

The European classification of Skills, Competences, and Occupations (ESCO): news, use cases & AI applications

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Session 3 – Module 2: Big data analysis for labour market intelligence online training
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slido



How familiar are you with ESCO?

slido



What type of skills are included in ESCO?

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To what extent taxonomies like ESCO contribute to the analysis of labour market data?

A common language for a better functioning labour market



IT systems of employment services do not understand each other



 Employers do not always understand what diplomas mean in practice



 Education & training has difficulty to align on skills required by employers



Policy-makers & academia do not have a complete picture of labour market imbalances



Occupational & skills ontologies as standard common language

Need for interoperability and exchange of information using common standards



 Need to express learning outcomes of qualifications into skills/knowledge



Need for evidence-based curricula updates



 Need for real-time labour market & skills intelligence





The European Classification of Skills, Competences and Occupations

ESCO works as a dictionary, describing, identifying and classifying professional occupations, skills, and competences relevant for the EU labour market and education and training.



Free of charge

Machine readable

28 Languages



Target audience

Public, private employment services & job portals

HR departments of companies

Software providers & IT companies

ESCO EU & international organisations **Policy- makers Education institutions**

Researchers & statisticians

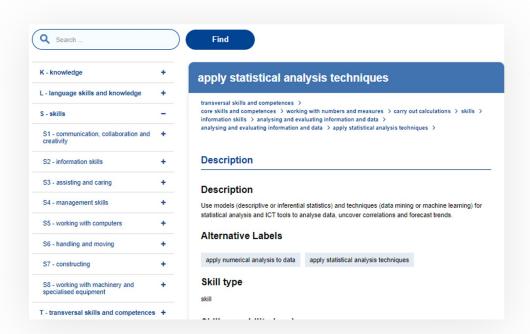


Structure of ESCO

Q economist		Find	
Hierarchy vi	ew ≒	economist	Discuss in the forum
0 - Armed forces occupations	+		Download
1 - Managers	+	Professionals > Legal, social and cultural professionals > Social and religious professionals economist >	> Economists >
2 - Professionals	+		
3 - Technicians and associate professionals	+	Description	
4 - Clerical support workers	+	Code	
5 - Service and sales workers	+	2631.2	
6 - Skilled agricultural, forestry and fishery workers	+	Description	
7 - Craft and related trades workers	+	Economists perform research and develop theories in the field of economic microeconomic or macroeconomic analysis. They study trends, analyse st- extent work with economic mathematical models in order to advise compar	atistical data, and to some nies, governments, and
8 - Plant and machine operators and assemblers	+	related institutions. They advise on product feasibility, trend forecasts, eme and consumer trends.	rging markets, tax policies,
9 - Elementary occupations	+	Alternative Labels	

OCCUPATIONS PILLAR

3008 Occupations



SKILLS PILLAR

13890 Skills/Competences



ESCO portal showcase



https://esco.ec.europa.eu/en



ESCO v1.1 (launched Febr.2022)









Green skills

Digital skills

Researchers skills

New model for transversal skills

Application of AI to manage the classification



Transversal skills & skills hierarchy

Transversal skills are not directly linked to Occupations, as they are relevant across-sectors and occupations

T - transversal skills and competences -

K - knowledge	+
L - language skills and knowledge	+
S - skills	+ /
T - transversal skills and competences	+

1 - transversal skills and competences	
T1 - core skills and competences	+
T2 - thinking skills and competences	+
T3 - self-management skills and competences	+
T4 - social and communication skills and competences	+
T5 - physical and manual skills and competences	+
T6 - life skills and competences	+



