

# Arbeit im Wandel: Das Zeitalter der künstlichen Intelligenz

Dateninnovationen in der Praxis – Von der Datenaufbereitung bis zur KI

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# Über mich

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**Forschungsschwerpunkte:**

- Die Zukunft der Arbeit mit neuen Technologien
- People Analytics und Algorithmisches Management
- Analyse Digitaler Fußspuren
- Social Process Mining

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Hauptstraße

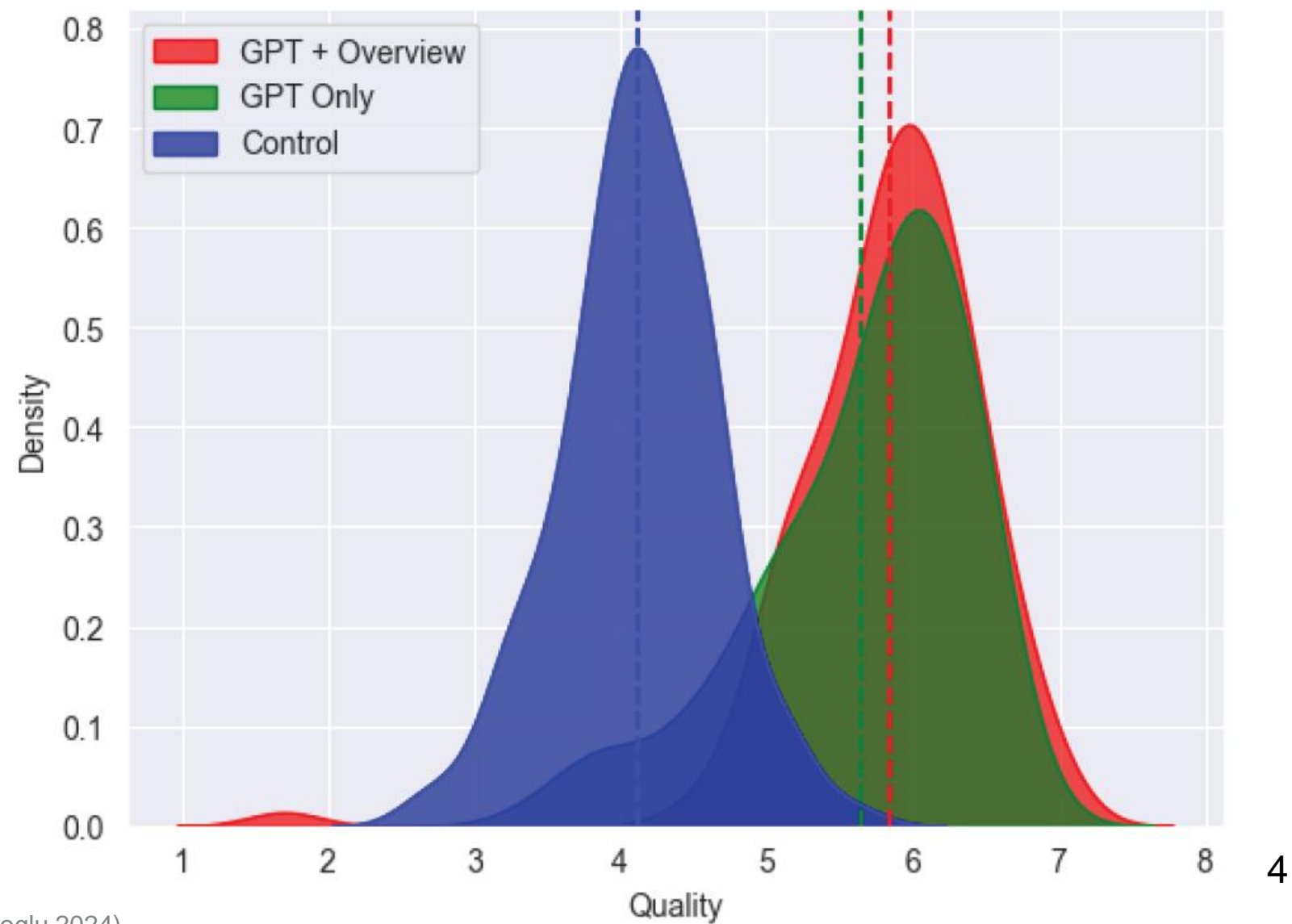
