



### GenAI possesses a wide range of capabilities and can perform multiple tasks currently done by humans



Expansion & summarization

Writing emails/articles based on prompts

Summarizing legal/regulatory documents

Classification

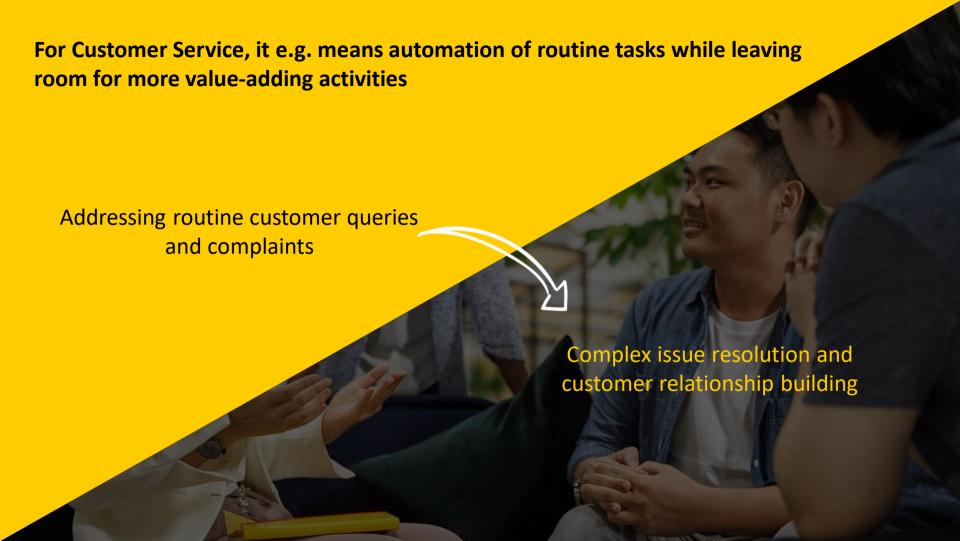
 Identifying fraudulent transactions based on guidelines

Inference

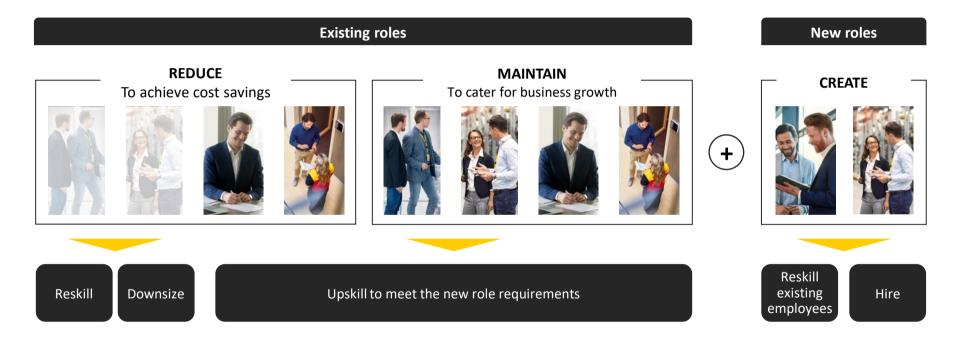
Analyzing large sets of data and providing insights and recommendations

Creative content generation

 Developing ad or campaign messaging ideas, personalized images and videos



# Increased employee productivity will have impact on existing roles; additionally, with GenAI, new roles will be created



Companies react differently to changes brought about by the new technology

**STOP HIRING** 

**LAY OFF** 

**RESKILL** 

IBM to pause hiring for ~30% of non-client facing employees¹

**Bild** expects to lay off **20% of employees** affected by Al<sup>2</sup>

**Ikea reskilled 8,500 call- handlers** as interior design advisors and generated \$1.4 bn in revenue<sup>3</sup>

Source: 1) World Economic Forum; 2) "Germany's biggest newspaper is cutting 20% of jobs as it prepares for an Al-powered digital future" – CNN (Published Jun 21, 2023); 3) "IBM to Pause Hiring for Jobs That Al Could Do" – Bloomberg (Published May 1, 2023)





For any given entity/department, the process of evaluating GenAI impact and adjusting the workforce consists of 4 steps

1

Identify affected roles

- What existing roles will be affected the most?
- What new roles will emerge?

2

Estimate headcount impact

- What will be the HC impact for existing roles?
- How many employees will we need in new roles?

