ist **Machine Learning**?



## Machine Learning Modelle

- Phase 1 liefert immer ein Modell
- Qualität variiert
- Nie zu 100% genau

# Was ist **Machine Learning**?



Garbage in

# Was ist **Machine Learning**?



Garbage in



Garbage out

# Typen von ML

## Supervised Learning

Daten: Eingabe - Ausgabe Paare

Lernprozess: Überwacht - Feedback über Korrektheit

Ziel: Vorhersagen neuer Eingaben

Unsupervised  
~~Learning~~  
Reinforcement  
Learning



# Typen von ML

Supervised Learning

Unsupervised  
Learning

Daten: Unbeschriftete Daten

Lernprozess: Unüberwacht - Ohne Anweisungen

Ziel: Muster und Strukturen in Daten finden

Reinforcement  
Learning



# Typen von **ML**

Supervised Learning

Unsupervised

Learning

Reinforcement

**Learning**

Daten: Umgebung

Lernprozess: Belohnung und Bestrafung nach

Ziel: Interaktion  
Strategie mit höchster Belohnung



# Einführung in **Machine Learning**.

01

Was ist Machine Learning?

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Supervised Learning

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Unsupervised Learning

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05

Zusammenfassung

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# Supervised Learning

02



# Supervised Learning

Regression

Classification

# Supervised Learning

## Regression

# Supervised Learning

## Regression



# Supervised Learning

## Regression

# Hours Studied Numeric	# Previous Scores Numeric	# Sleep Hours Numeric
7	99	9
4	82	4
8	51	7
5	52	5
7	75	8



# Performance Ind... Target Variable
91.0
65.0
45.0
36.0
66.0

# Supervised Learning

## Regression

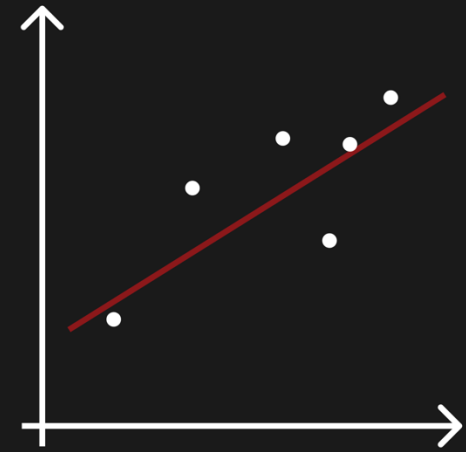
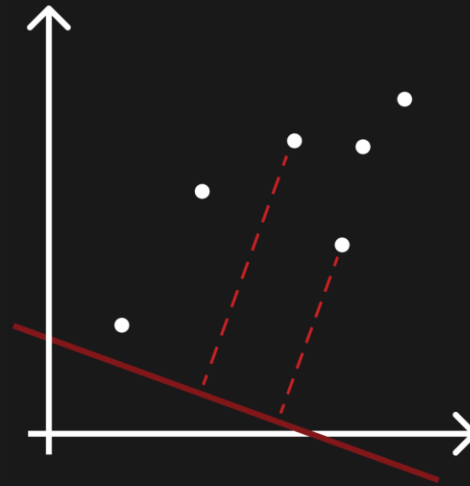
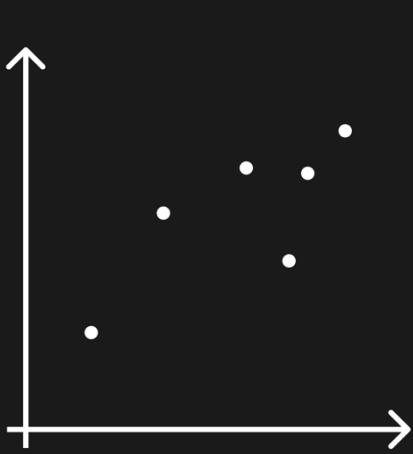
### Beispiele

- Temperatur / Wetter
- Immobilienpreise
- Aktienkurse

# Supervised Learning

## Regression

### Linear Regression



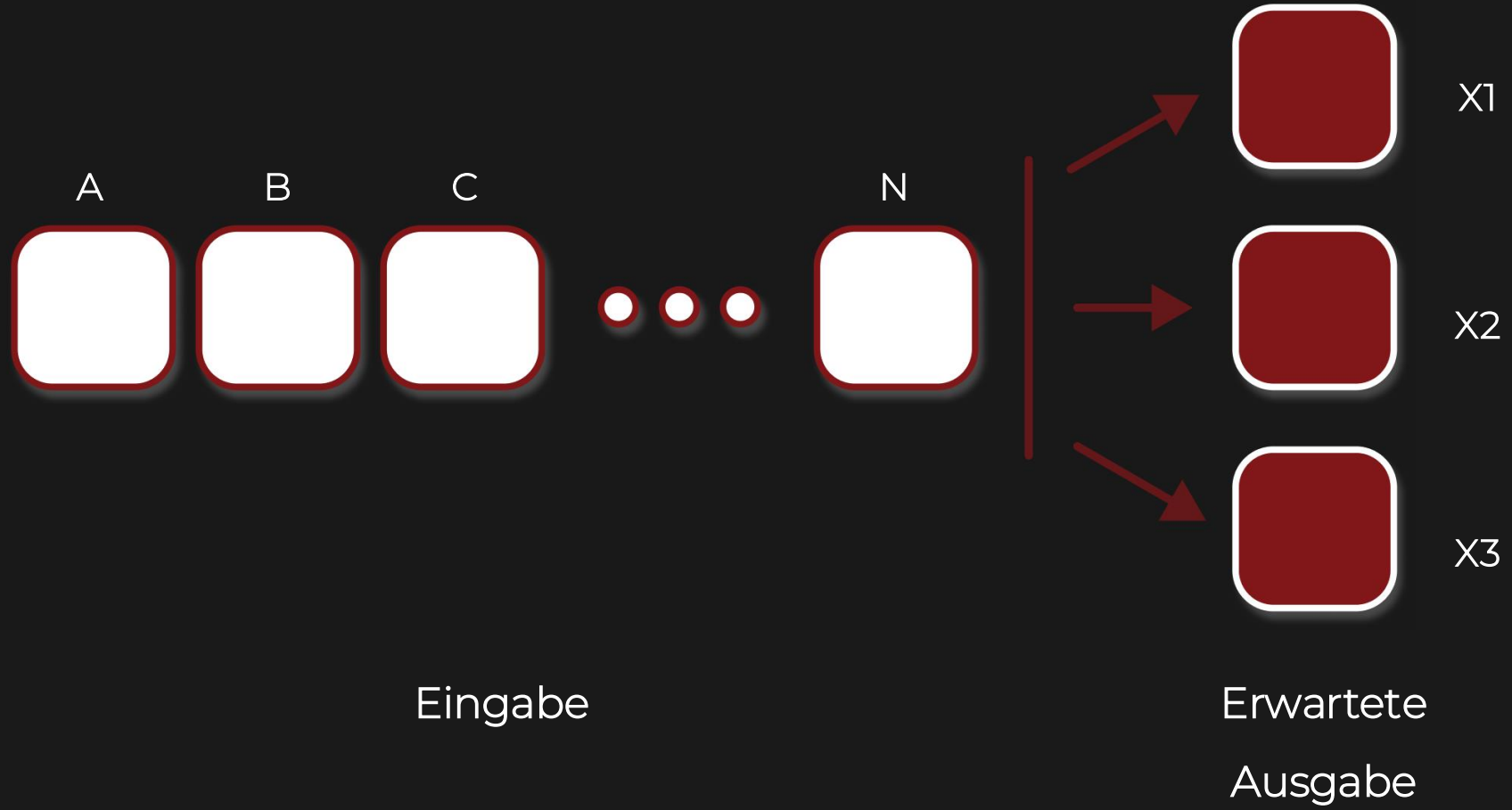
$$y = a * x + b + \epsilon$$

# Supervised Learning

## Classification

n

# Supervised Learning Classification





# Supervised Learning

## Classification

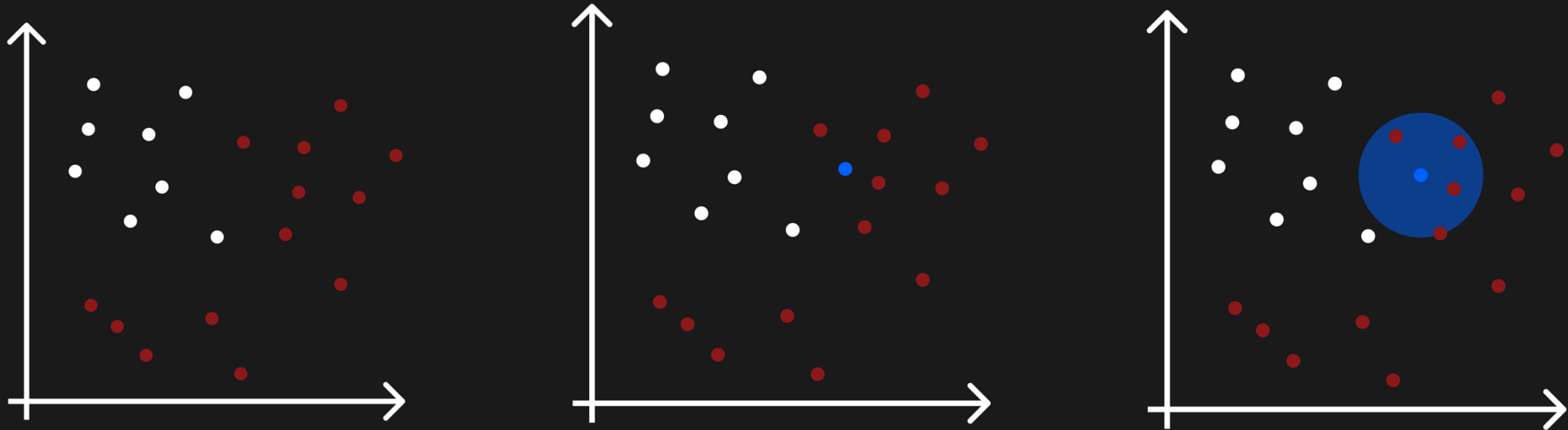
△ Gender	# Age	# GPA	△ Major	△ Projects	△ Python	△ SQL	△ Java
Male	21	3.5	Computer Science	Chatbot Development	Strong	Strong	Weak
Female	20	3.2	Computer Science	Data Analytics	Average	Strong	Weak
Male	22	3.8	Computer Science	E-commerce Website	Strong	Strong	Average
Female	21	3.7	Computer Science	Full-Stack Web App	Weak	Strong	Strong
Male	23	3.4	Computer Science	Network Security	Average	Weak	Strong



△ Future Career
Machine Learning Researcher
Data Scientist
Software Engineer
Web Developer
Information Security Analyst