Digital & green skills for the twin transition

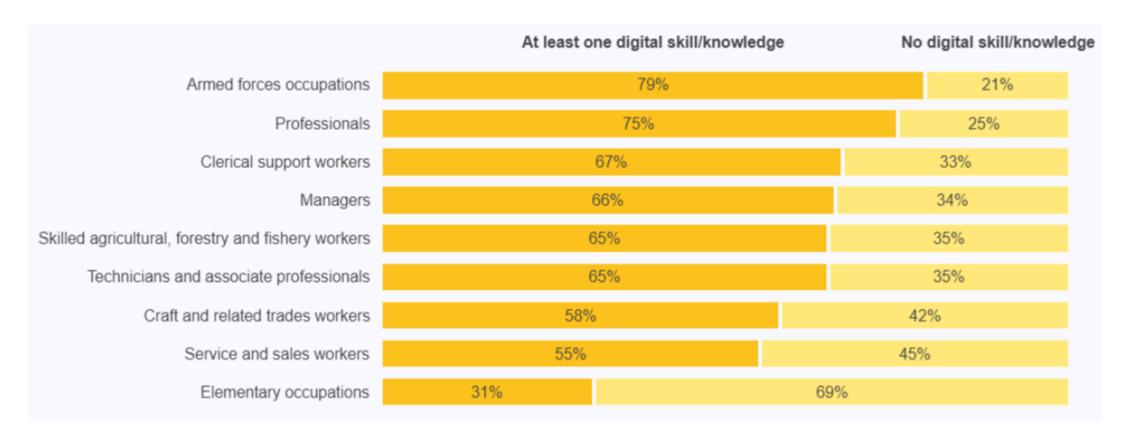
The green transition involves: technical (occupationally specific skills) and generic skills (soft skills).

ESCO labels the green and digital skills to highlight them out of the ~14.000 exiting skills

 measure sustainability of tourism 	digital skills & knowledge labels
·	concepts
 emission standards ass 	nage IT security compliances ess integrated domotics systems iver online training istive technology in education iduct web searches



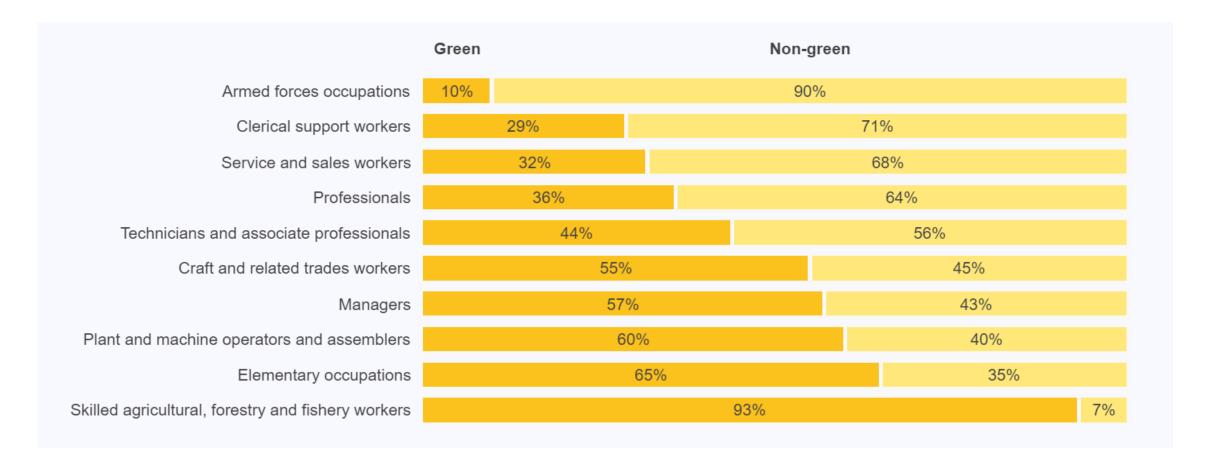
Skills composition of Occupations



Share of digital skills per ISCO level 1



Skills composition of Occupations





Skills composition of Occupations

Q wind turbine

Find

Hierarchy view ≒

- 23% green skills
- 18% digital skills

Search result

3131.2 - onshore wind farm technician

3119.11 - offshore renewable energy technician

2149.9.5 - offshore renewable energy engineer

2149.9.6 - onshore wind energy engineer

2149.9.7 - renewable energy engineer

8151.4 - winding machine operator

8142.6 - filament winding operator

8142.8 - insulating tube winder

7232.3 - aircraft gas turbine engine overhaul technician

3131.3.9 - steam turbine operator

7312.7 - wind musical instrument maker

7115.6 - window installer

3131.1 - offshore renewable energy plant operator

3131.3.3 - fossil-fuel power plant operator

offshore renewable energy technician

Discuss in the forum

Download

Technicians and associate professionals >

Science and engineering associate professionals > Physical and engineering science technicians > Physical and engineering science technicians not elsewhere classified >