3

Identify who to retain and up-/reskill

 What employees have the highest potential for up- and reskilling? 4

**Support** transition

- What are required training measures?
- How can we help with transition to other roles in the organization or the open market?

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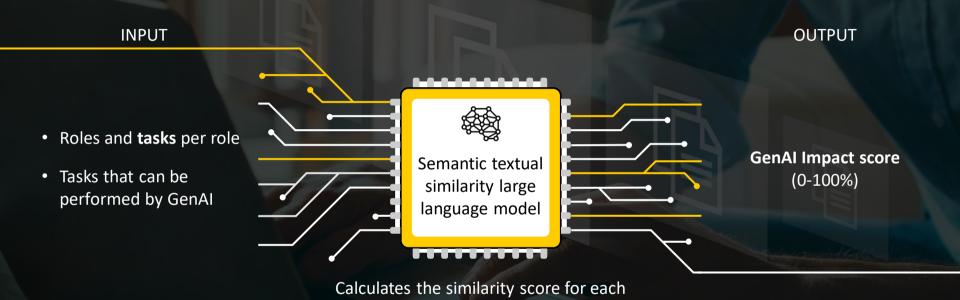
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A machine learning model can be used to calculate the GenAI impact score based on the similarity of tasks performed by employees and the GenAI



employee task depending on how close its meaning is to the collection of GenAl tasks

# It requires a standardized job architecture, with clearly defined employee tasks and skills for each role

JOB FUNCTION/FAMILY/TITLE	KEY TASKS	SKILLS
I. Customer Service a. Call center agent	<ul> <li>Provide administrative support for inbound/outbe phone calls, emails, web-based chats/instant messaging</li> <li>Administer simple customer requests such as inquiries, orders, service requirements and complaints</li> <li>Undertake assigned tasks related to sales, service customer satisfaction</li> <li>Perform generally repetitive routine tasks such as data gathering, entering and validation</li> <li>Adhere to standard operating procedures and processes within contact center</li> </ul>	<ul> <li>Data entry</li> <li>Complaints handling</li> <li>Account management</li> <li>Sales support</li> <li>Persuasion</li> <li>Empathy</li> <li>Adaptability</li> </ul>

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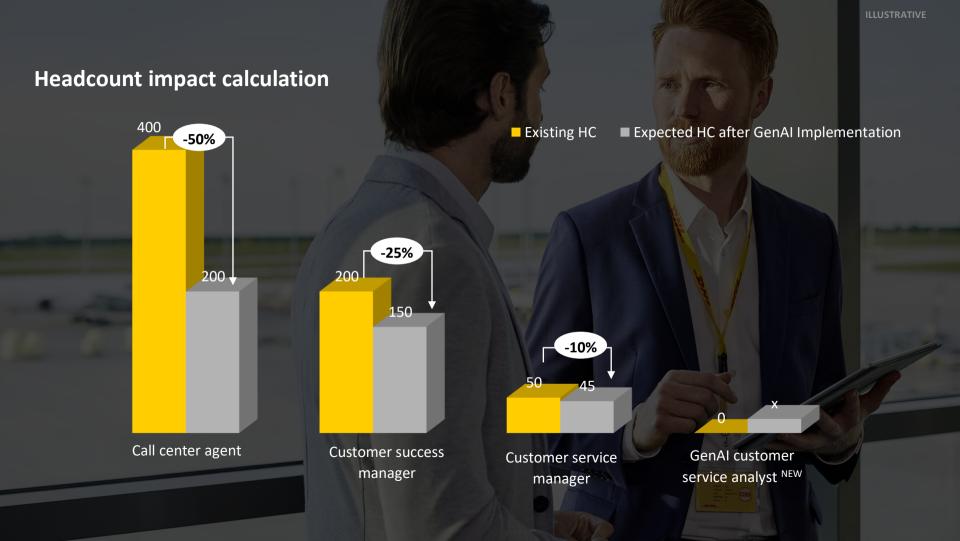
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To select a suitable path for each employee, it is necessary to understand their current skills, as well as their own ambitions, interests and motivation

### **UNDERSTAND**

- Current skillset
- Ambitions, interests, motivation



### CLASSIFY

- Stay in role but upskill for new requirements
- Reskill to existing or new role (possibly outside of customer service)
- Transition to external market