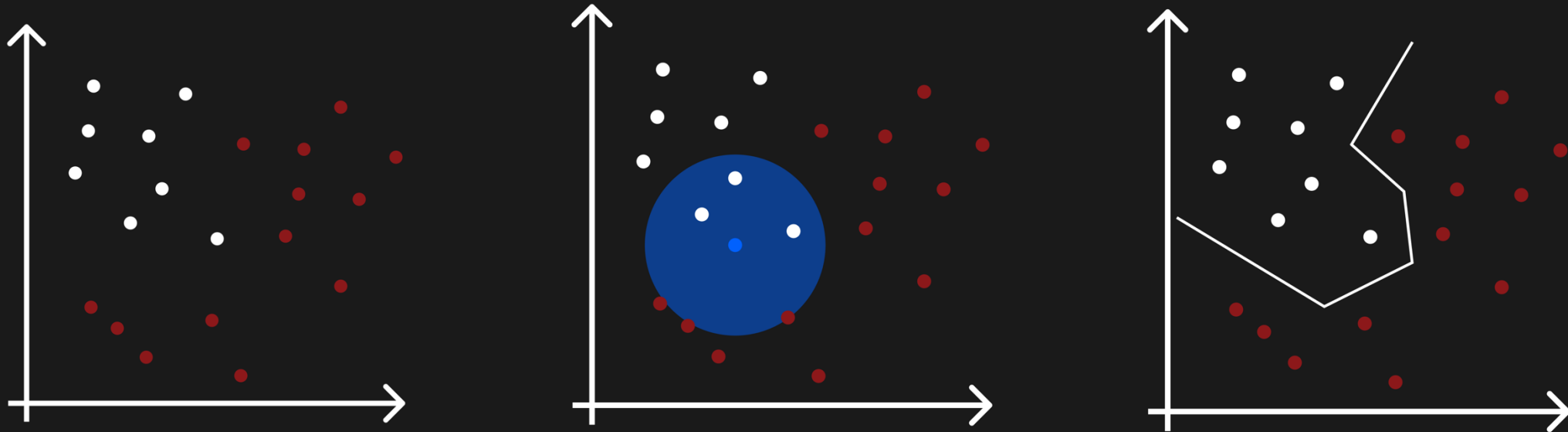
# Supervised Learning Classification

## K - Nearest Neighbour (k-NN)



# Supervised Learning Classification

## K - Nearest Neighbour (k-NN)



# Supervised Learning

## Classification

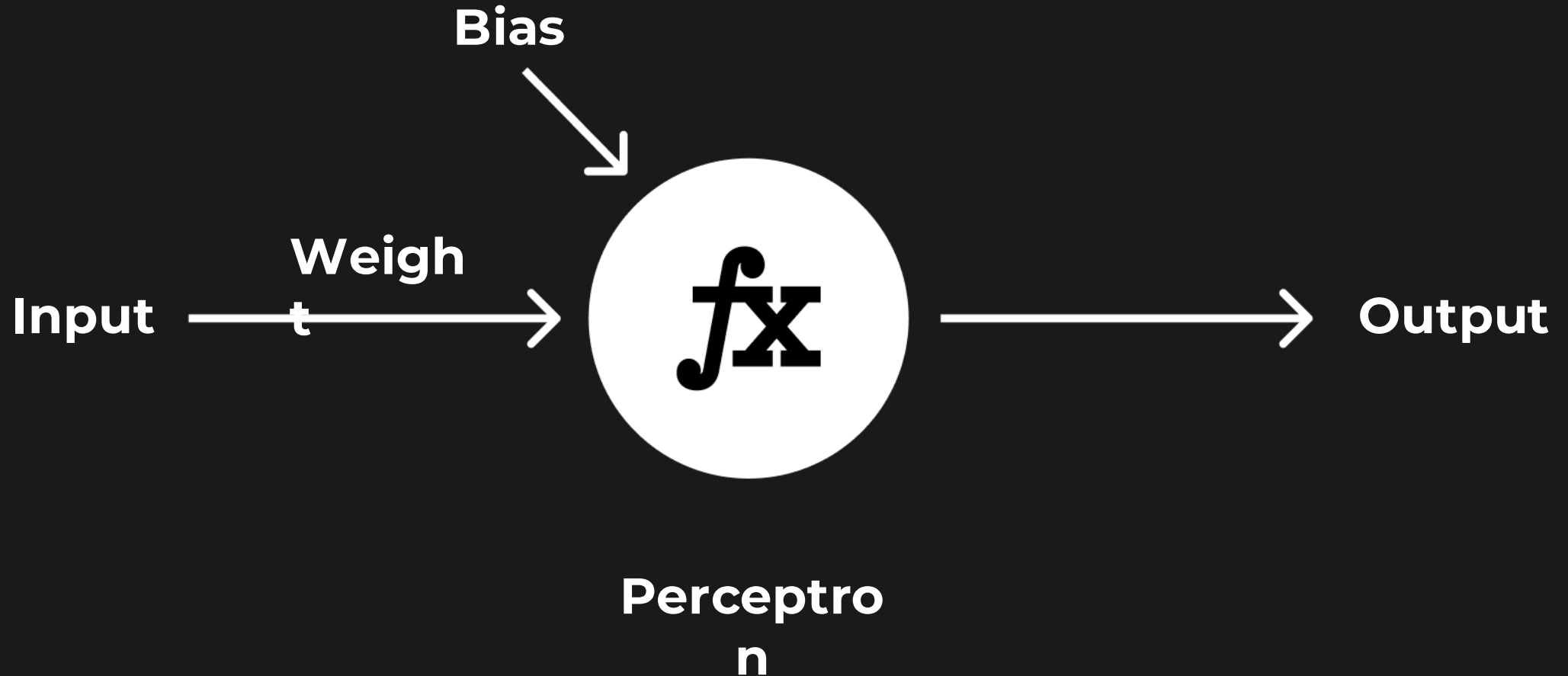
### Beispiele

- Spam Filter
- Musik Genre
- Bild- & Spracherkennung

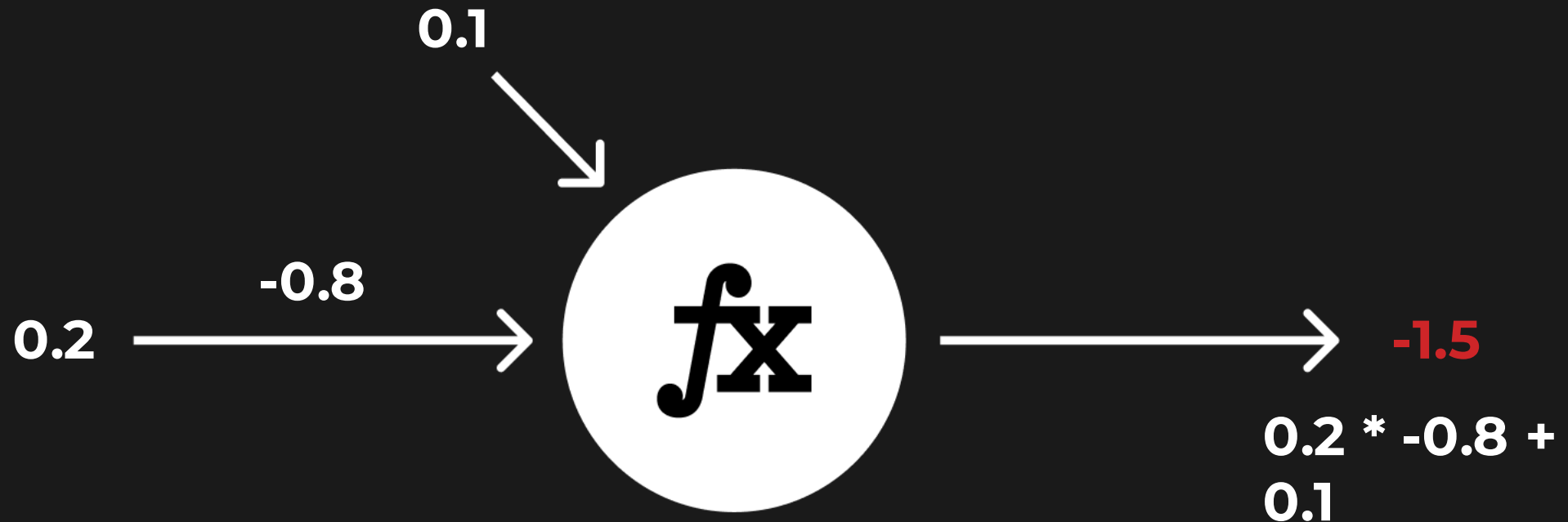
# Supervised Learning

## Neural Network

# Supervised Learning Neural Network

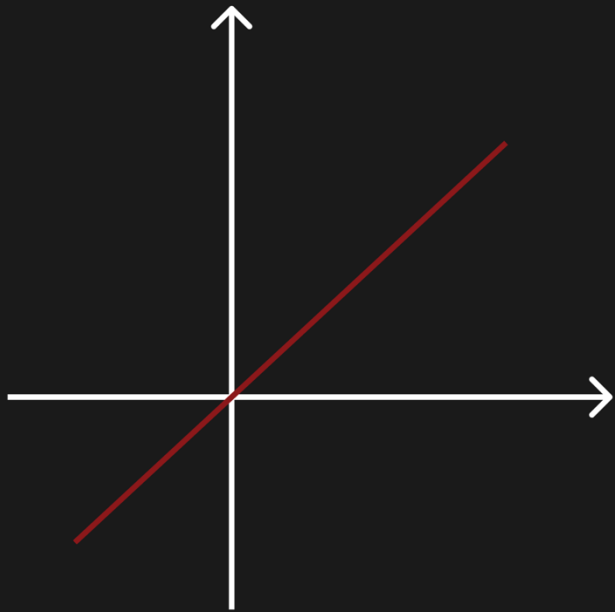


# Supervised Learning Neural Network

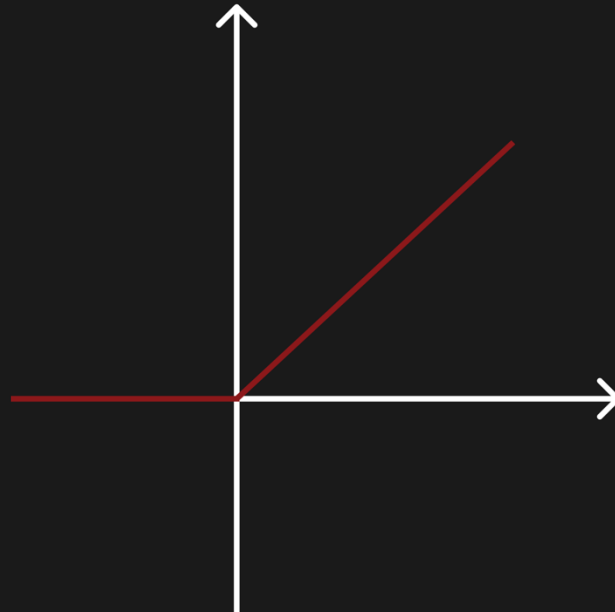


$$f(x) = x$$

# Supervised Learning Neural Network

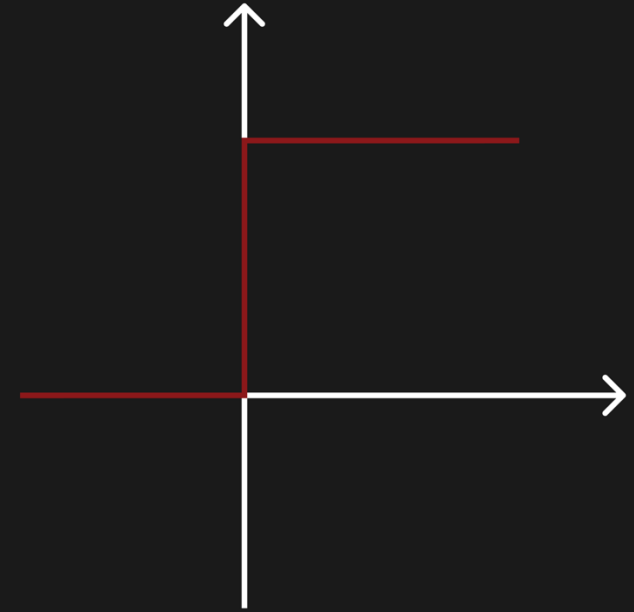


**Linear**



**ReLU**

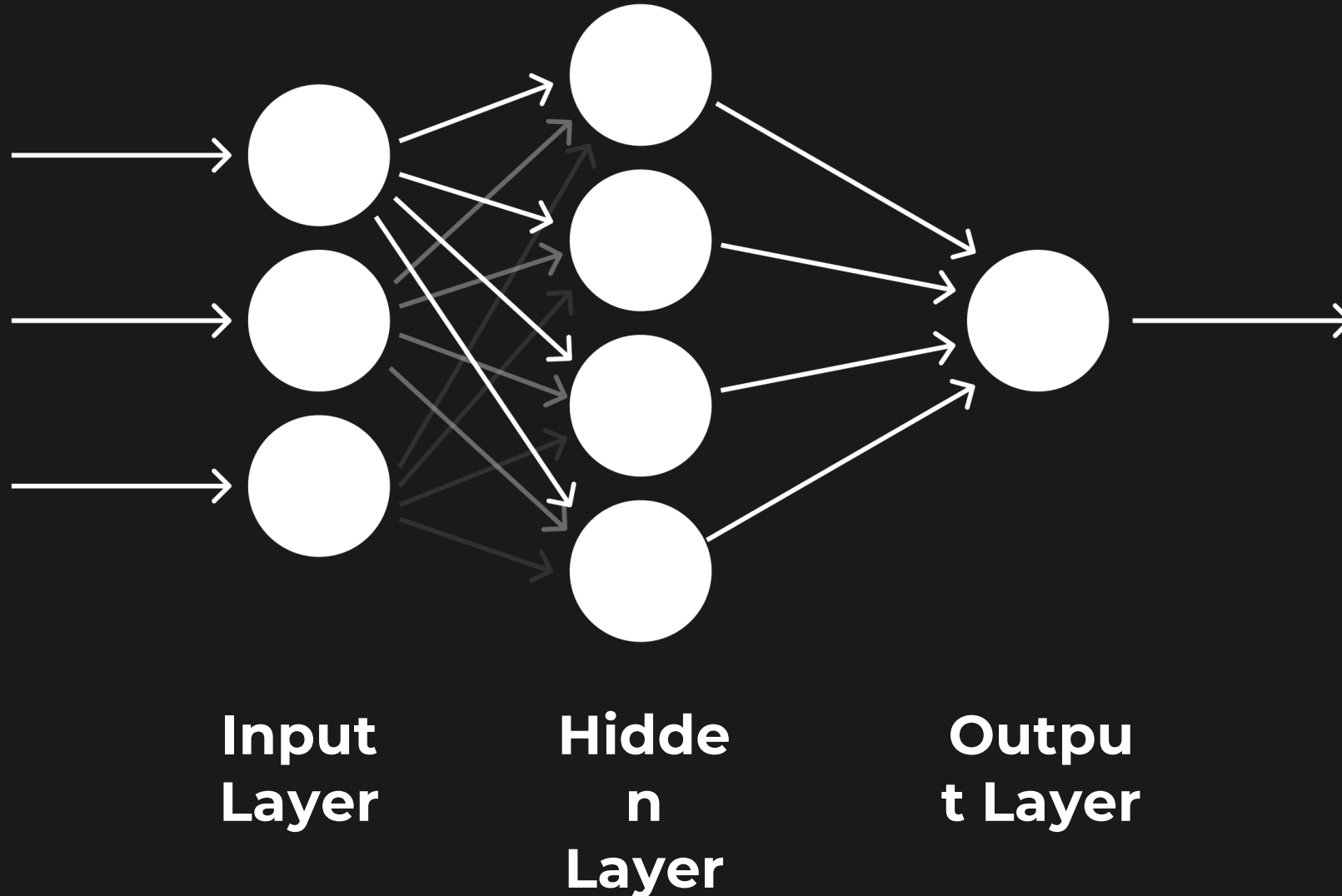
Rectified Linear Unit



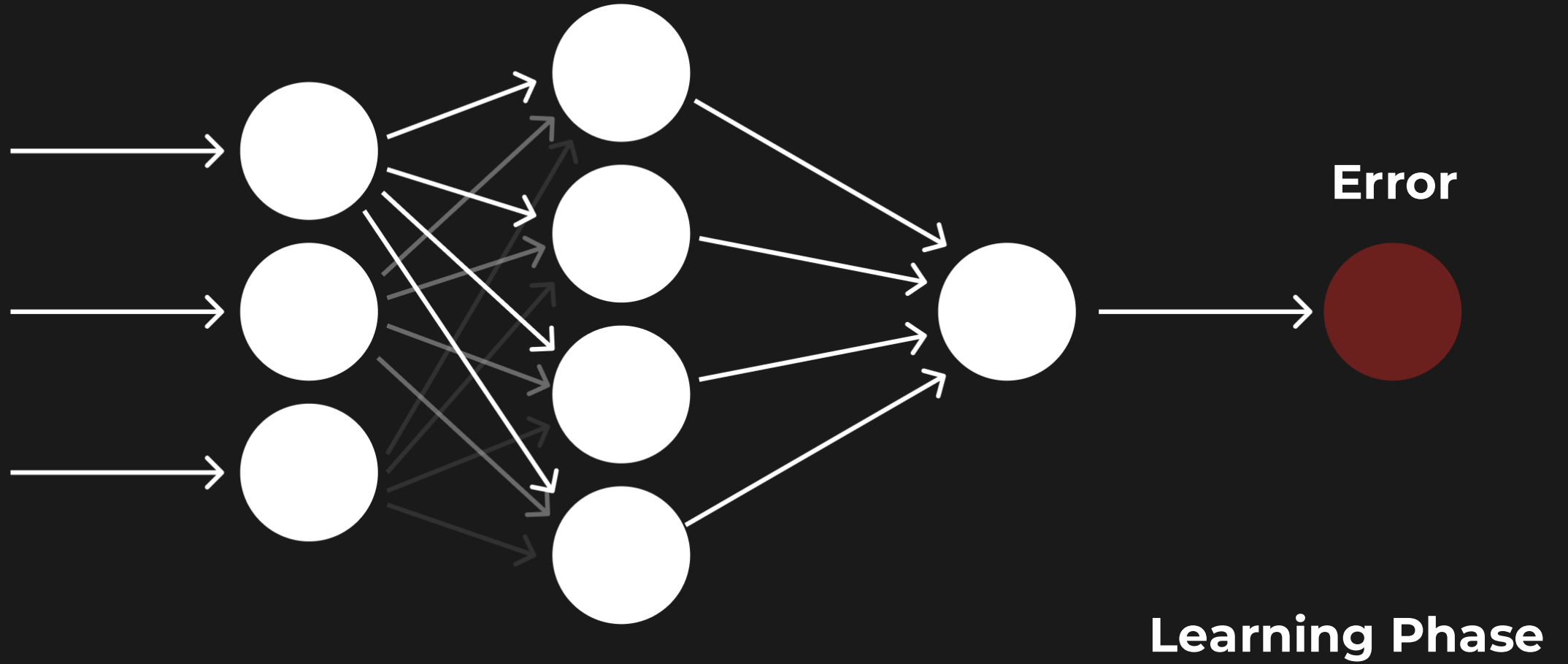
**Unit Step**



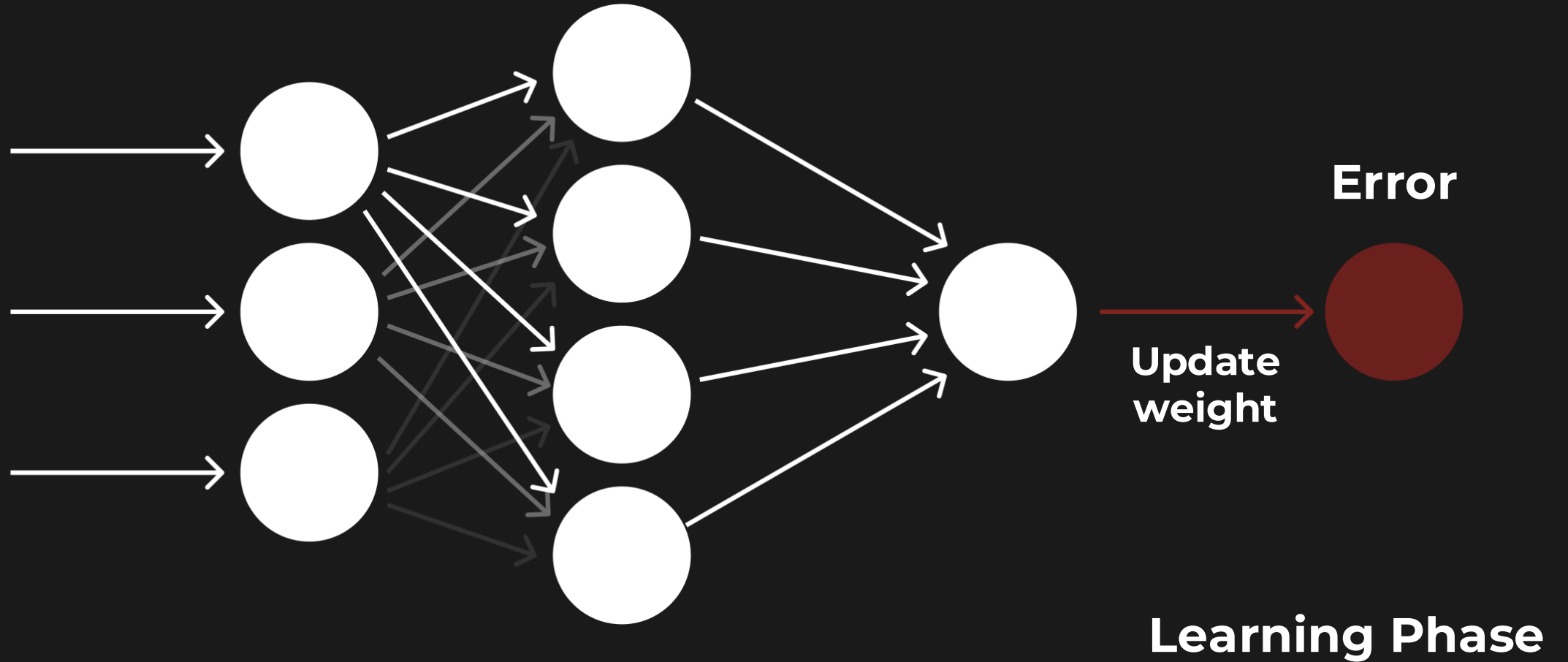