offshore renewable energy technician >

Description

Code

3119.11

Description

Offshore renewable energy technicians install offshore energy farms and equipment. They ensure the equipment operate in compliance with regulations and assist the offshore renewable energy engineers in the construction of energy devices such as wind turbine blades, tidal stream and wave generators. They also react to system problems, and repair faults.

Alternative Labels

offshore renewable energy installer

marine renewable energy installer

ORE technician

offshore wind turbine technician

MRE installer

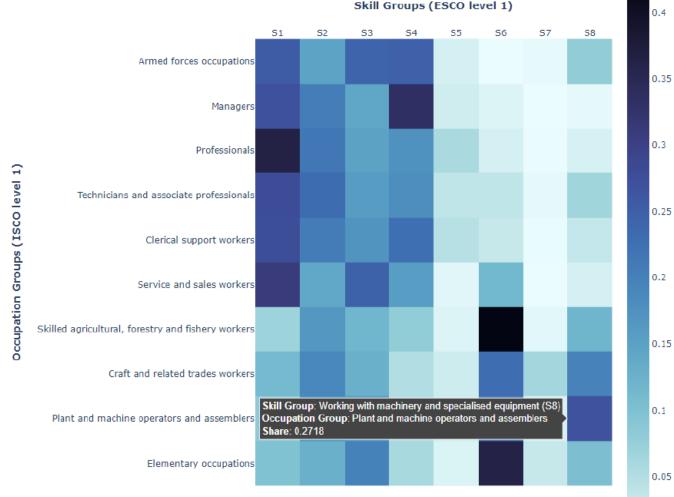


Occupations-Skills matrix

Connect ISCO-08 occupation groups (rather than one single occupation) to ESCO skills hierarchical groups (rather than one single skill)

Skills groups collect skills that are sectorindependent and differ in terms of

- tools and equipment used
- type of object on which the work is performed, and
- the function or outcome of the task or activity.



Dataset available on our portal



ESCO's use cases

Job-matching &searching

Compare vacancies and CVs and suggest best matches

Big data analysis of labour market

Detect demand of skills and occupations from online job advertisements

Curricula reform

Based on LM evidence, adapt the learning outcomes of qualifications and training provided

Validation of informal/nonformal learning

Identify, assess and certify knowledge & skills acquired outside of formal learning