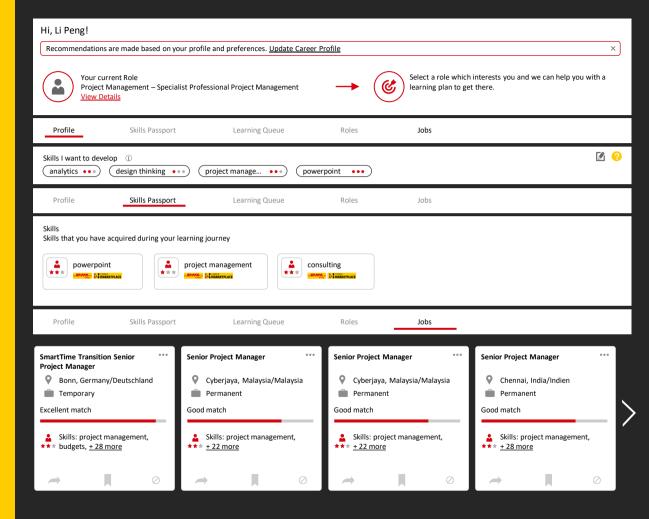
### **Development Opportunities for a Call Center Agent**

Q

Call Center Agent

Score	Top Scored next career proposals
53510	Top otto at next career proposals
100%	Experienced Professional Contact Center
82%	Experienced Professional Customer Services
82%	Entry Professional Customer Services
78%	Entry Professional Shipping Documentation
78%	Experienced Professional Shipping Documentation
76%	Entry Professional Tele Sales
76%	Experienced Professional Tele Sales
73%	Entry Professional Sales
73%	Experienced Professional Sales
70%	Experienced Professional Payroll
70%	Entry Professional Payroll
69%	Experienced Professional Business Strategy & Planning
69%	Entry Professional Business Strategy & Planning
67%	Entry Professional Customer/Account Management
67%	Experienced Professional Customer/Account Management
66%	Experienced Professional Sales Planning & Effectiveness
66%	Entry Professional Sales Planning & Effectiveness
66%	Entry Professional Sales Administration/Sales Support
66%	Experienced Professional Sales Administration/Sales Support
65%	Experienced Professional Claims Management
65%	Entry Professional Claims Management
64%	Entry Professional Commercial/Pricing
64%	Experienced Professional Commercial/Pricing
64%	Entry Professional Billing

It requires an overview of actual employee skills and interests



### **MODEL BENEFITS**

- Helps make an informed decision on hiring freeze or restructuring needs
- Gives a first indication of suitable up- and reskilling options

### LIMITATIONS

- It is only viable for companies with transparent standardized job structure & holistic view of underlying tasks and skills
- It cannot account for unobservable factors (e.g., willingness to learn)

### **OTHER RISKS**

- Even if results are correct, implementation may pose challenges:
  - What if employees do not want to up- or reskill?
  - What if there are no roles where they can be reskilled? ...



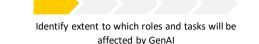
### **Key takeaways**

- GenAl is coming and it will disrupt the workforce
- A structured approach is needed to make proactive informed decisions
- Having your organizational data in order and knowing your employees will be paramount





### **BACKUP**



## The ML model can be used to identify GenAI-affected roles across the entire job catalogue on an individual task level

#### Model overview

- For each job role, the model will calculate a score indicating the likelihood of the role to be "replaced" by GenAl based on individual job tasks
- Higher score indicates larger likelihood of role getting fully automated

### How will the model work? (Current hypothesis)



- List of tasks for all roles in the job catalogue
- Separate collection of tasks that can be partially/ completely done by GenAI



 Model<sup>1)</sup> will calculate the score (between 0-1) for each task depending on how close its meaning is to the collection of GenAl tasks



• Overall score (between 0-1) will be calculated for each job role based on **combination of individual task scores** 



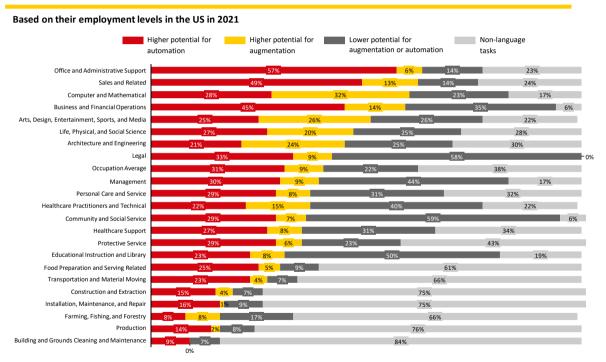
Output

- Score for each job role indicating extent of GenAl impact
- Aggregate view to examine GenAl impact on entire legal entity
- Dynamic impact on job roles as GenAI capabilities and use cases evolve over time