# Supervised Learning Neural Network



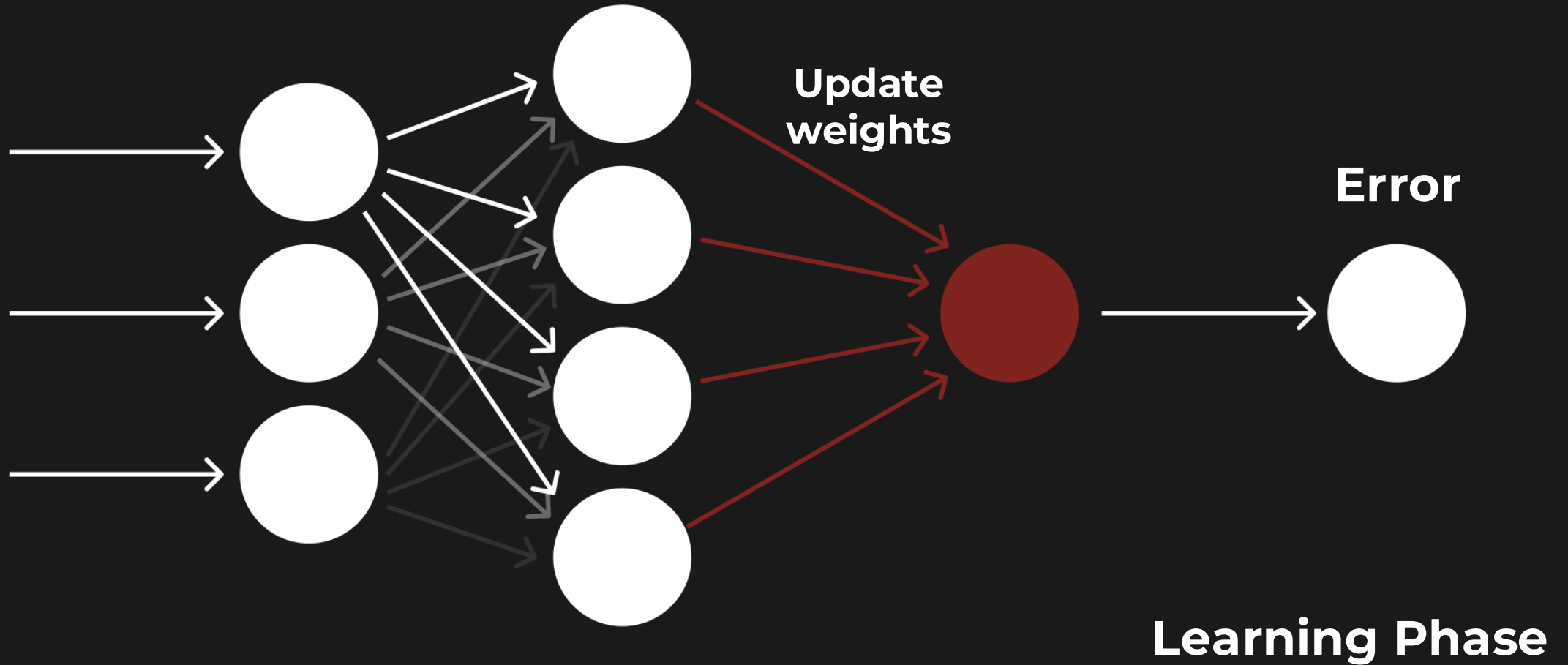
# Supervised Learning Neural Network



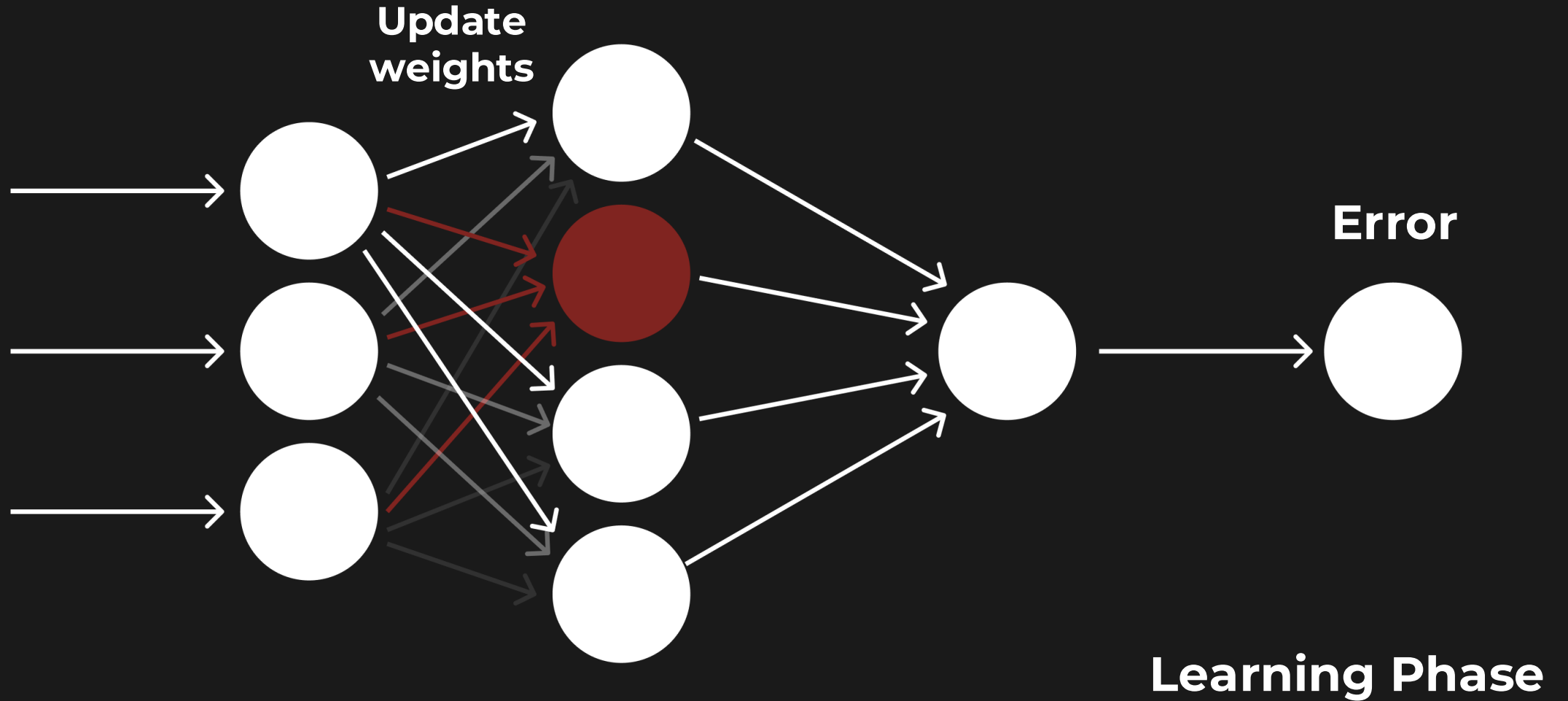
# Supervised Learning Neural Network



# Supervised Learning Neural Network



# Supervised Learning Neural Network



# Supervised Learning Neural Network

**Deep Learning = Neural Network + 2x Hidden Layer**

# Supervised Learning Neural Network

## Vorteile

- Komplexe nicht-lineare Beziehungen
- Skalierbarkeit und Leistung bei großen Datensätzen
- Vielseitig - Regression / Classification / (Un-)Supervised / Reinforcement Learning

# Supervised Learning Neural Network

## Nachteile

- Ressourcenintensiv - Hardware und Rechenzeit
- Blackbox - Kaum Erklärbar
- Wahl der Parameter

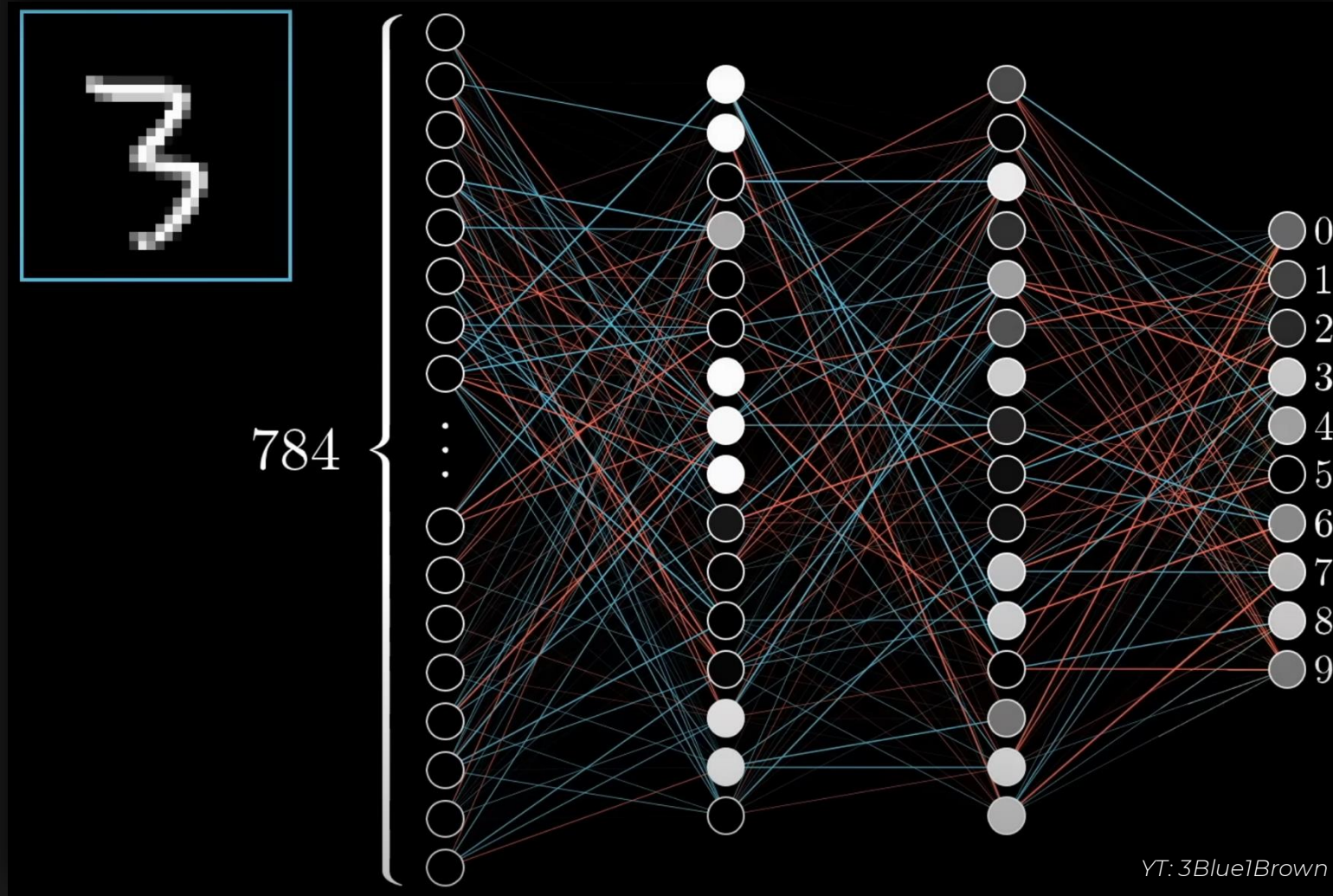


# Supervised Learning Neural Network

## Fragen

- Wie viele Hidden Layers?
- Wie viele Neuronen pro Layer?
- Welche Aktivitätsfunktion?