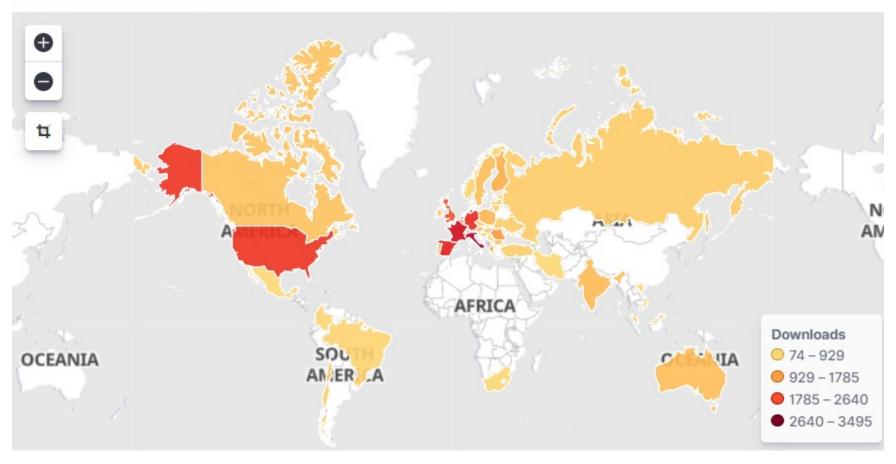
Graduate tracking

Assess skills mismatches over time



ESCO's usage

ESCO portal downloads per country

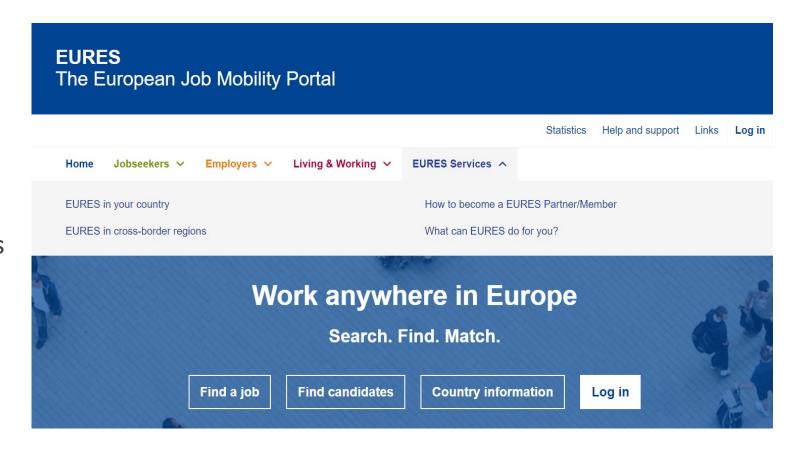






ESCO's implementers- EURES

- Exchange labour market information across the EU according to the EURES Regulation
- Facilitate the design of job vacancies and job profiles in different languages
- One of the components for improved skillsbased job matching results



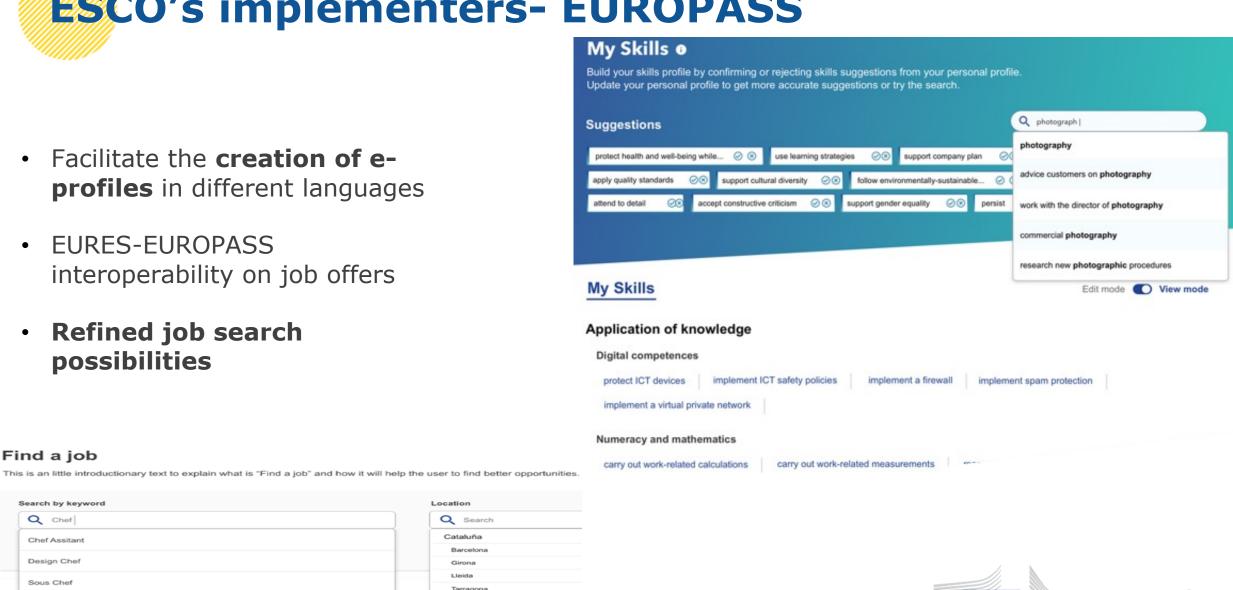


ESCO's implementers- EUROPASS

- Facilitate the creation of e**profiles** in different languages
- **EURES-EUROPASS** interoperability on job offers
- Refined job search possibilities