Output mockup on next page

### Methodology of assessing GenAI impact by disaggregating jobs into individual tasks has also been followed in external research studies<sup>1)</sup>

Work time distribution by major occupation and potential AI impact<sup>2)</sup>



- Approx. 200 tasks related to language were identified These tasks were linked to various job categories (accounting for share in each occupation and employment levels)
- Tasks with "Higher potential for automation" can be done by LLMs with minimal human involvement
- Tasks with "Higher/lower potential for augmentation" can be done by LLMs with substantial/partial human involvement respectively
- "Non-language tasks" cannot be done by LLMs

### Based on GenAI impact score, model can calculate change in headcount (HC) for all roles

#### Model overview

- For each job role, the model will calculate estimated HC change based on:
  - GenAl impact score of the role and its individual tasks
  - % of time spent on each task of the role
- Higher GenAl impact score and % of time spent on the task will lead to a larger HC reduction
- Based on expected HC change, managers can determine in which roles to continue/stop hiring

### How will the model work? (Current hypothesis)



Input

- Existing FTE HC for all roles in legal entity
- GenAl impact score for all roles and individual tasks
- Breakdown of approx. time spent (%) on various tasks in each role



 Using GenAI impact score, model will estimate the reduction in time needed to do particular tasks



**New HC will be determined** based on this reduction, the existing HC and % of time spent on various tasks

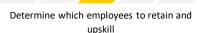


Expected HC change for each job role



- Aggregate view to examine total HC change across the legal entity
- Dynamic impact on HC as GenAI capabilities and use cases evolve over time

Output mockup on next page



### Employees to be retained and upskilled can be identified via a combination of model output and managerial judgment

#### Model overview

- Retained employees need to be upskilled to meet augmented role requirements
- Model provides upskilling score indicating ease of learning specific skills based on the employee's current skillset
- Managers need to combine model output with self-judgment to select which employees should be retained

### How will the model work? (Current hypothesis)



Input

- List of new skills that need to be learned across all roles in job catalogue
- Current employee skillset (e.g., from Career Marketplace)



**Analysis** 

- Language model<sup>1)</sup> analyses the similarity between target skill(s) to be learned and current skills of all employees
- Each employee is assigned a score (between 0-1) based on the **level of**similarity between current and target skills



Output

- **Ease of upskilling score** for all employees (Higher score indicates higher likelihood to retain)
- List of adjacent skills between target skill and job catalogue

### Predictive analytics model can be used to estimate headcount change due to natural workforce attrition

#### Model overview

- For each role, the model will estimate the reduction in FTEs based on those:
  - Leaving the DHL Group voluntarily to join other companies
  - Close to mandatory retirement age
- Future hiring plans for all roles should be determined using the model output in combination with current HC and business requirements for augmented roles

### How will the model work? (Current hypothesis)



- Employee information Age, YoE, tenure in DHL Group, compensation, etc.
- Historical employee attrition rates for all roles
- Average and mandatory (if applicable) retirement age in entity



**Analysis** 

• Model can predict # FTEs likely to leave voluntarily based on past attrition rate and employee information

Can estimate **# FTEs expected to retire** (based on legal regulations and historical retirement age)



- Natural workforce attrition across all roles # FTEs expected to retire or leave voluntarily
- Possibility of identifying and addressing roles/departments with higherthan-expected attrition

### ML model can recommend suitable job roles considering the employee's skillset and skillset required for the role

#### Model overview

- The model recommends a list of job roles to which the candidate can be reskilled based on their skillset and the skillset required by the role
- Each option is assigned a role adjacency score (between 0-1) indicating similarity in skills required for both roles
- High adjacency score signifies ease of reskilling for that role

#### How will the model work?1)



• List of skills and job codes for all roles in job catalogue

#### Input

 Language model calculates skill adjacency score for all skills in job catalogue



Role adjacency score (between current and target role) is calculated as a function of skill adjacency score (considering relative importance of different skills in a role)<sup>2)</sup>



- Jobs across the whole catalogue are searched and ranked as reskilling alternatives (accounting for seniority level)<sup>3)</sup>
- Algorithm determines overlapping skills as well as possible adjacencies between non-overlapping skills



- List of alternative roles to reskill into for all input roles
- List of overlapping and adjacent skills between current and recommended role