Hauptstraße

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Anlagen



# Produktivitätssteigerung in Wissensarbeit



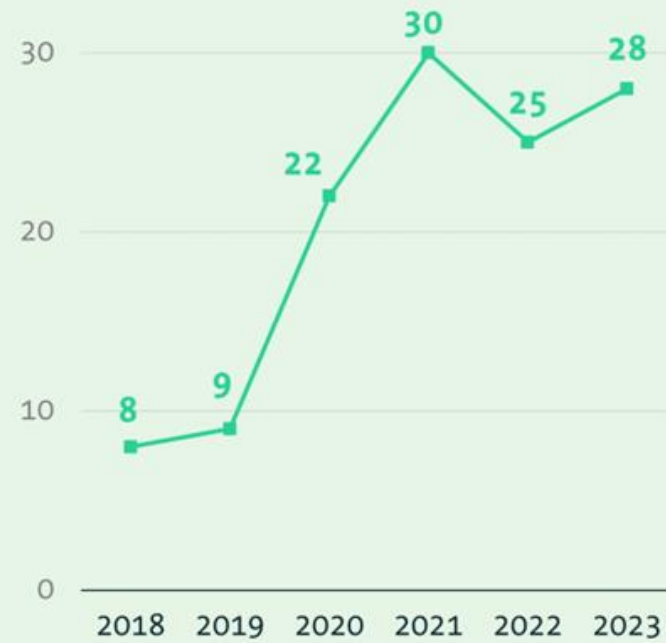
# Steigender Bedarf



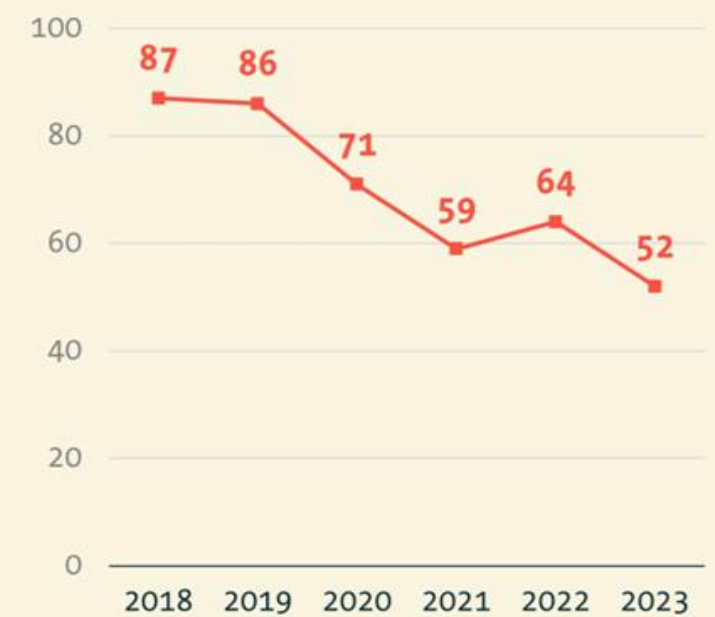
## Einsatz



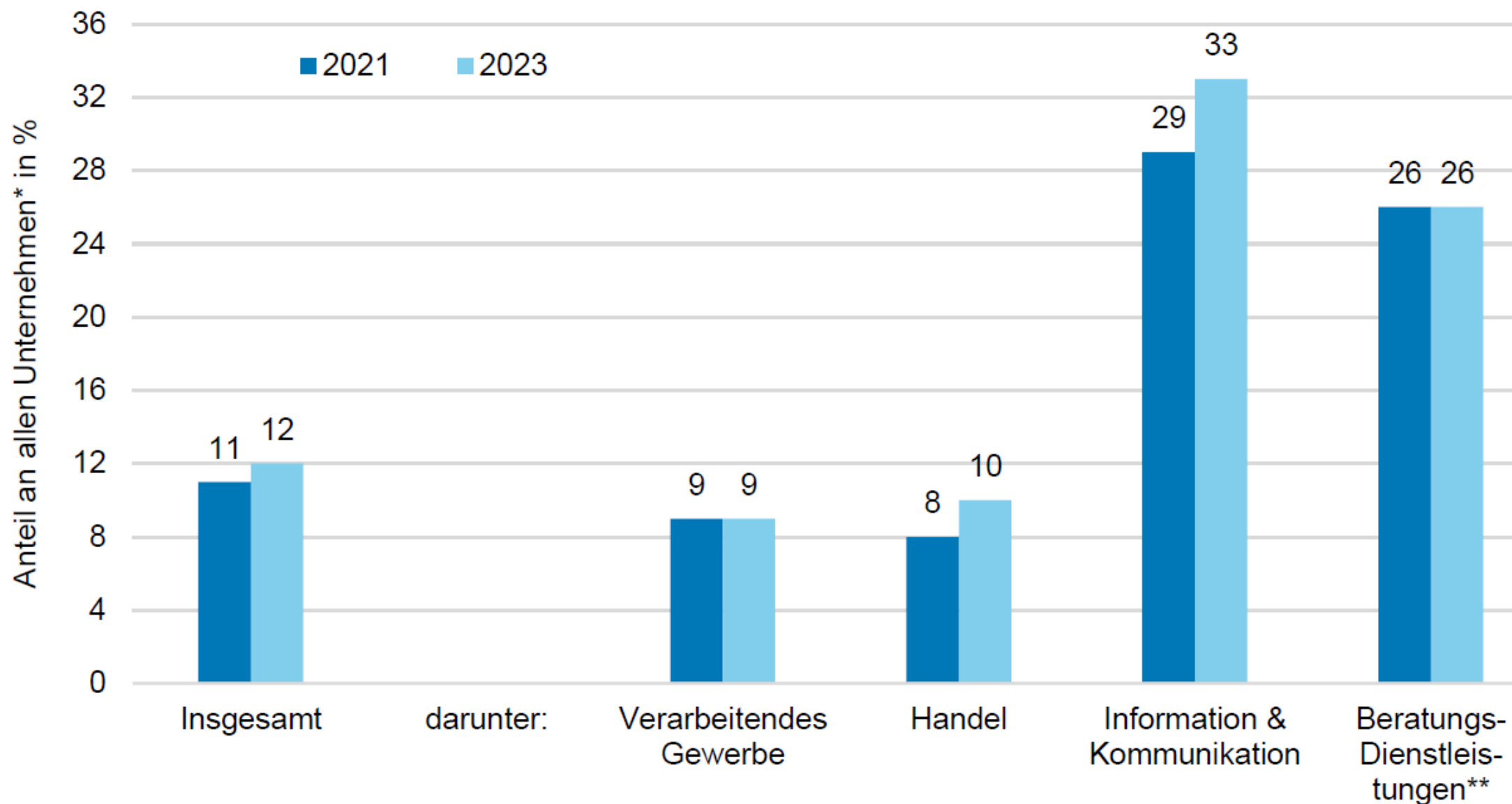