Find a job

Search by keyword Location Q Chef Q Search Cataluña Chef Assitant Barcelona Design Chef Sous Chef Tarragona Head Chef



European

Commission

ESCO's implementers- big data analysis

- Nine EU public employment services intend to use or already use ESCO for big data analysis.
- Other international stakeholders use ESCO for this type of analysis

National Platform for Advanced Analytics of Labour Market's Mechanics and Dynamics, Croatia





Data61 Australian Skills Dashboard (Beta)

This Dashboard uses data kindly provided by Adzuna Australia

Demand for skills in the Australian labour market.

Data61 is Australia's leading digital research network, we're here to help you create your data-driven future.



How ESCO facilitates big data analysis







Rich source of metadata

ESCO contains descriptions, alternative labels and relations between concepts

Following trends & terminology in the labour market

Multilingual & Language independent

Machines can interpret its concepts based on semantic similarity & build LM language models

~4000 publications on Google scholar using ESCO

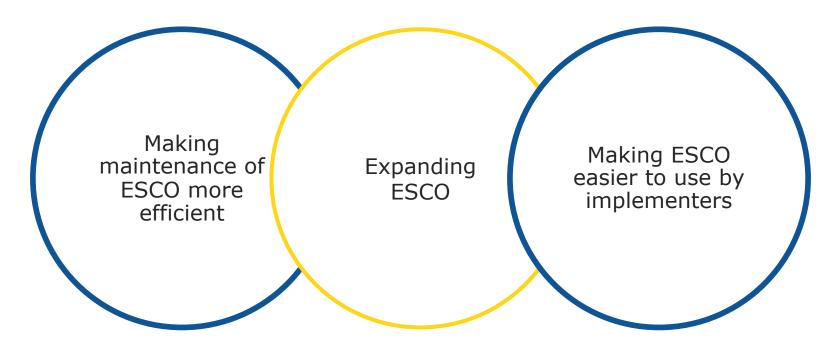
Supports interoperability

Existing mappings to other taxonomies (ISCO, ISCED-F, O*NET, NACE, national EU taxonomies)



Use of artificial intelligence in ESCO

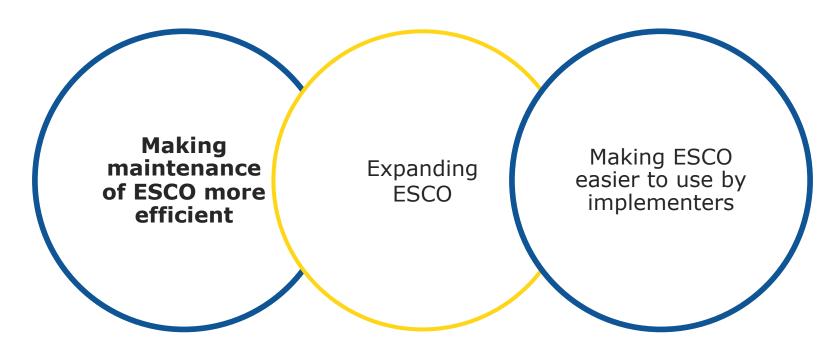
Use an analytical approach based on <u>statistical analysis</u>, <u>data science</u> and <u>machine learning</u> to assist in:





Use of artificial intelligence in ESCO

Use an analytical approach based on <u>statistical analysis</u>, <u>data science</u> and <u>machine learning</u> to assist in:





Goal: avoid skills with identical meaning in ESCO

Methodology: machine learning (ML) model to detect duplicate skills in the classification

- 1. Input: single ESCO skill
- 2. Output: ranked ESCO skills based on the semantic similarity score
- 3. Filter the highest scores and manually validate the result: one person validates, another person reviews. Further discussion and a third validator in case of disagreement.
- 4. Remove duplicates and consider the output skill as obsolete

Input Preferred Term	Input Description	ML Score	Output Preferred Term	Output Description
Accept criticism and guidance	guidance from others and react openly criti		Accept constructive criticism	React to valid and well-reasoned opinions about one's work in a positive manner.
	to criticism, trying to identify in it potential areas for improvement.	0,92	Demonstrate enthusiasm	Display great effort driven by an interest or enjoyment in work itself, in the absence of external pressures.
		0,92	Demonstrate consideration	Act in an understanding and supportive manner that is sensitive to others' needs and feelings.