Output example on next page

Source: 1) Similar types of models have been developed externally: a) LinkedIn Career Explorer, b) TalentNeuron (Gartner); 2) Skills are categorized into generic, core & unique core depending on whether they are commonly found across multiple functions, within a specific function & job family respectively. In role adjacency score calculation, overlapping skills are given different weights (unique core>core>core>generic); 3) Model only recommends roles at current or one level above current seniority level; 4) ML = Machine Learning

### ML model output example: "Entry Professional Contact Center" role in DHL

```
Job code 130.131.248
position name: Entry Professional Contact Center
Top scored next career step proposals:
Score 1.00 -- 130.131.238 Experienced Professional Contact Center
Score 0.82 -- 130.133.238 Experienced Professional Customer Services
Score 0.82 -- 130.133.248 Entry Professional Customer Services
Score 0.78 -- 300.321.248 Entry Professional Shipping Documentation
Score 0.78 -- 300.321.238 Experienced Professional Shipping Documentation
Score 0.76 -- 500.503.248 Entry Professional Tele Sales
Score 0.76 -- 500.503.238 Experienced Professional Tele Sales
Score 0.73 -- 500.500.248 Entry Professional Sales
Score 0.73 -- 500.500.238 Experienced Professional Sales
Score 0.70 -- 700.710.238 Experienced Professional Payroll
Score 0.70 -- 700.710.248 Entry Professional Payroll
Score 0.69 -- 100.103.238 Experienced Professional Business Strategy & Planning
Score 0.69 -- 100.103.248 Entry Professional Business Strategy & Planning
Score 0.67 -- 500.514.248 Entry Professional Customer/Account Management
Score 0.67 -- 500.514.238 Experienced Professional Customer/Account Management
Score 0.66 -- 500.509.238 Experienced Professional Sales Planning & Effectiveness
Score 0.66 -- 500.509.248 Entry Professional Sales Planning & Effectiveness
Score 0.66 -- 500.510.248 Entry Professional Sales Administration/Sales Support
Score 0.66 -- 500.510.238 Experienced Professional Sales Administration/Sales Support
Score 0.65 -- 150.151.238 Experienced Professional Claims Management
Score 0.65 -- 150.151.248 Entry Professional Claims Management
Score 0.64 -- 500.505.248 Entry Professional Commercial/Pricing
Score 0.64 -- 500.505.238 Experienced Professional Commercial/Pricing
Score 0.64 -- 200.215.248 Entry Professional Billing
```

#### Overview

- Input role is a junior-level position in the "Contact Center" job family within the "Customer Services" function
- ML model recommends a list of reskilling options ranked from highest to lowest role adjacency score (from the same job family and outside of it)
- Managers need to identify which of the suggested options are available in their legal entity and open to hire
- When comparing reskilling options with similar role adjacency scores, need to exercise subjective judgment to determine ideal solution
  - E.g., take employee preferences or non-measurable factors (motivation, commitment to learn new skills, personal interests, etc.) into account

# When reskilling within the legal entity is not possible, various alternatives can be explored

- Can employees be transferred to other DHL legal entities in the same geography?
- Can employees be transferred to the external labor market? (E.g., partnership with other companies/labor organizations)
- Can employees be released with severance/early retirement (considering legal regulations, worker unions, etc.)?



Redundant employee costs need to be accounted in BCA for GenAl use cases in a legal entity



### ML model provides the first indication of changes, but additional topics also need to be considered to make key workforce decisions

#### What information does the ML model provide?

- Identification of critical tasks and roles that will be heavily affected by GenAI
- Estimate of required HC in each role after GenAl implementation
- Skill adjacency score for all employees indicating ease of upskilling and likelihood of retention for augmented roles
- Expected natural workforce attrition rate across all roles
- List of suitable reskilling options within the legal entity for redundant employees based on their current skillset

#### Which additional topics need to be considered?

- When deciding whom to retain/selecting reskilling options for redundant employees, account for subjective factors based on the manager's observations such as:
  - Personal drive and willingness to learn new skills
  - Career development goals/areas of interests
  - Commitment to contributing to the DHL Group
- In order to achieve the above, some pre-requisites need to be met like:
  - Enable mindset change to pay increased attention to personal development of employees
  - Encourage managers to be aware of employee skills beyond their role (via career development talks, regular CMP profile updates, etc.)

Source: 1) Model to determine skill adjacency score was trained on Google News dataset (approx. 100B words) which is a commonly used dataset for training language models; 2) ML = Machine Learning, HC = Headcount, CMP = Career Marketplace