# Supervised Learning Neural Network



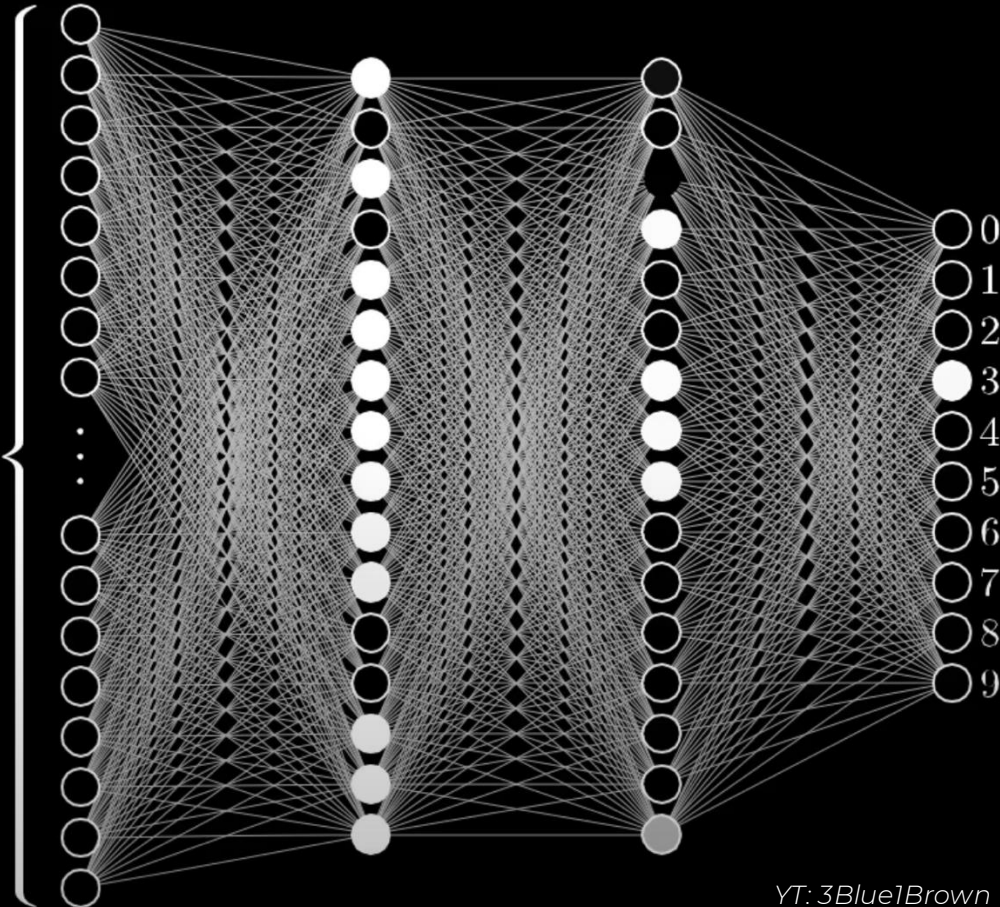
Bildererkennung

Beispiele

# Supervised Learning Neural Network



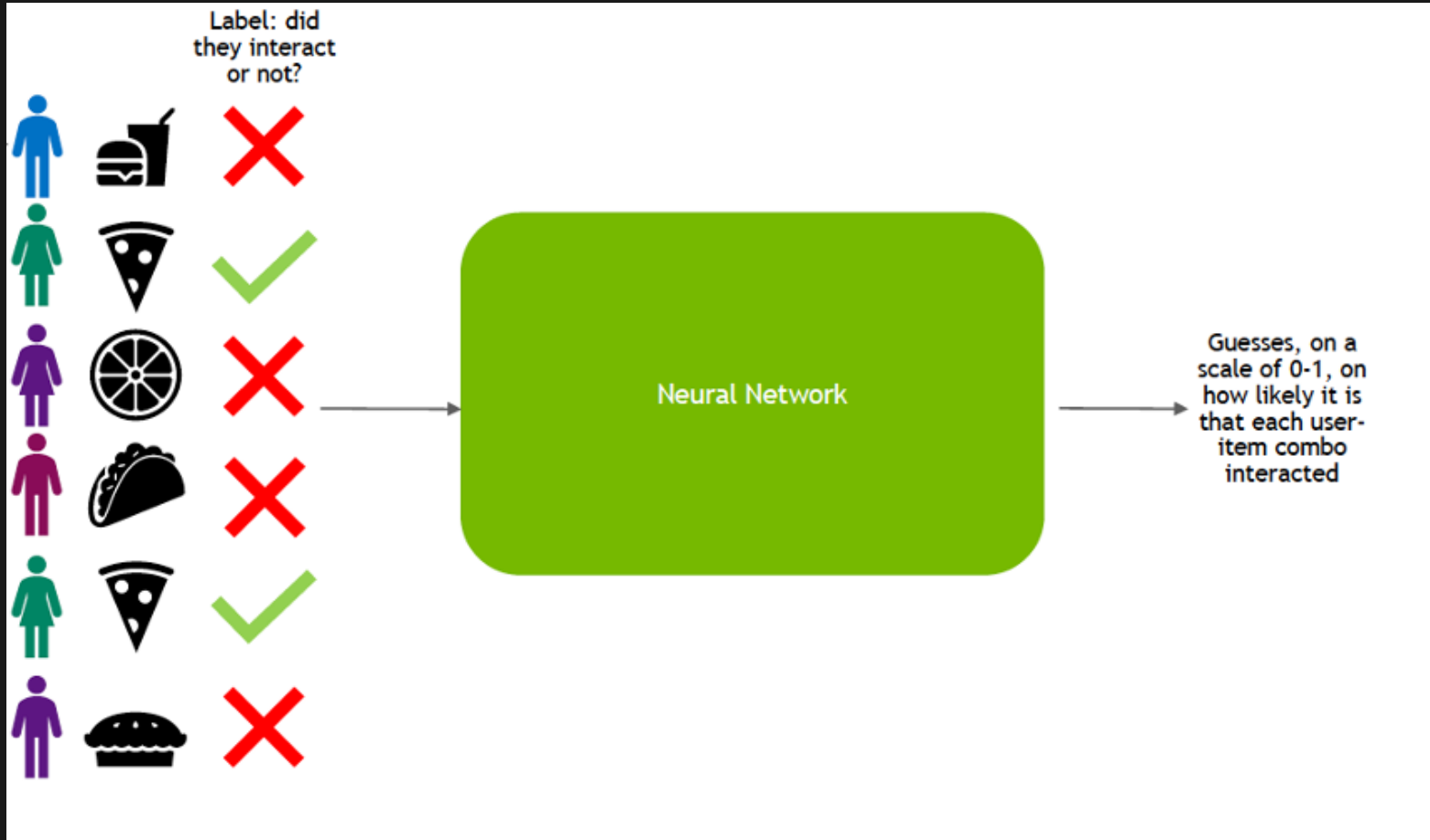
784



Bilderkennung

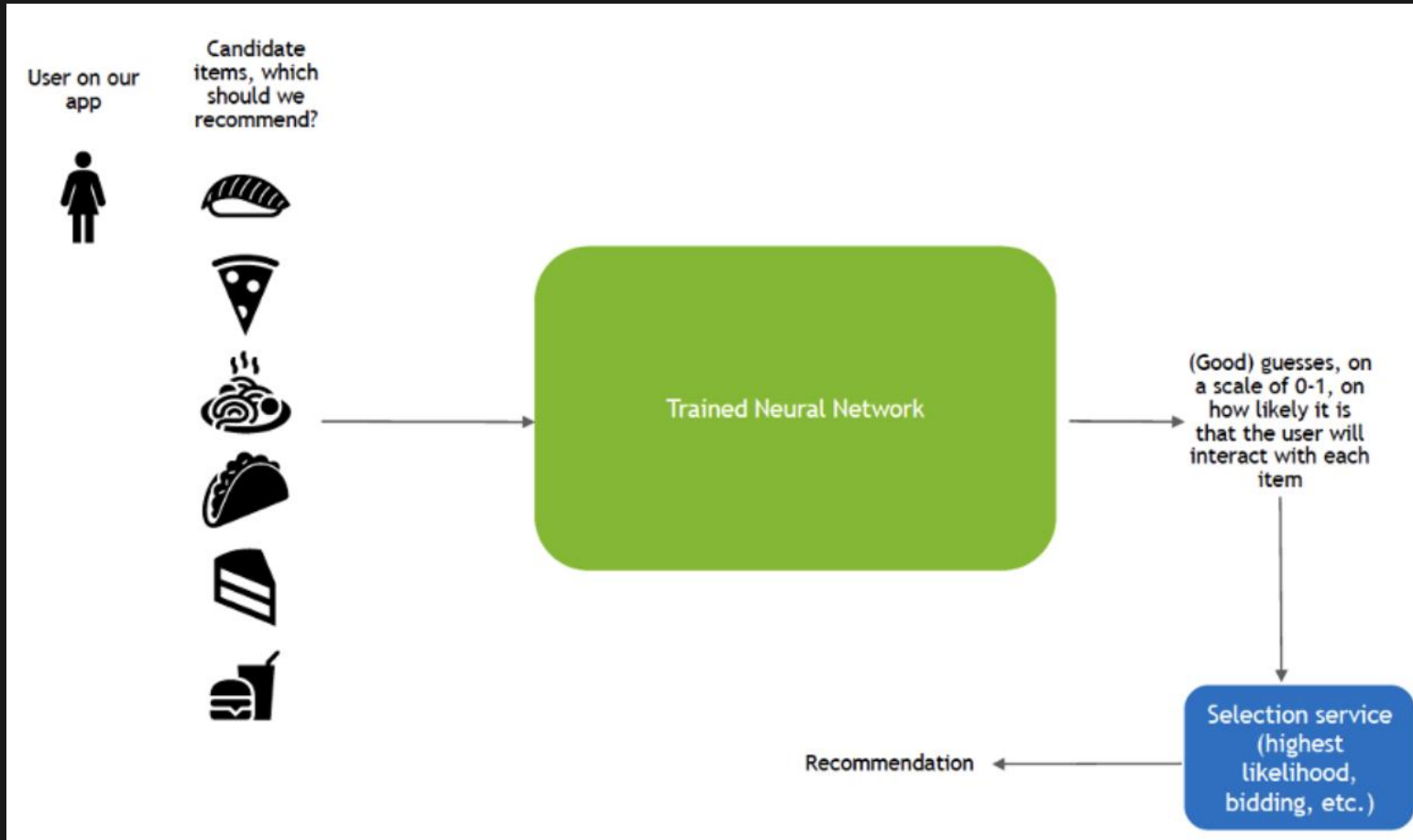
YT: 3Blue1Brown

# Supervised Learning Neural Network



Personenbezogene  
s  
Empfehlungssysteme  
m

# Supervised Learning Neural Network



Personenbezogene  
s  
Empfehlungssysteme  
m

# Supervised Learning

## Other Examples

**Support Vector Machine  
(SVM)**

**Logistic Regression**

**Decision Tree**

**Gradient Boosting Machines  
(GBM)**

**Naive Bayes**

**Random Forest**

# Einführung in **Machine Learning**.

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Zusammenfassun  
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# Unsupervised Learning

03



# Unsupervised Learning

Clustering

Association

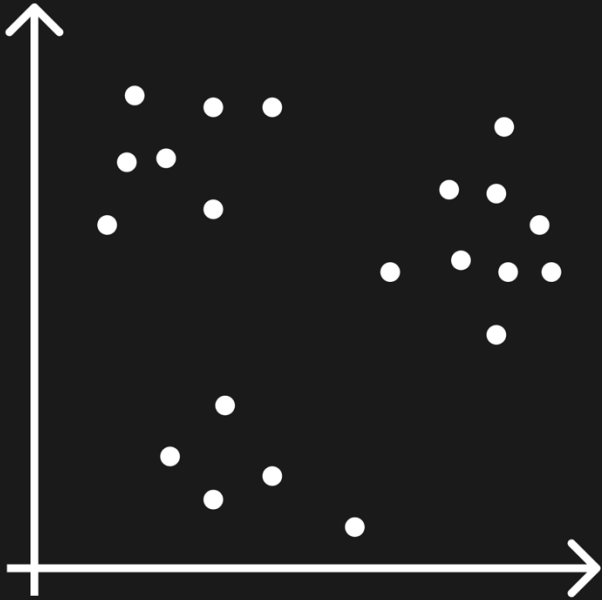
Dimensionality  
Reduction

# Unsupervised Learning

## Clustering

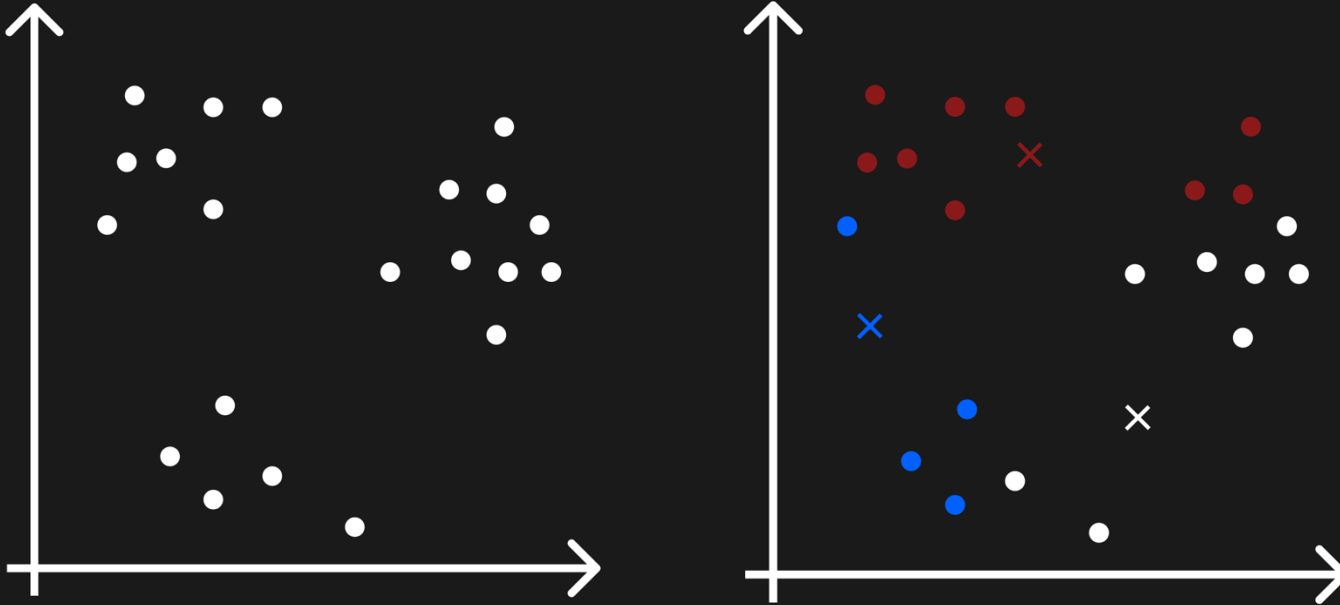
# Unsupervised Learning

## Clustering



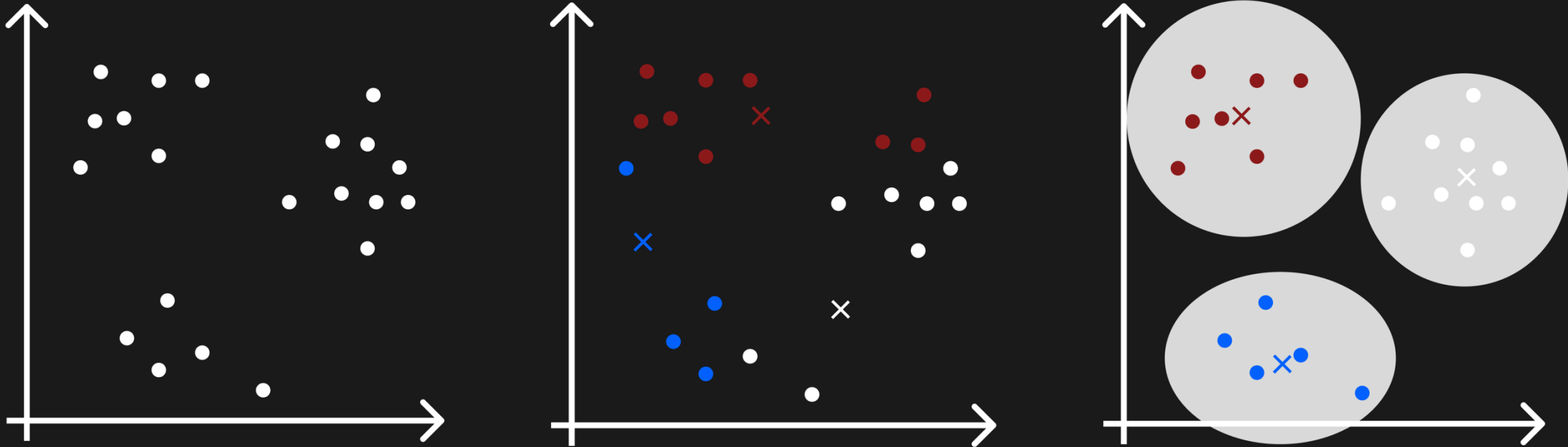
# Unsupervised Learning

## Clustering



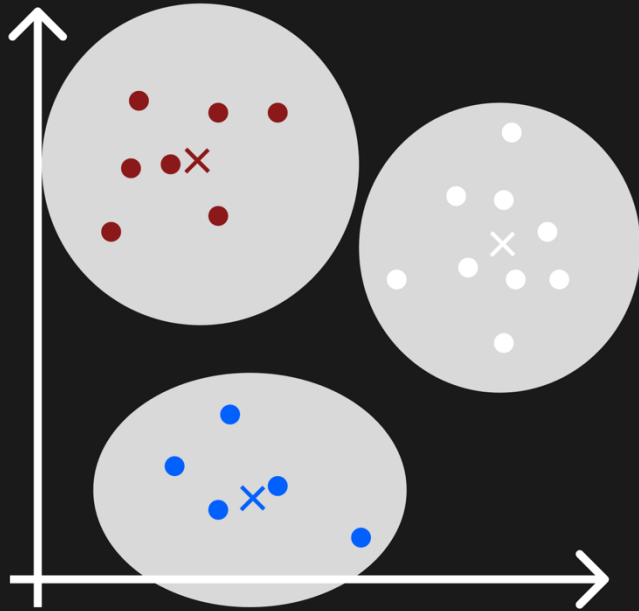
# Unsupervised Learning

## Clustering



# Unsupervised Learning

## Clustering



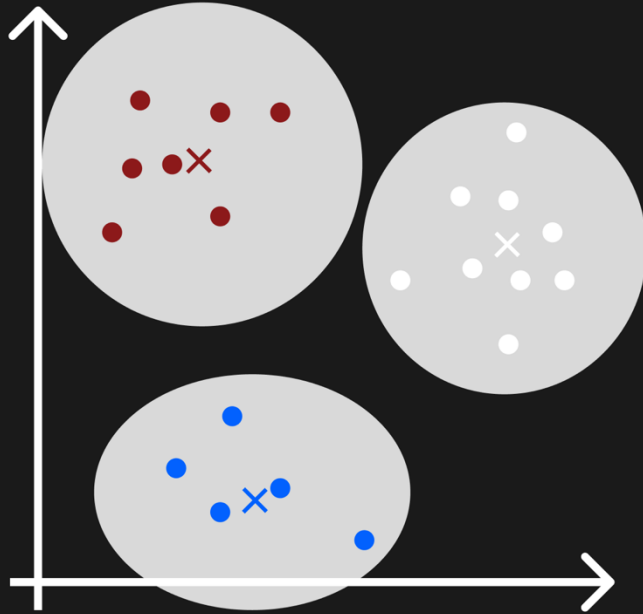
### K-mean Clustering

- Zufällig K Zentren definieren
- Datenpunkte zu Zentren zuordnen
- Zentren anhand von Schwerpunkten neu positionieren
- Wiederholen bis Schwerpunkte konvergieren