## Geplant oder diskutiert



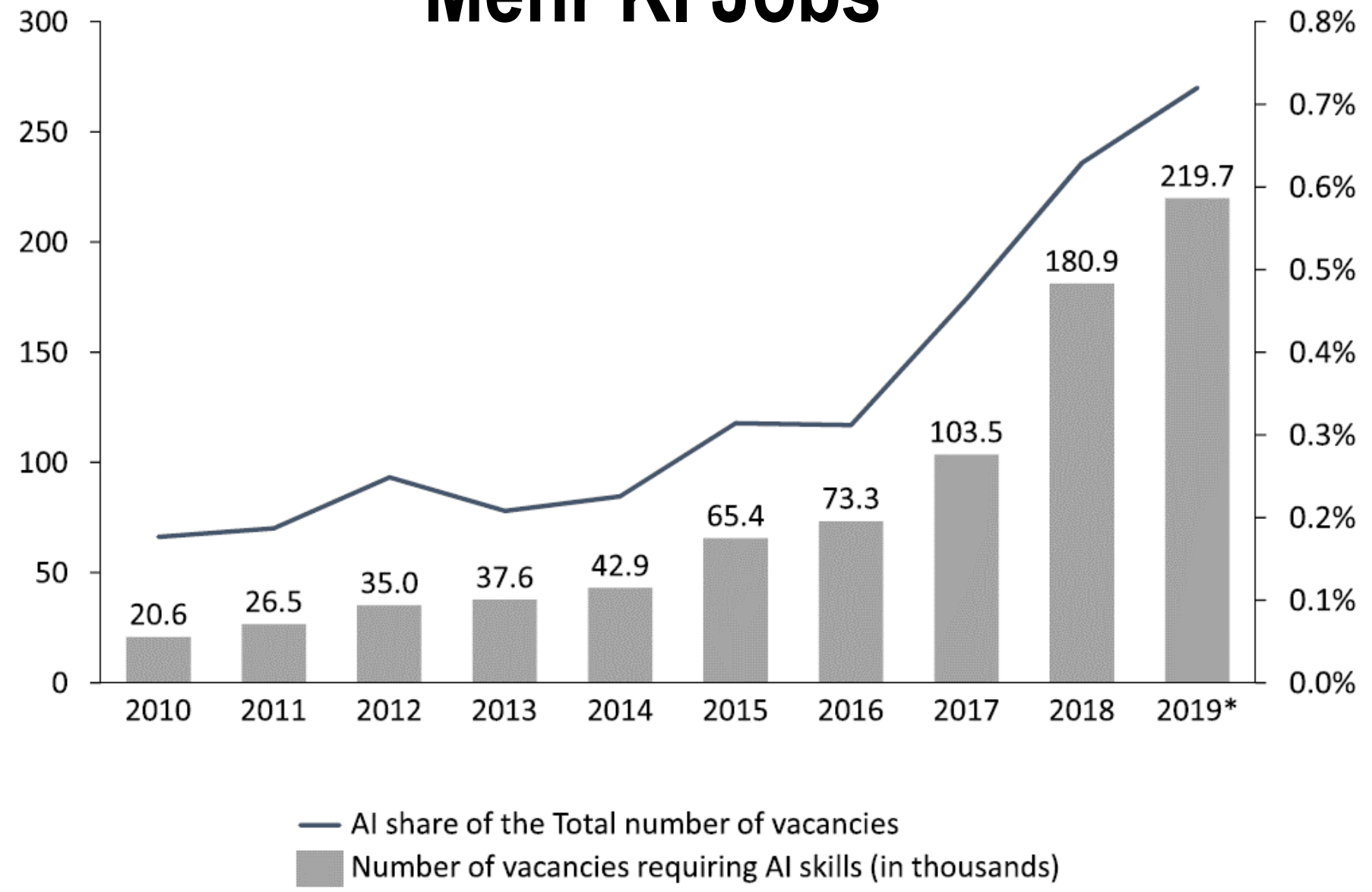
## Kein Thema



# Viele Branchen sind von KI betroffen

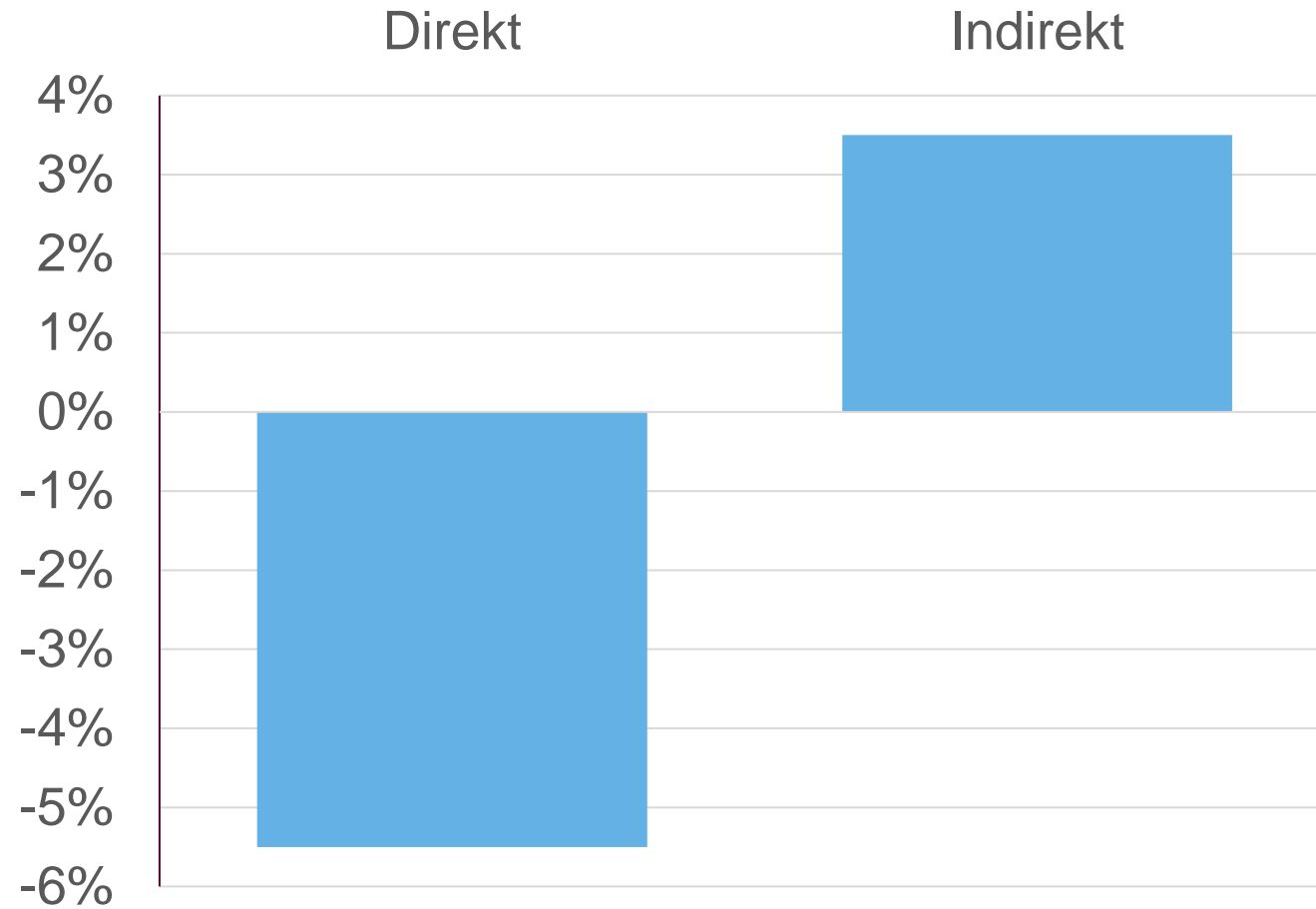


# Mehr KI Jobs

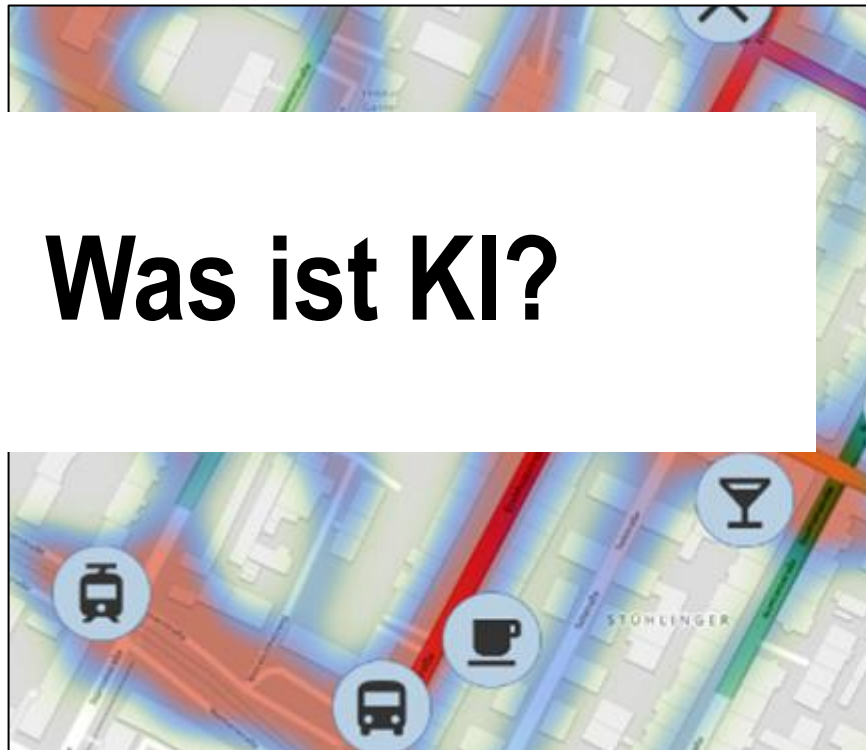
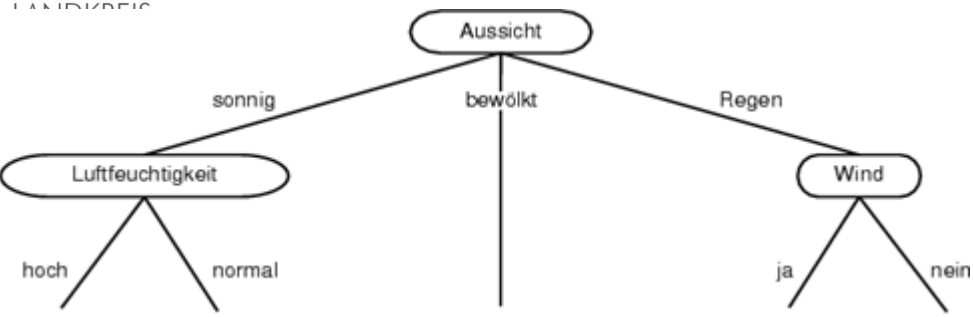