Identify relations between skills and occupations

Goal: avoid orphan ESCO skills, i.e. skills not linked to any ESCO occupation

Methodology: analyse relation between ESCO skills and occupations in online vacancies, support by ML model

- 1. Dataset with relations between skills and occupations from the EURES platform (i.e. ESCO skills and ESCO occupation within the same job vacancy)
- 2. Set orphan skill as input and rank occupations based on their frequency in the EURES vacancies & semantic similarity score
- 3. Filter the highest frequencies and scores and manually validate the result: one person validates, one person reviews. Further discussion and a third validator in case of disagreement. Take in consideration other skills linked to the suggested occupations.
- 4. Link the orphan skill to the occupation

Input Preferred Term	Input Description	ML Score	Output Preferred Term	Frequency (#vacancies)
Implement a firewall	Download, install and update a network security system designed to prevent unauthorized access to a private network.	0,78	ICT network administrator	297
		0,73	ICT network architect	267
		0.61	Radio technician	1



Goal: link new transversal skills to non-transversal skills

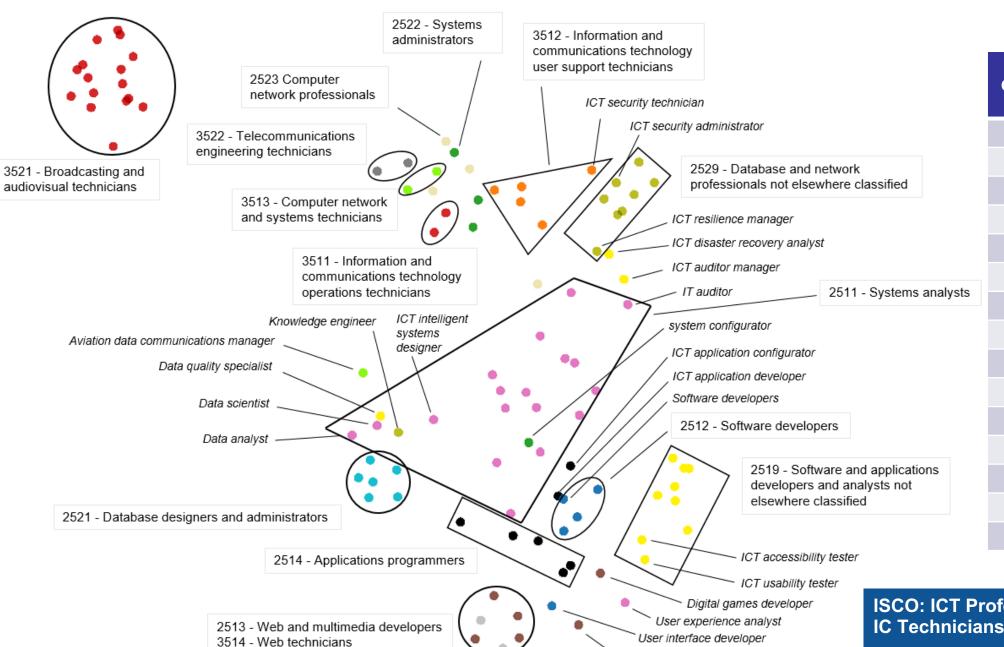
Methodology: analyse existing relations between ESCO skills and use ML model to detect appropriate matches with non-transversal skills