# Unsupervised **Learning** Clustering

**Cluster gefunden: Was  
nun?**

# Unsupervised Learning Clustering

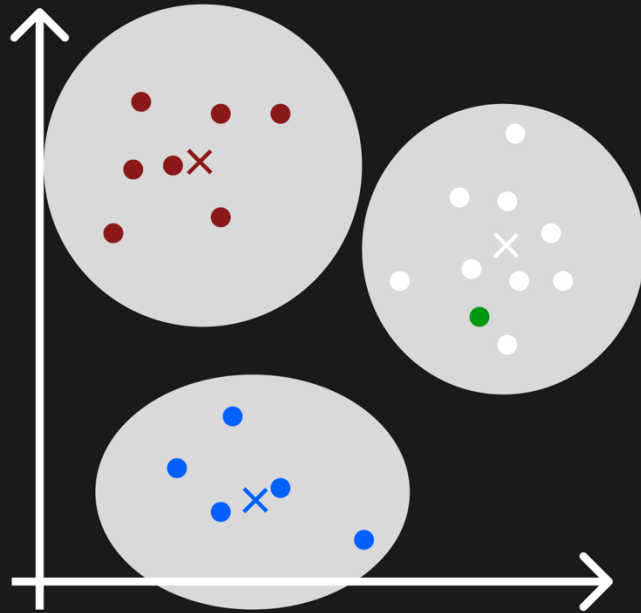


Gruppierungen finden

Cluster gefunden: Was nun?



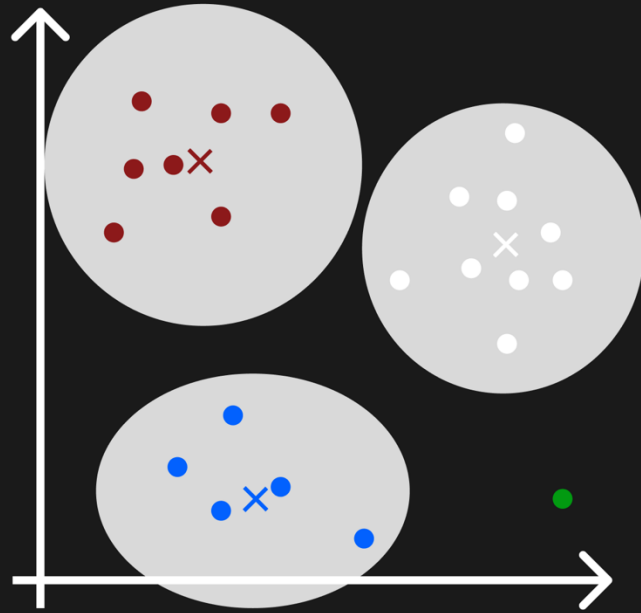
# Unsupervised Learning Clustering



Neue Datenpunkte schneller zuweisen

Cluster gefunden: Was nun?

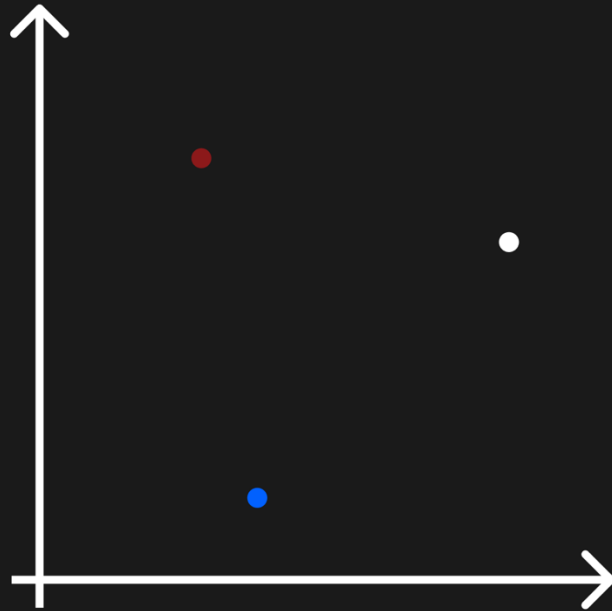
# Unsupervised Learning Clustering



Anomalien erkennen

Cluster gefunden: Was nun?

# Unsupervised Learning Clustering



Daten komprimieren

Cluster gefunden: Was nun?

# Unsupervised Learning

## Association

# Unsupervised Learning

## Association



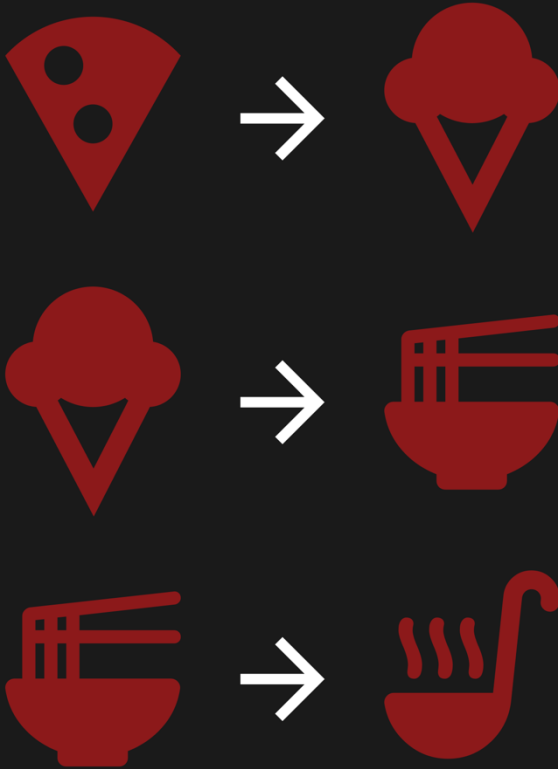
# Unsupervised Learning

## Association



# Unsupervised Learning

## Association



### Assoziationsregeln

- Support - Vorkommnisse im Datensatz
- Confidence - Genauigkeit im Datensatz
- Lift - Wahrscheinlichkeit in Relation zum Zufall

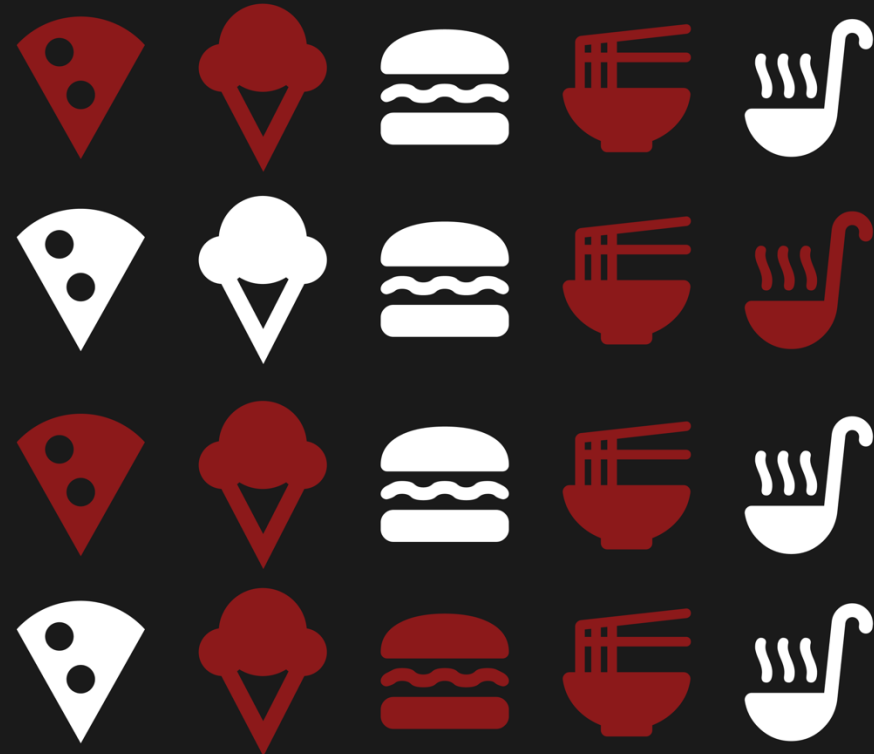


# Unsupervised Learning

## Association



Support: 50%  
Confidence: 100%  
Lift: 1.33



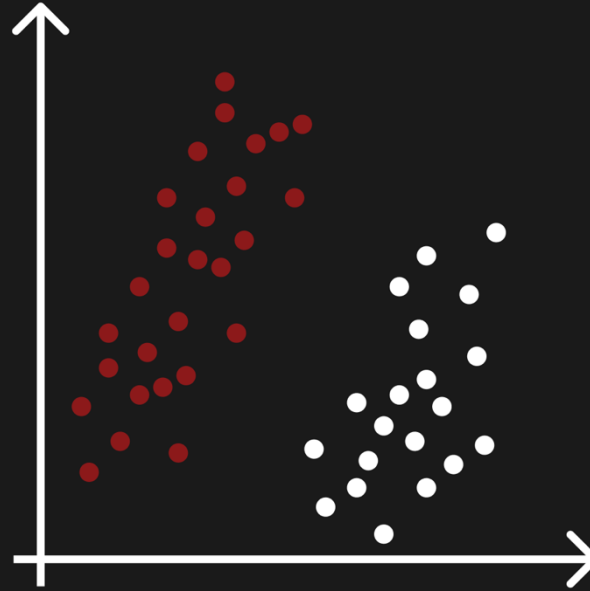


# Unsupervised Learning

## Dimensionality Reduction

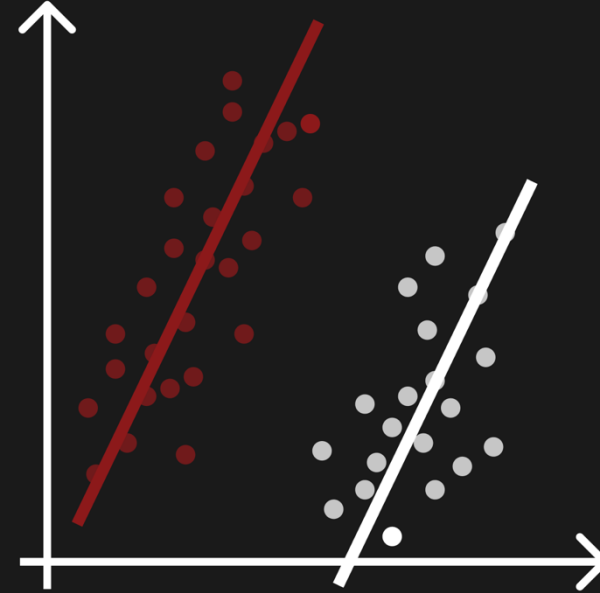
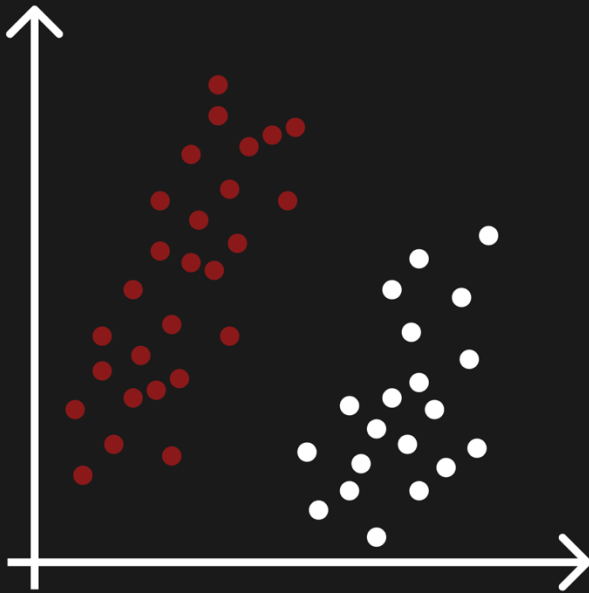
# Unsupervised Learning