— AI share of the Total number of vacancies  
■ Number of vacancies requiring AI skills (in thousands)

# Lohn Effekte







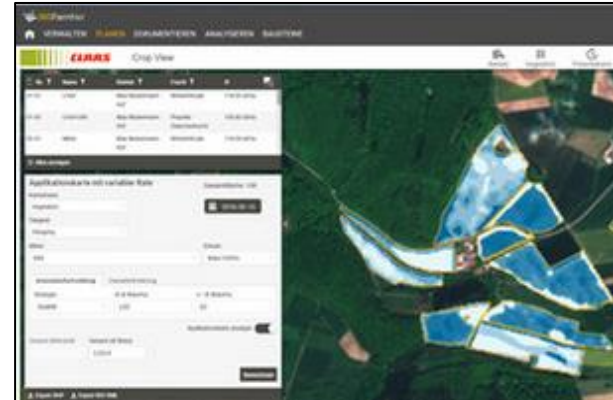
# Was ist KI?





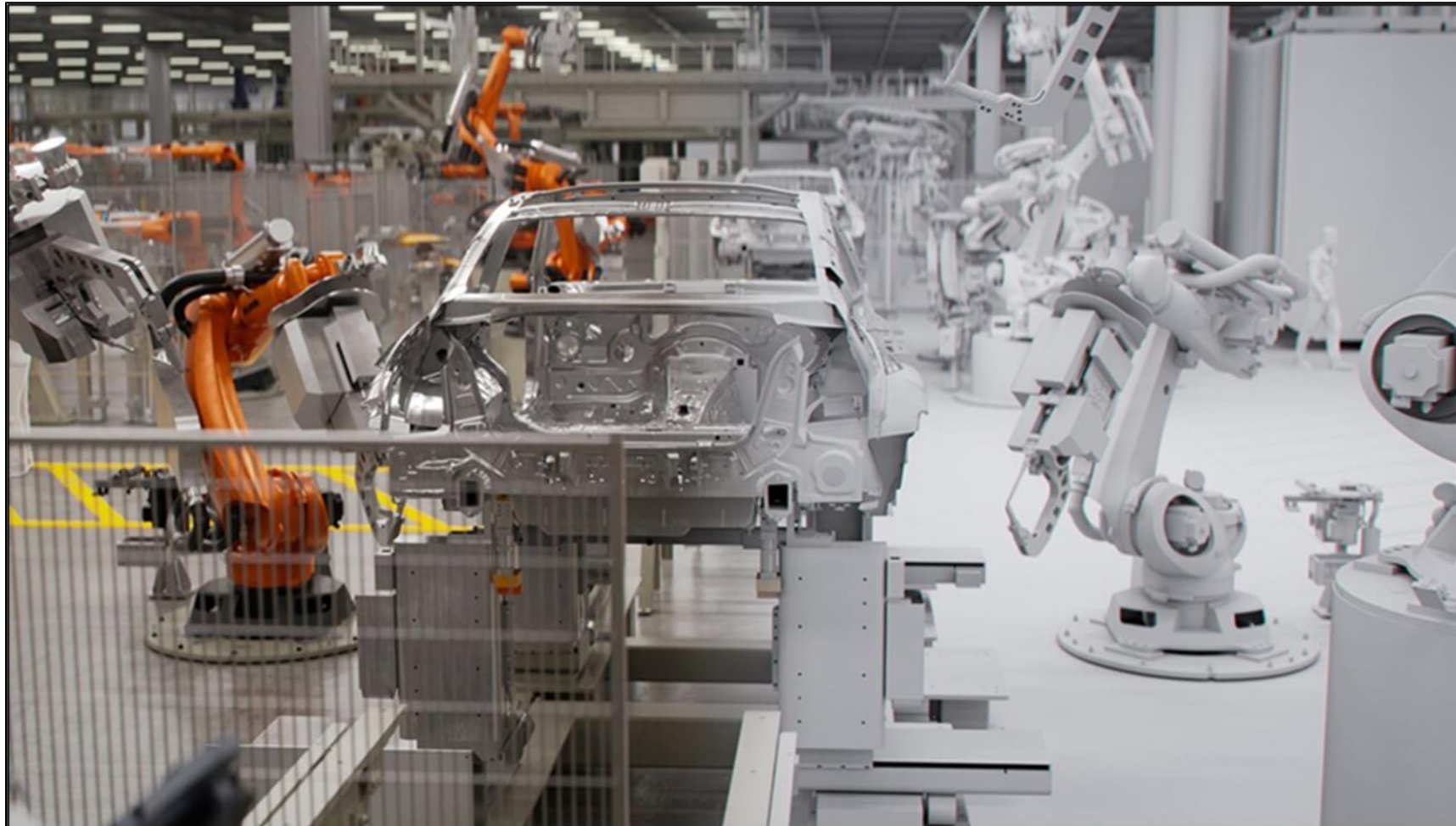
# ChatGPT

# Smart Farming





# Smart Manufacturing





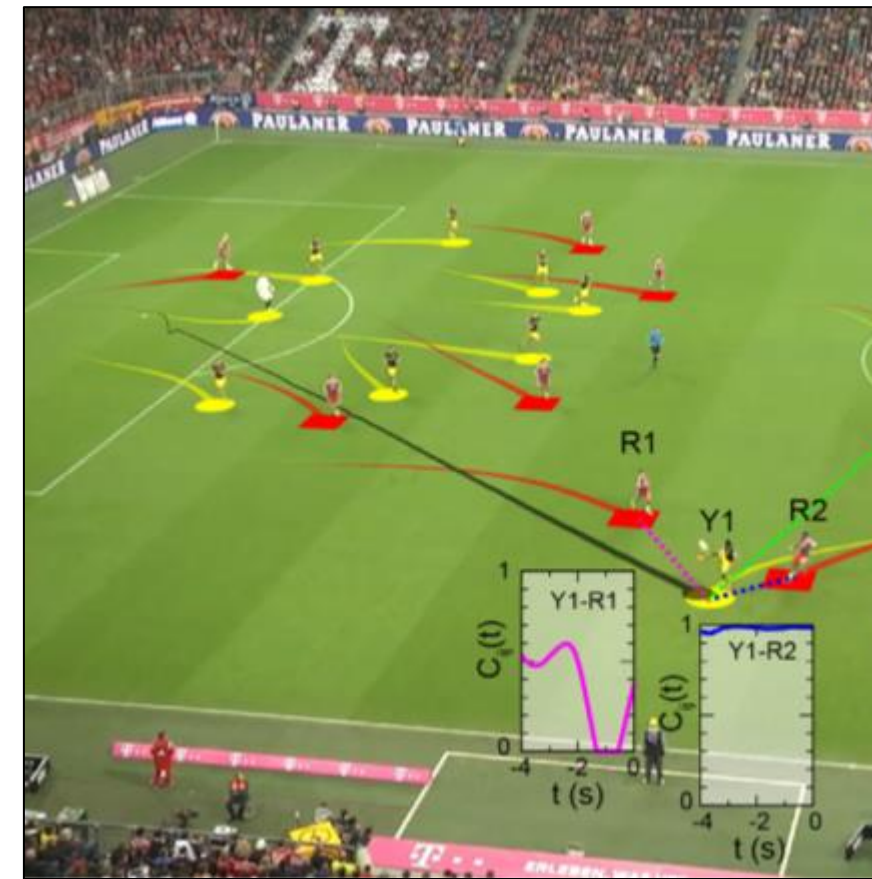
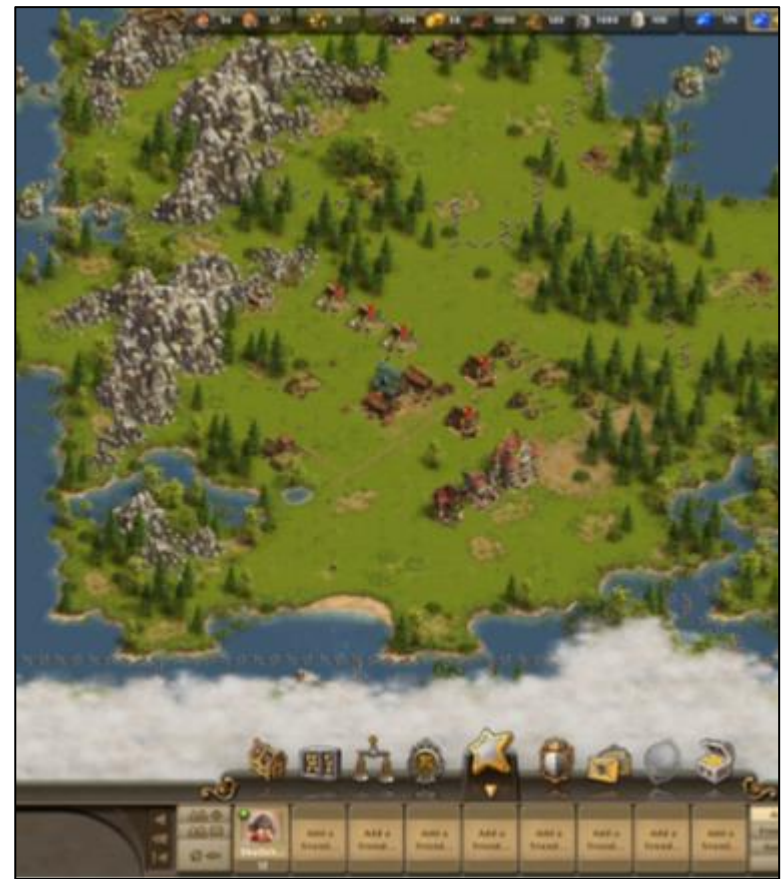
# Smart Krankenhaus