## Dimensionality Reduction



# Unsupervised Learning

## Dimensionality Reduction



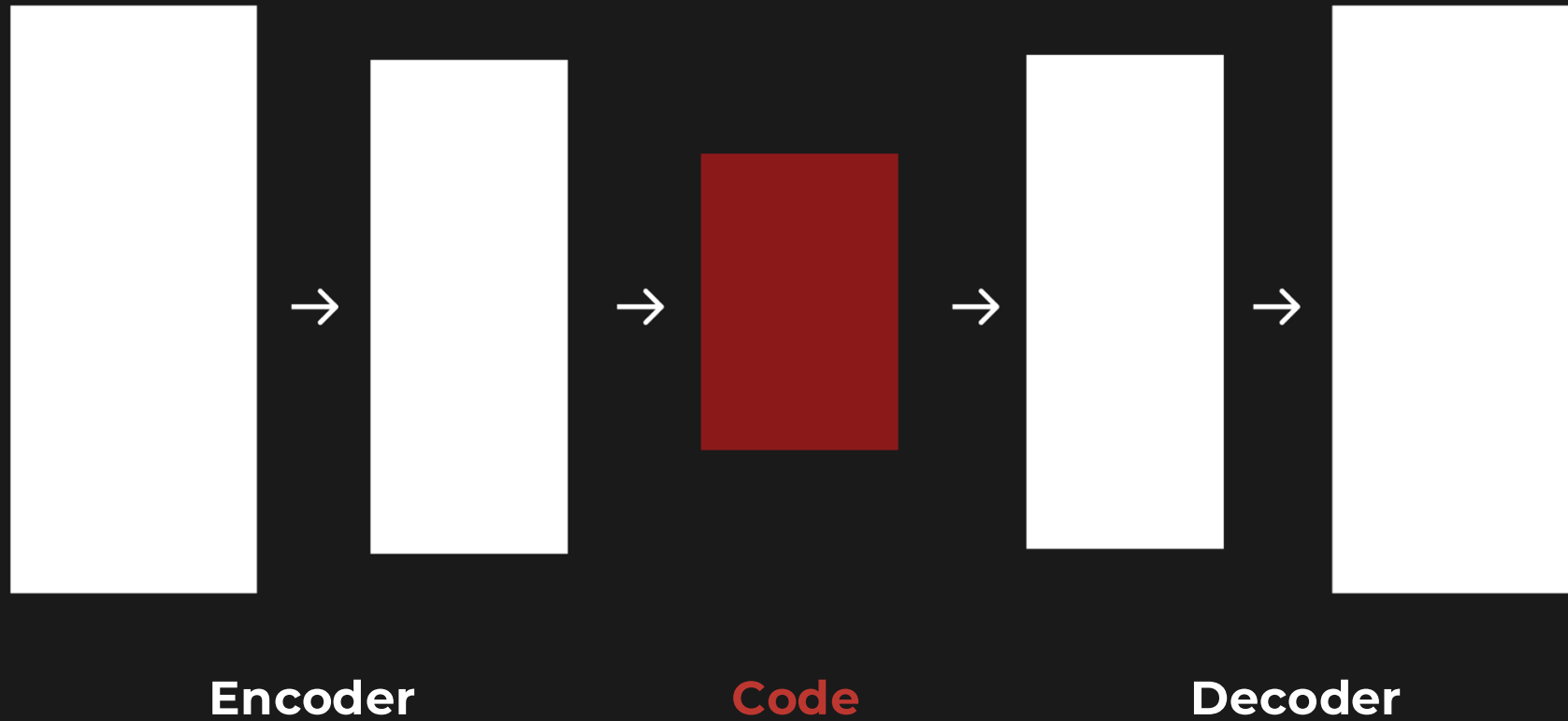
# Unsupervised Learning

## Dimensionality Reduction

### Autoencoder

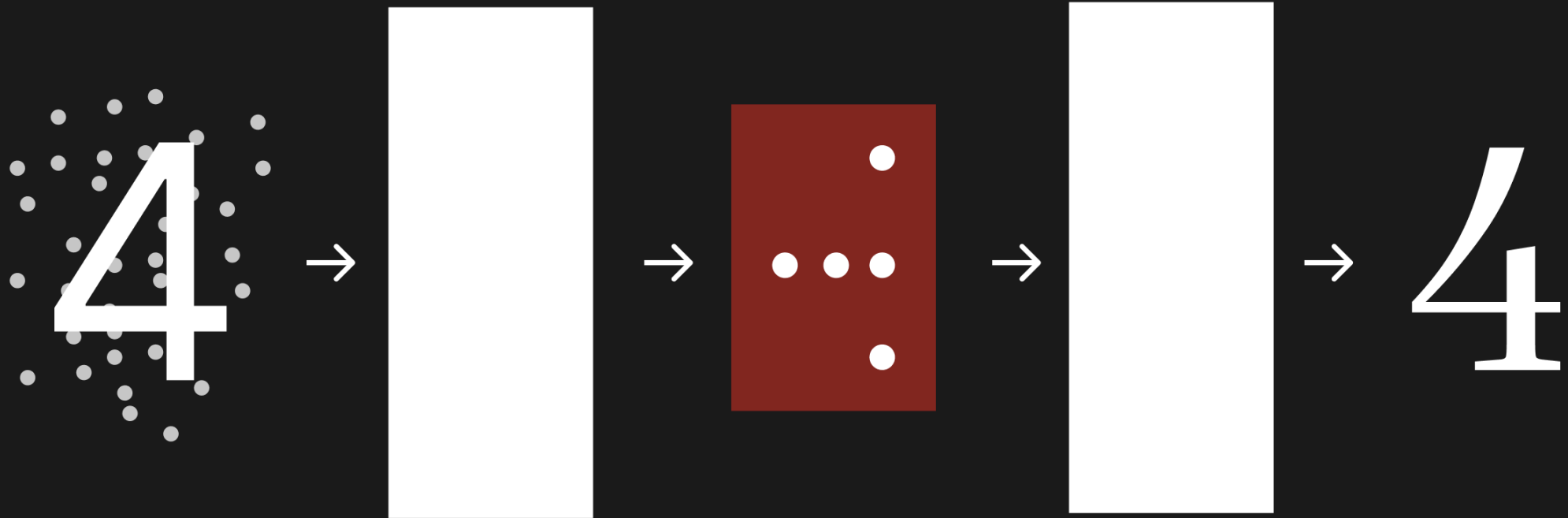
# Unsupervised Learning

## Dimensionality Reduction



Autoencoder

# Unsupervised Learning Dimensionality Reduction



Autoencoder

# Unsupervised Learning

## Dimensionality Reduction

### Einsatzgebiete

- Rauschreduzierung
- Bildkomprimierung
- Datenvorverarbeitung - Effizienteres Lernen
- Sprachverarbeitung

# Unsupervised Learning

## Dimensionality Reduction

### Nachteile

- Informationen gehen verloren
- Hoher Rechenaufwand



# Einführung in **Machine Learning**.

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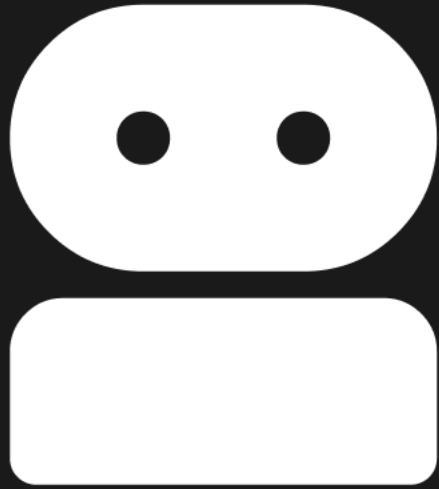
Zusammenfassun  
g

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# Reinforcement Learning

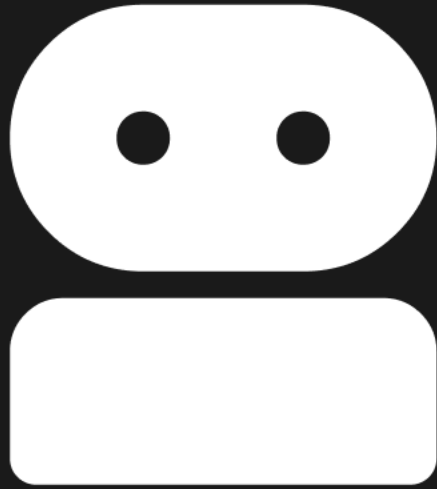
04

# Reinforcement Learning

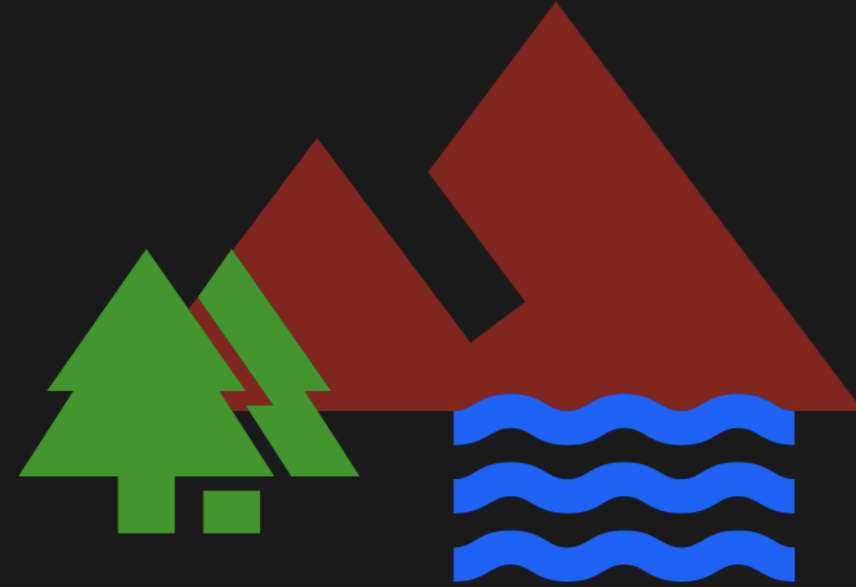


**Agent**

# Reinforcement Learning

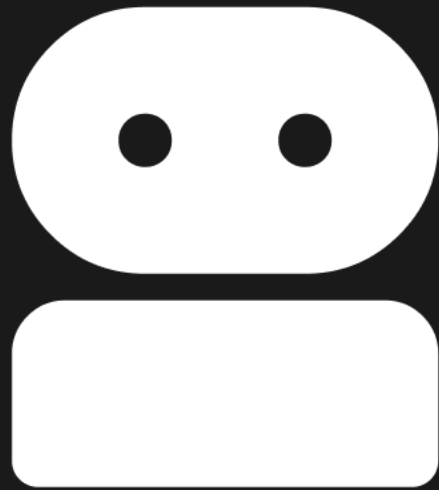


Agent



Environment

# Reinforcement Learning

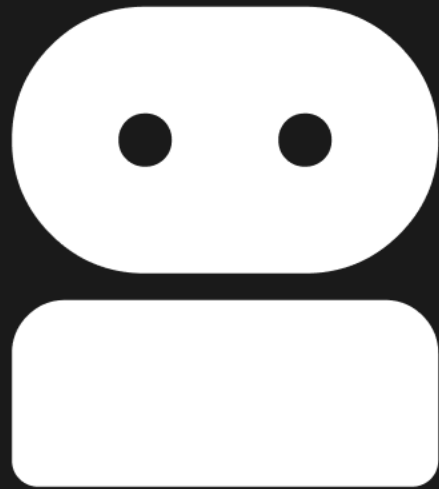


Agent

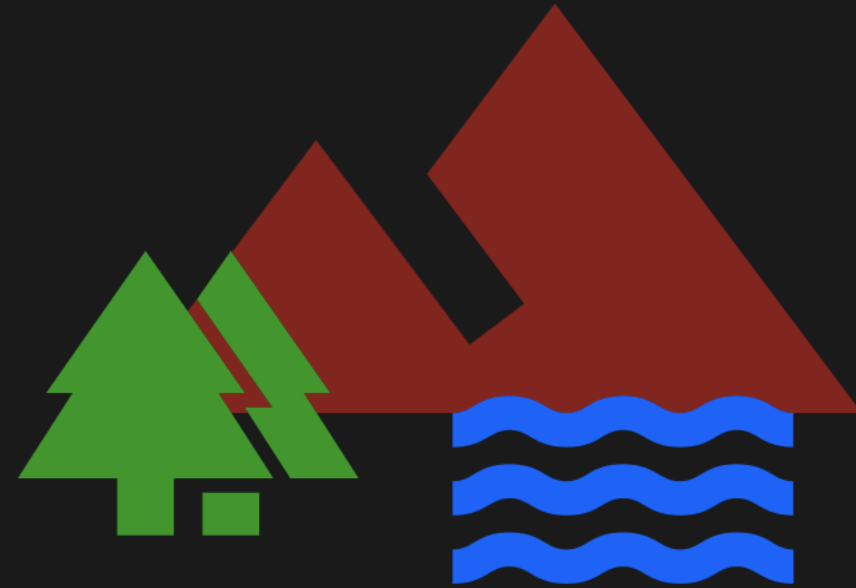
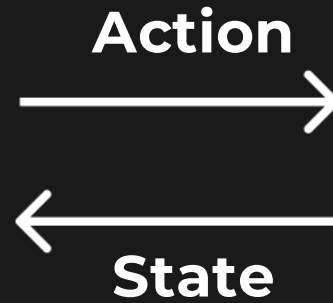