# Öffentlicher Verkehr



# Sport-, **Kunden-**, People Analytics

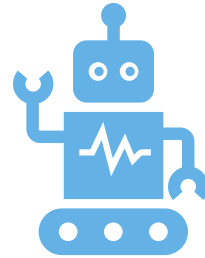








# Ist KI anders?



## KI Eigenschaften

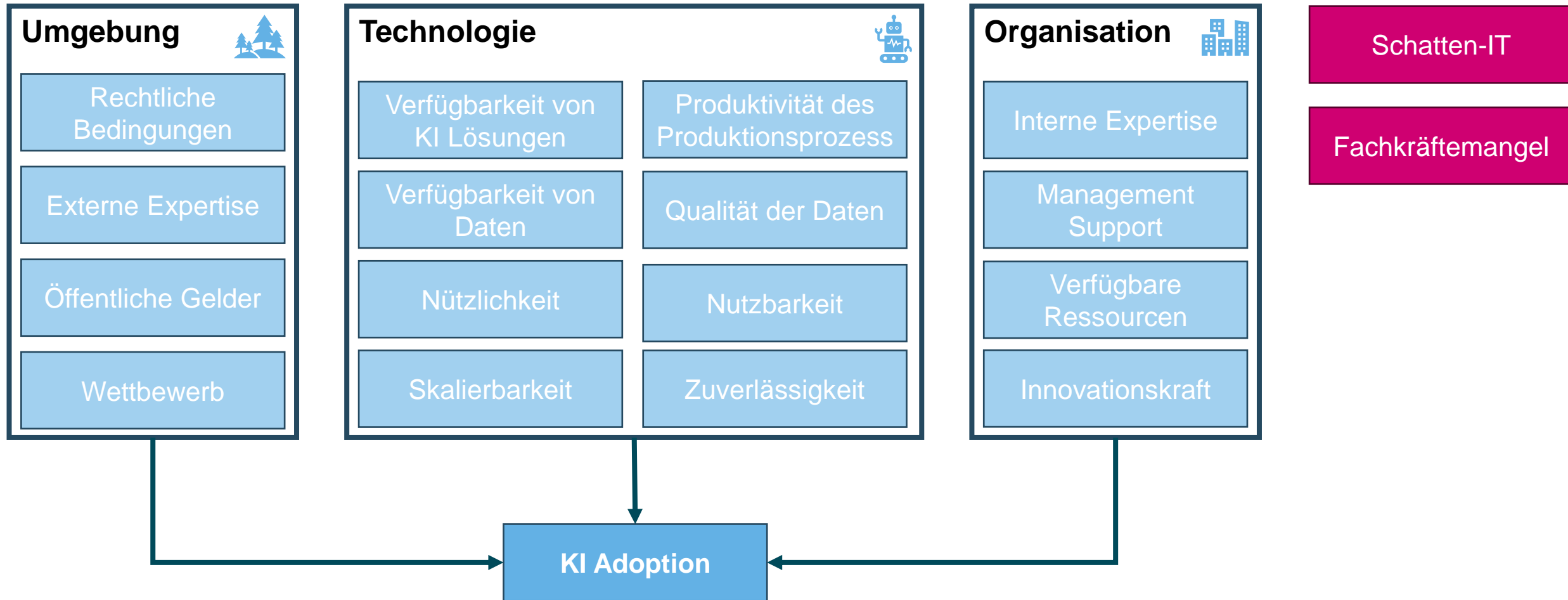
1. KI-Modelle sind eine “Blackbox”.
2. KI-Modelle haben Fehler und Unsicherheiten.
3. KI-Modelle bauen dauert lange.
4. KI-Modelle haben systematische Verzerrungen.