Environment

# Reinforcement Learning

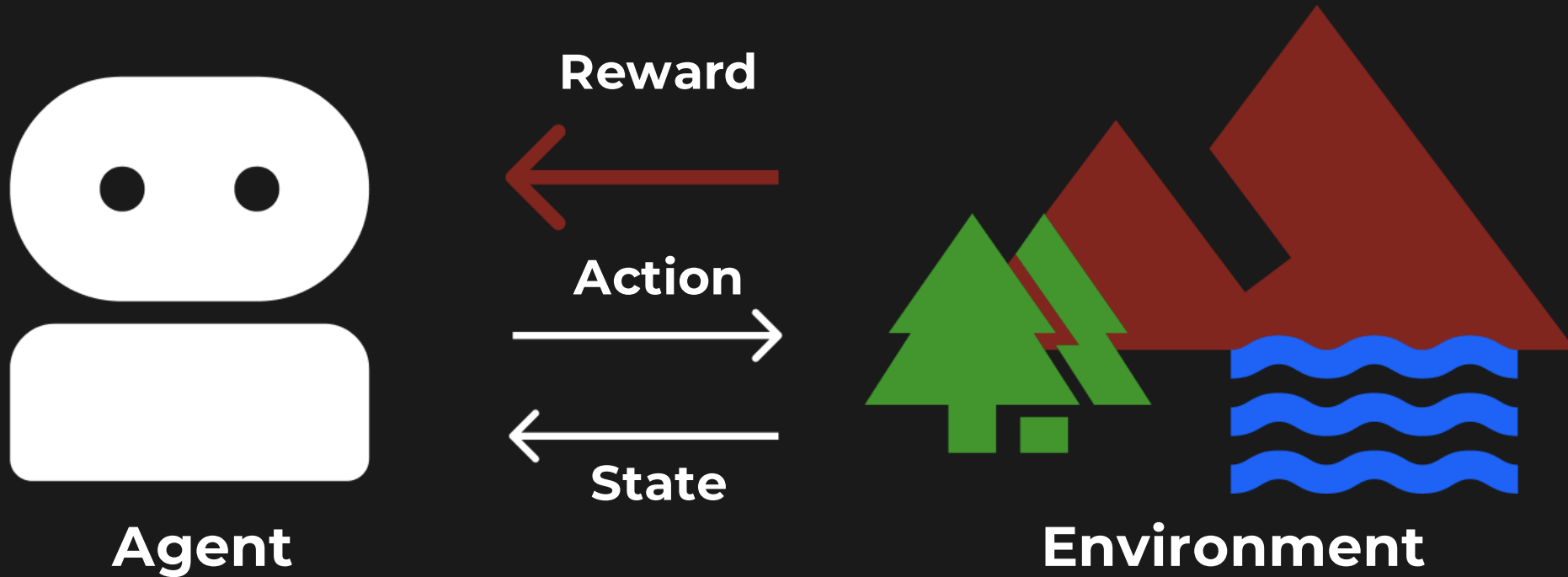


Agent

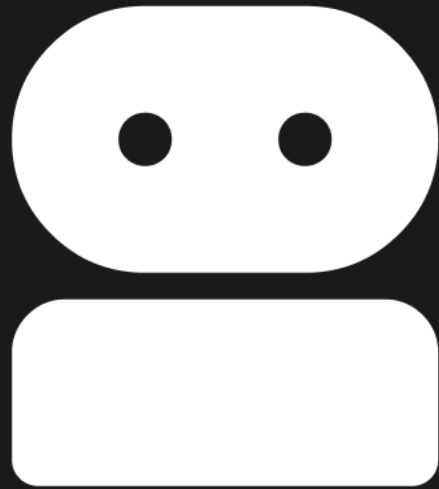


Environment

# Reinforcement Learning



# Reinforcement Learning



Agent

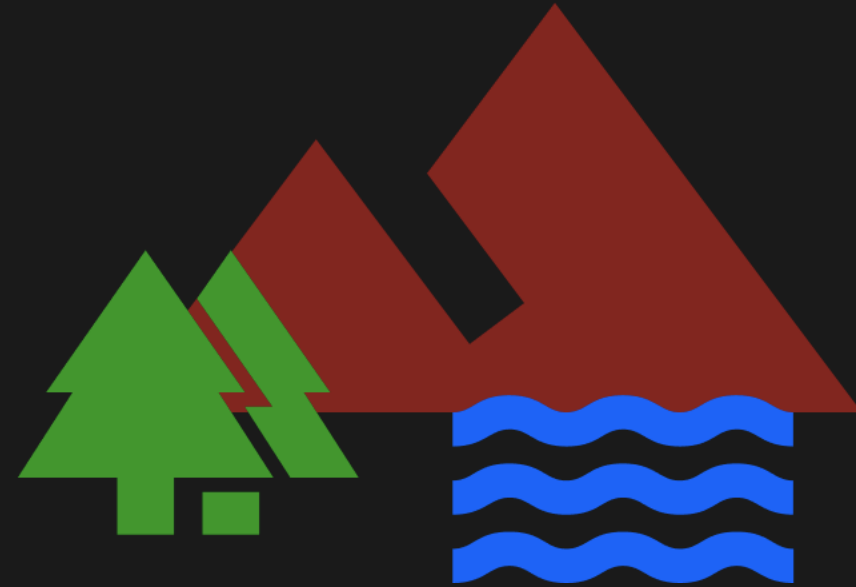
Punishment



Action



State



Environment



# Reinforcement Learning

Maximiere die Belohnung

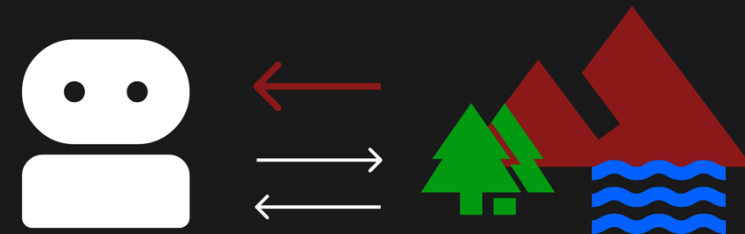
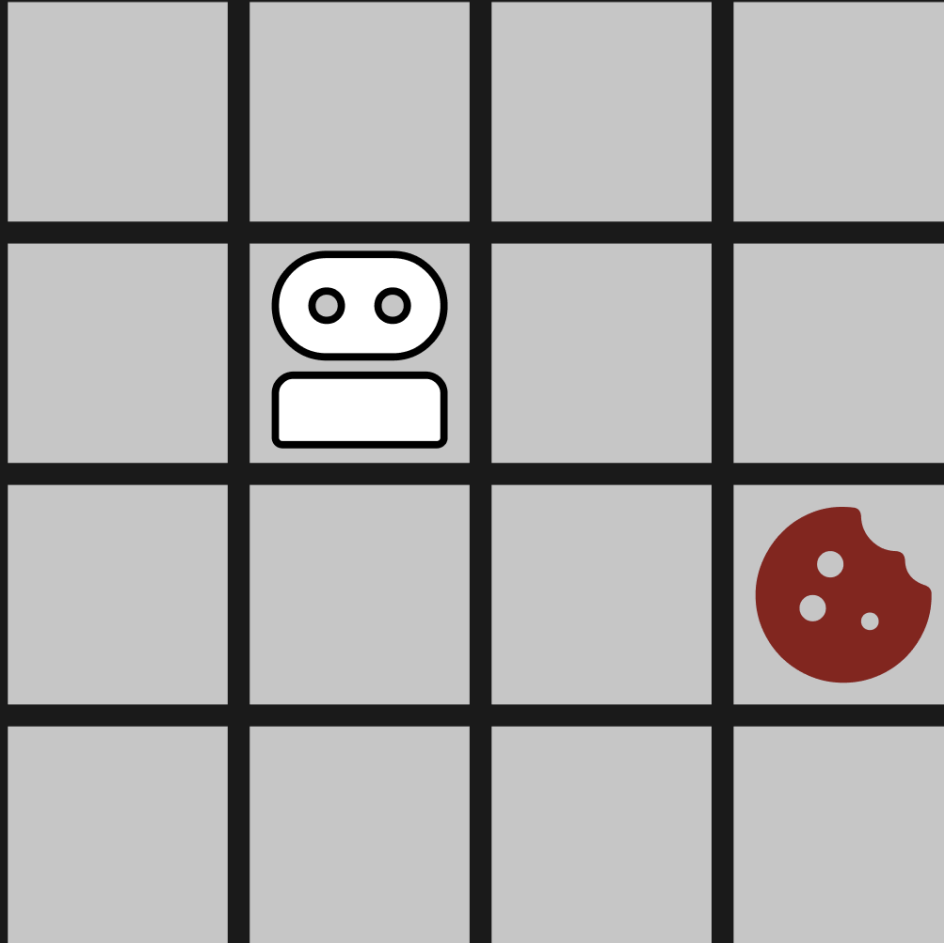


# Reinforcement Learning

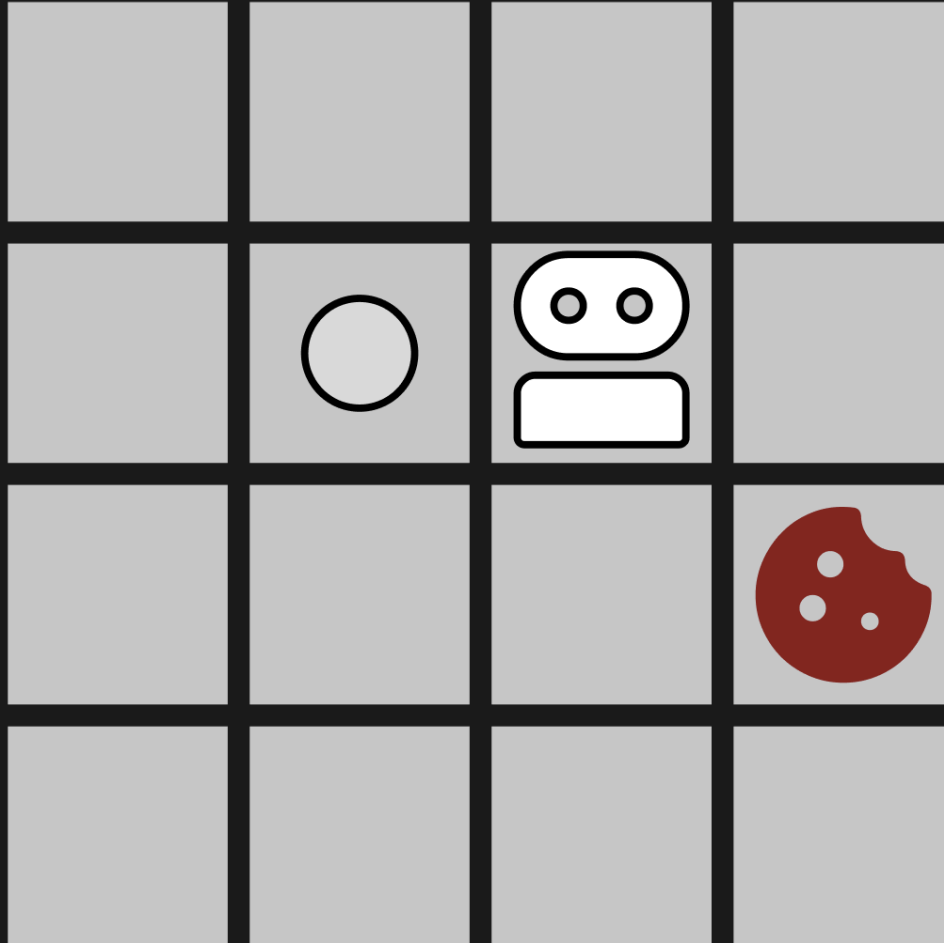
## Trail and error



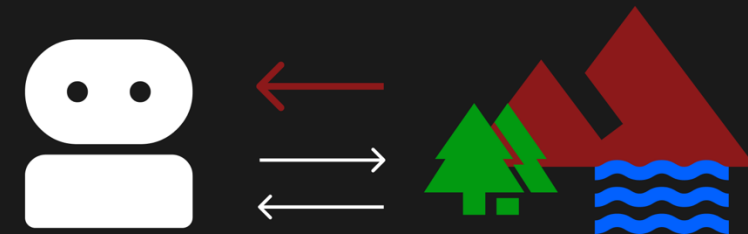
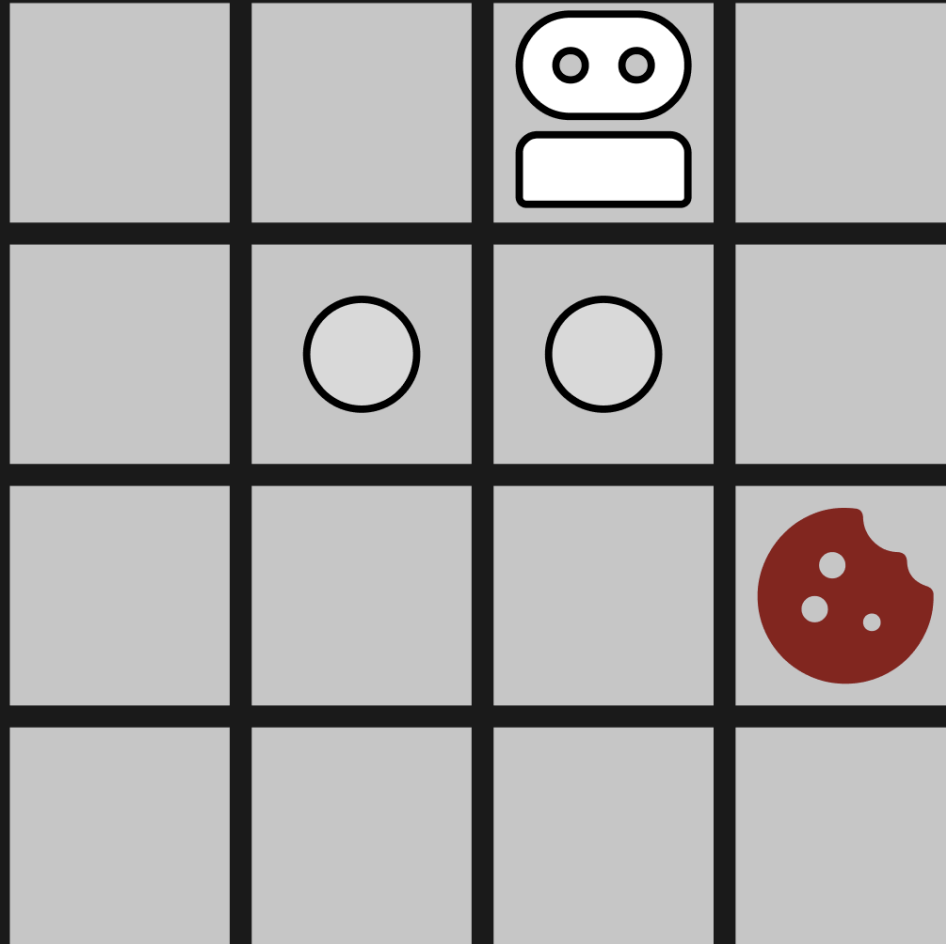
# Reinforcement Learning



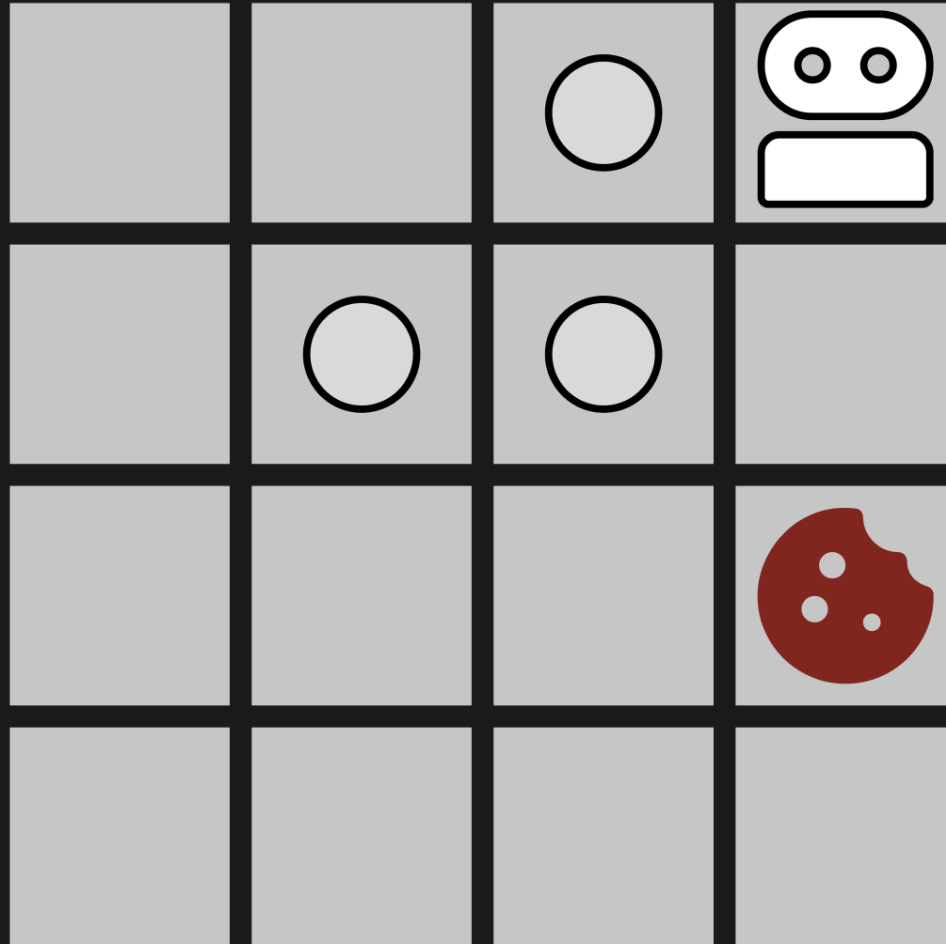
# Reinforcement Learning



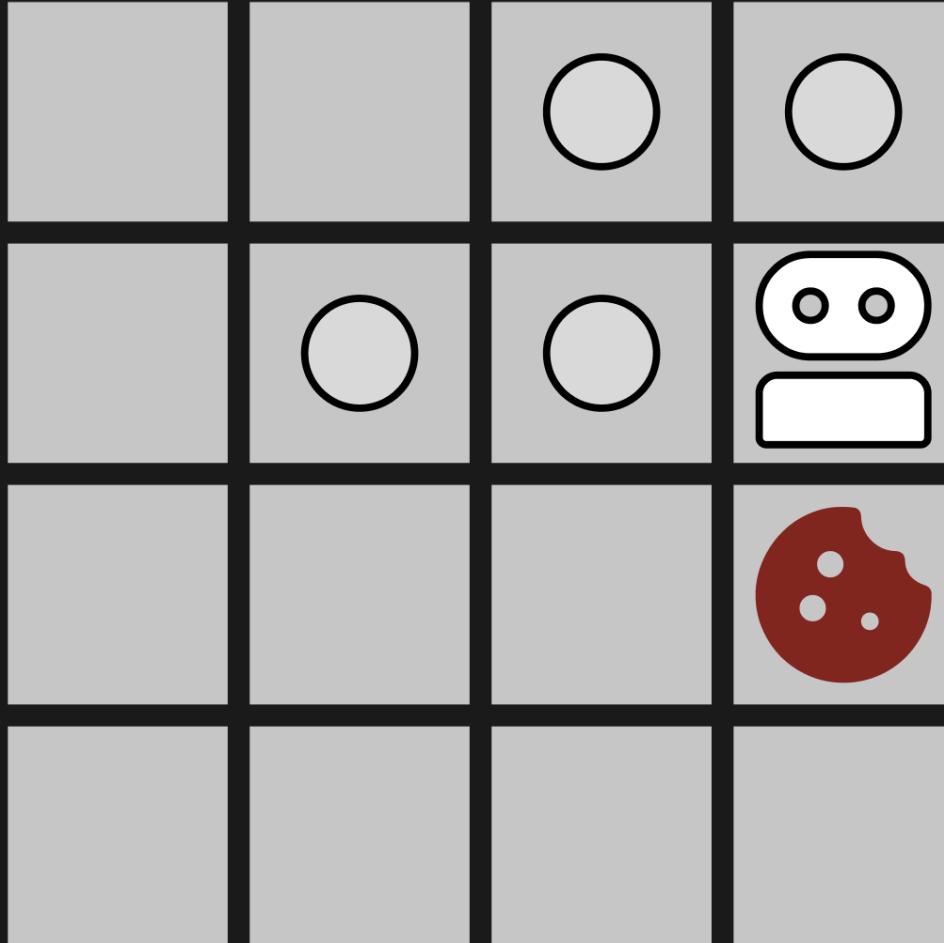
# Reinforcement Learning



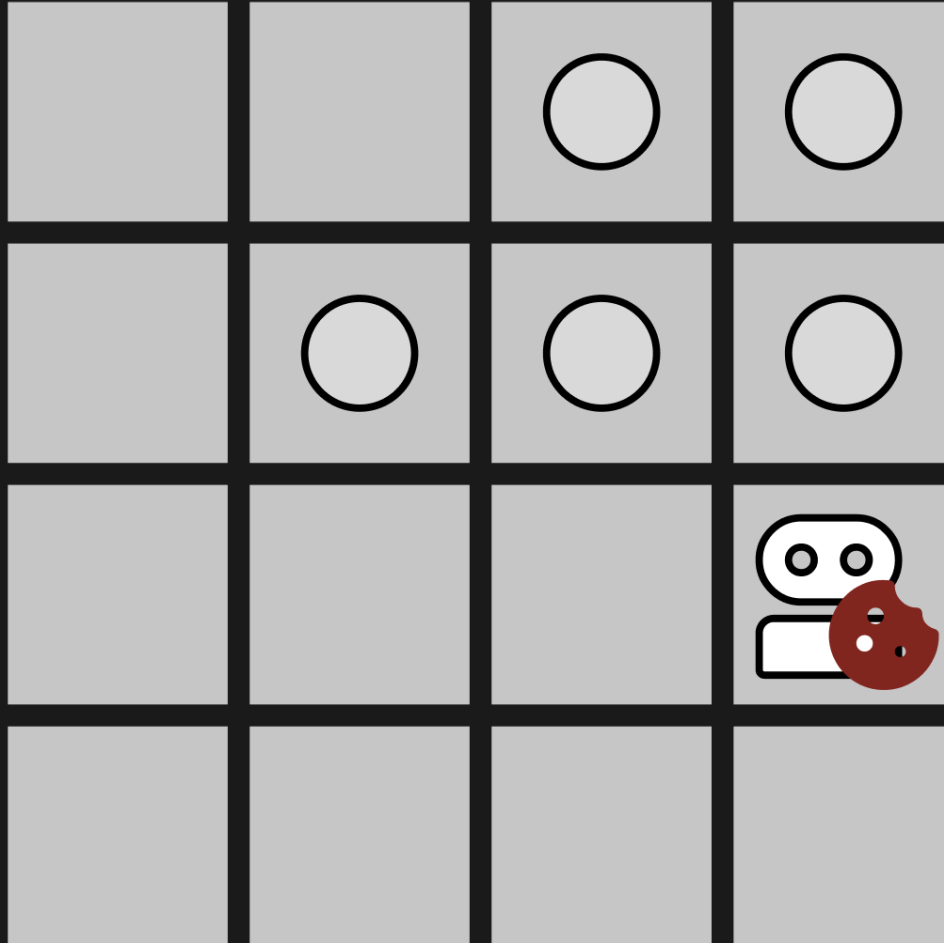
# Reinforcement Learning



# Reinforcement Learning

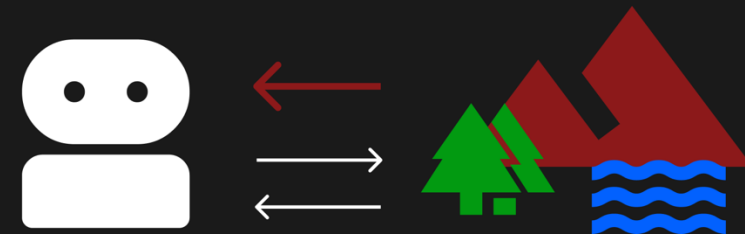
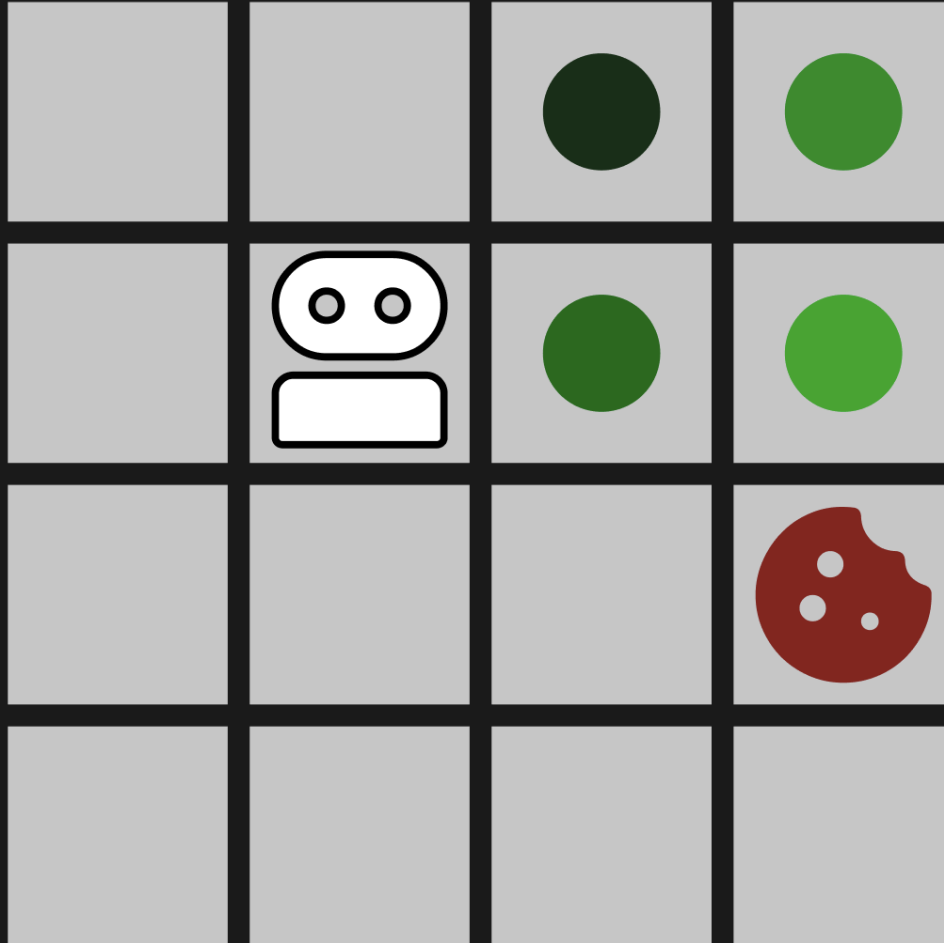


# Reinforcement Learning

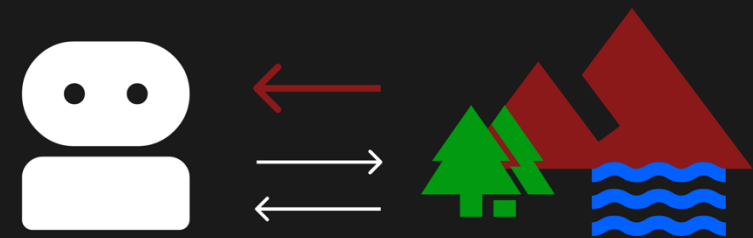
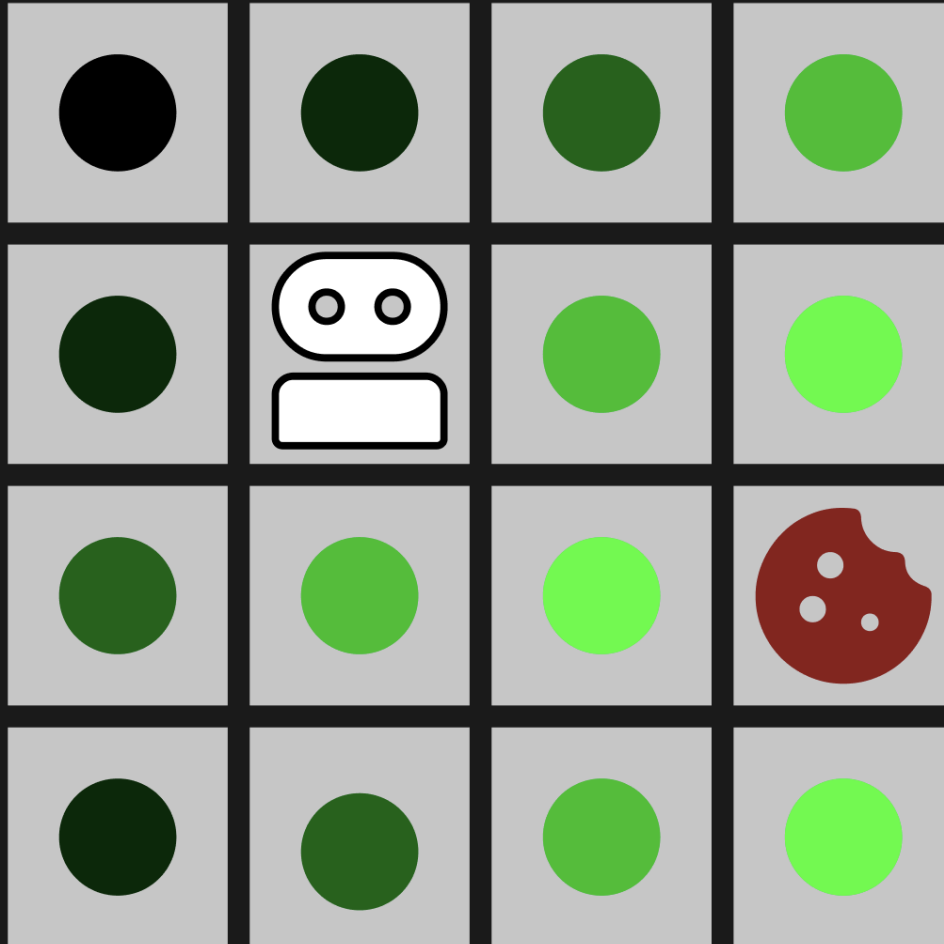




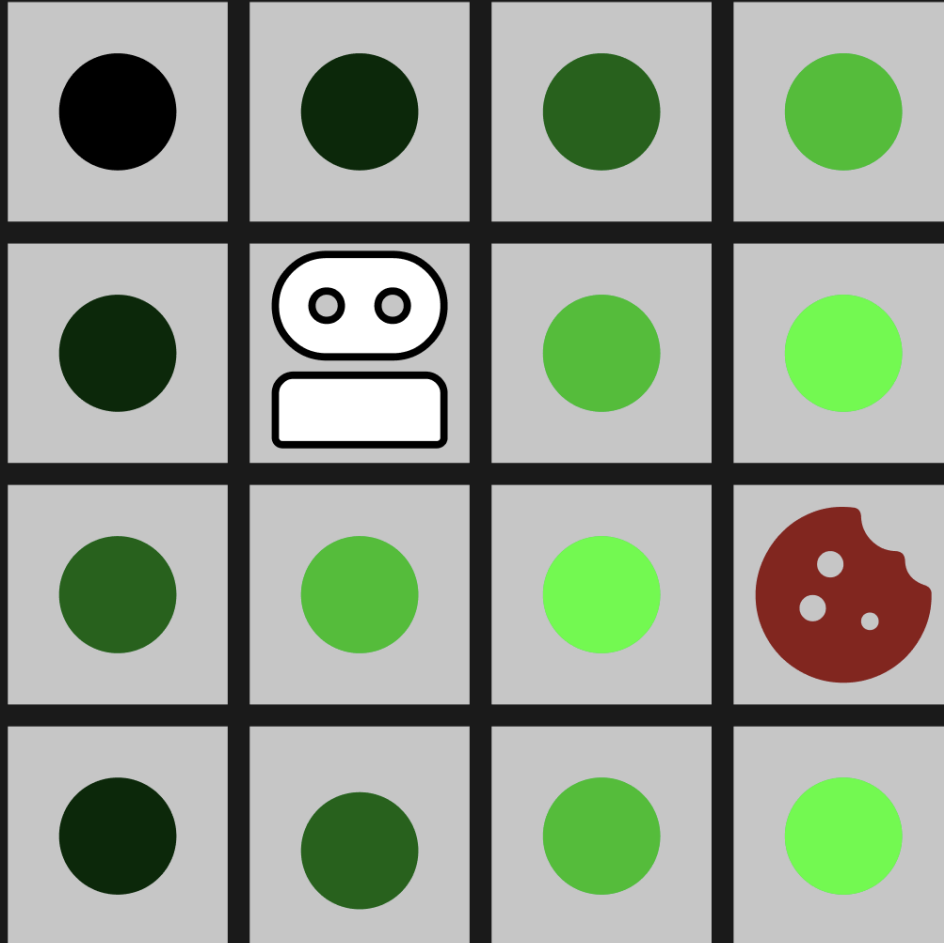
# Reinforcement Learning



# Reinforcement Learning

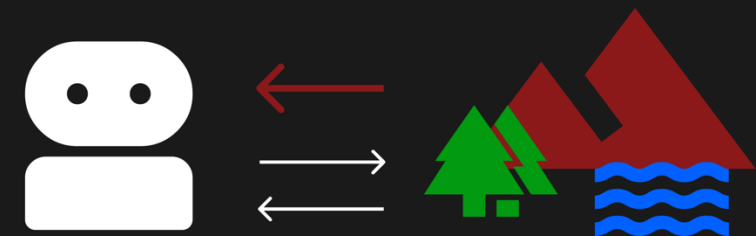


# Reinforcement Learning



## Policy

- Q-Table
- Deep-Q-Learning



# Reinforcement Learning

## Einsatzgebiete

- Autonomes Fahren
- NPCs
- Automatisierung von Robotern
- Trading-Strategien

# Einführung in **Machine Learning**.

01

**Was ist  
Machine  
Learning?**

02

Supervised  
Learning

03

Unsupervised  
Learning

04

**Reinforcement  
Learning**

05

Zusammenfassun  
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# Zusammenfassung

05

# Zusammenfassung

- Was ist AI? Was ist ML? Was ist DL?
- Supervised Learning
  - Regression vs. Classification
- Unsupervised Learning
  - Clustering
  - Association
  - Dimensionality Reduction
- Reinforcement Learning

# Weiterführende Literatur

<https://blogs.nvidia.com/blog/tag/machine-learning/>

<https://www.3blue1brown.com/topics/neural-networks>

<https://www.ibm.com/topics/artificial-intelligence>

[https://scikit-learn.org/stable/user\\_guide.html](https://scikit-learn.org/stable/user_guide.html)

Machine Learning - Tom M. Mitchell, 1997

Deep Learning - Ian Goodfellow & Yoshua Bengio & Aaron Courville, 2016

Reinforcement Learning - An Introduction second edition - Richard S. Sutton & Andrew G. Barto, 2020





**VIELEN DANK!**