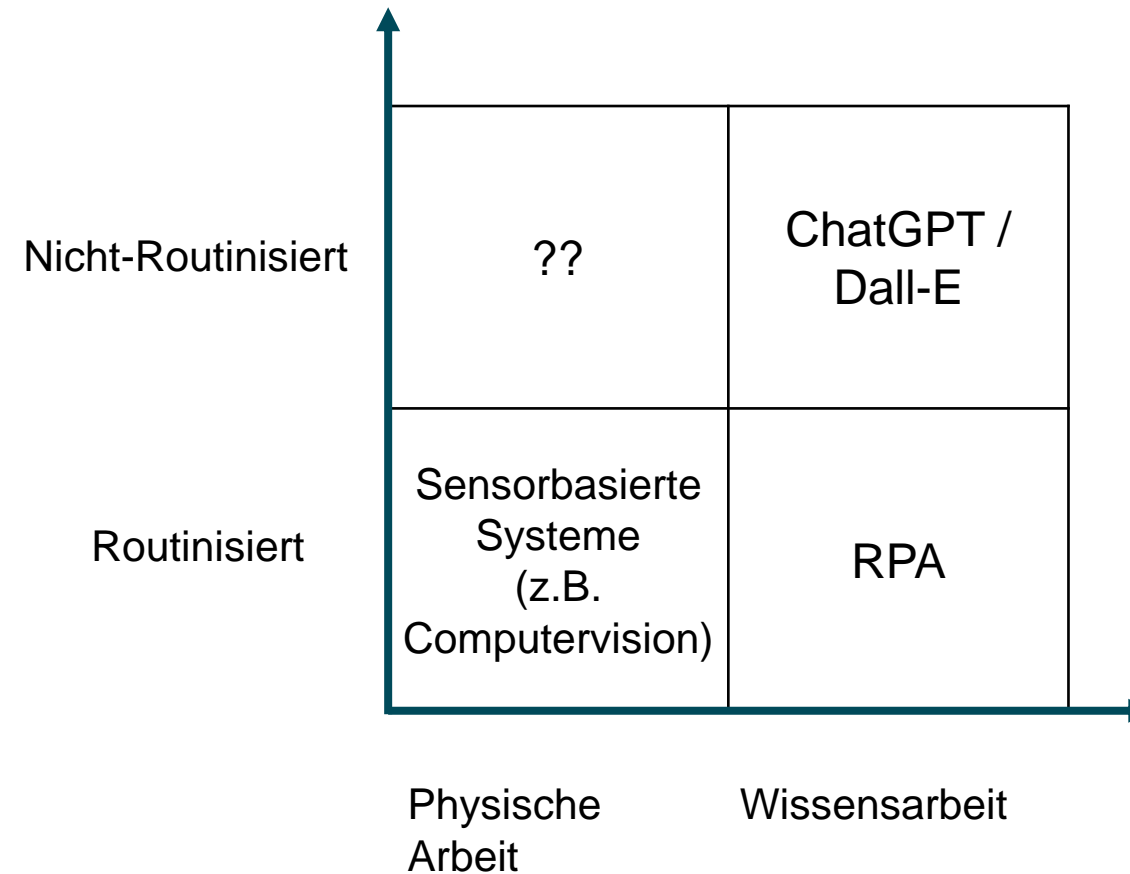
## Menschliche Eigenschaften

1. Vertrauen in Mensch vs. Künstliche Intelligenz.
2. Aversion gegen Künstliche Intelligenz.

# Adoption von KI (Unternehmenssicht)



# Welches KI Tool ist das richtige?



# Adoption von KI (Unternehmenssicht)



„Unsere Daten stecken in Silos und haben uneinheitliche Formate.“

„Wir haben nicht das Know-How.“



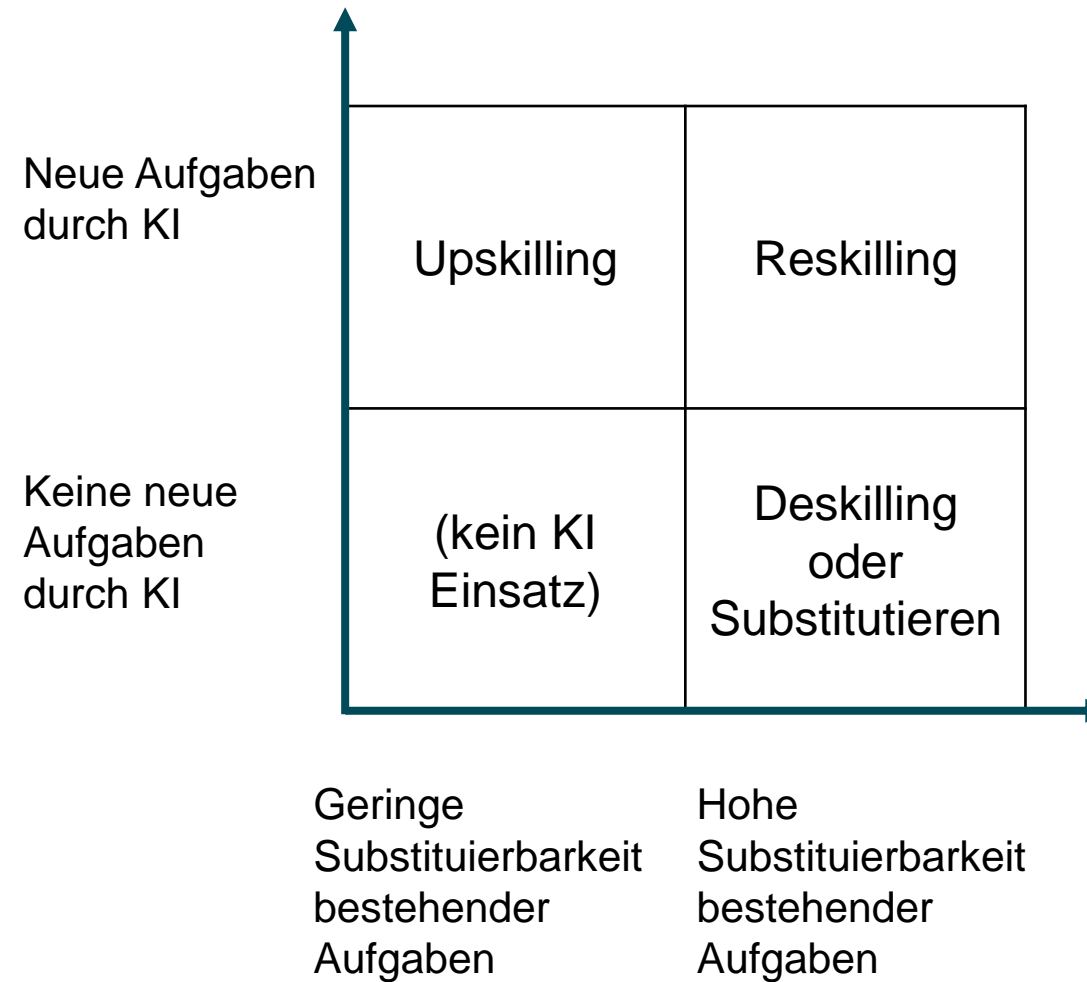
„Die Mitarbeiter bevorzugen bewährte Prozesse.“

„Sorge vor Kontrollverlust und Relevanzverlust.“





# Mitarbeiterentwicklung für KI





Danke.

**Jetzt sind Sie dran!**

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