- 1. Build a ML model trained on existing relationships between ESCO skills
- 2. Set one new transversal skill as input, rank non-transversal skills based on the ML results and additional set of rules (e.g. existing relationships with other skills, etc.)
- 3. Filter the highest scores and manually validate the result: one person validates, one person reviews. Further discussion and a third validator in case of disagreement.
- 4. Link the transversal skills to non-transversal skills

Input Preferred Term	Input Description	ML Score	Output Preferred Term	Output Description
Participate actively in civic life	Actively engage in activities for the common or public interest such as civic, community or neighbourhood initiatives, volunteering opportunities and non-governmental organisations.	0,99	Raise awareness on local community's priorities	Intervene and implement programs or activities that raise awareness of issues relevant for the respective local community, such as social or economic inequality, gender issues, violence, and drug abuse.
		0,98	Promote inclusion in organisations	Promote diversity and equal treatment of genders, ethnicities and minority groups in organisations in order to prevent discrimination and ensure inclusion and a positive environment.
		0,98	Perform street interventions in social work	Conduct outreach activities by providing direct information or counselling services to individuals in their neighbourhood or in the streets, usually targeted at youth or homeless people.



Improve the allocation of ESCO occupations in the hierarchy



User interface designer

2511 0.158 0.072 2512 0.043 0.159 2513 0.124 0.106	r e
2513 0.124 0.106	
2514 0.114 0.110	
2519 0.120 0.122	
2521 0.025 0.199	
2522 0.068 0.152	
2523 0.081 0.153	
2529 0.101 0.150	
3511 0.016 0.216	
3512 0.122 0.117	
3513 0.138 0.101	
3514 0.019 0.194	
3521 0.116 0.213	
3522 0.032 0.215	

ISCO: ICT Professionals/ IC Technicians Space

Identify potential NPTs for occupations

Goal:

Extract NPT candidates from labour market data

Methodology:

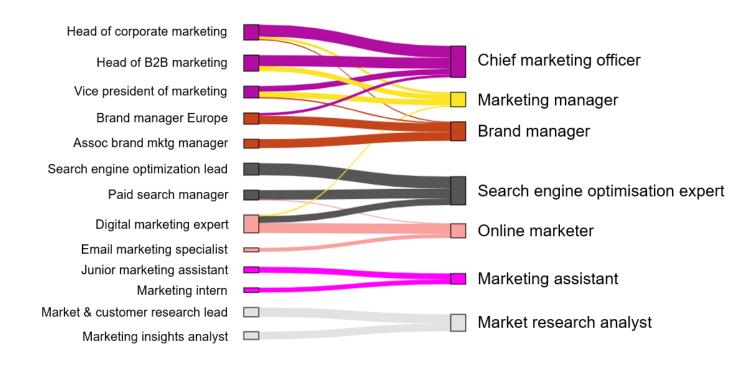
Model to compare <u>multilingual</u> data from ESCO and external sources

Data:

- ESCO, QDR qualifications, EURES online job advertisements
- 35 million data points
- 28 ESCO languages

Approach:

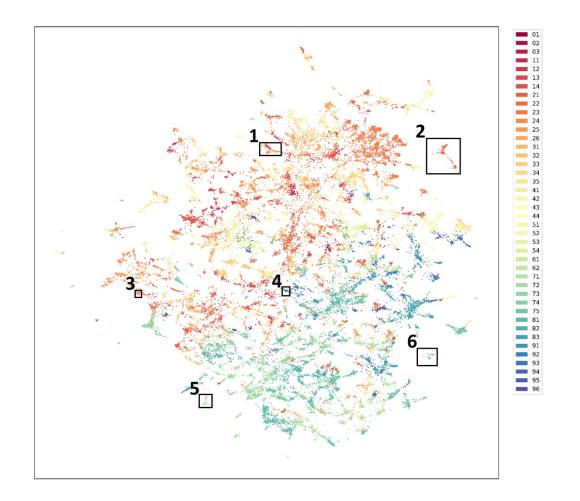
- Finetune XLM-RoBERTa language model
- Align embedding space across 28 ESCO languages
- Compare text and ESCO concepts in embedding space





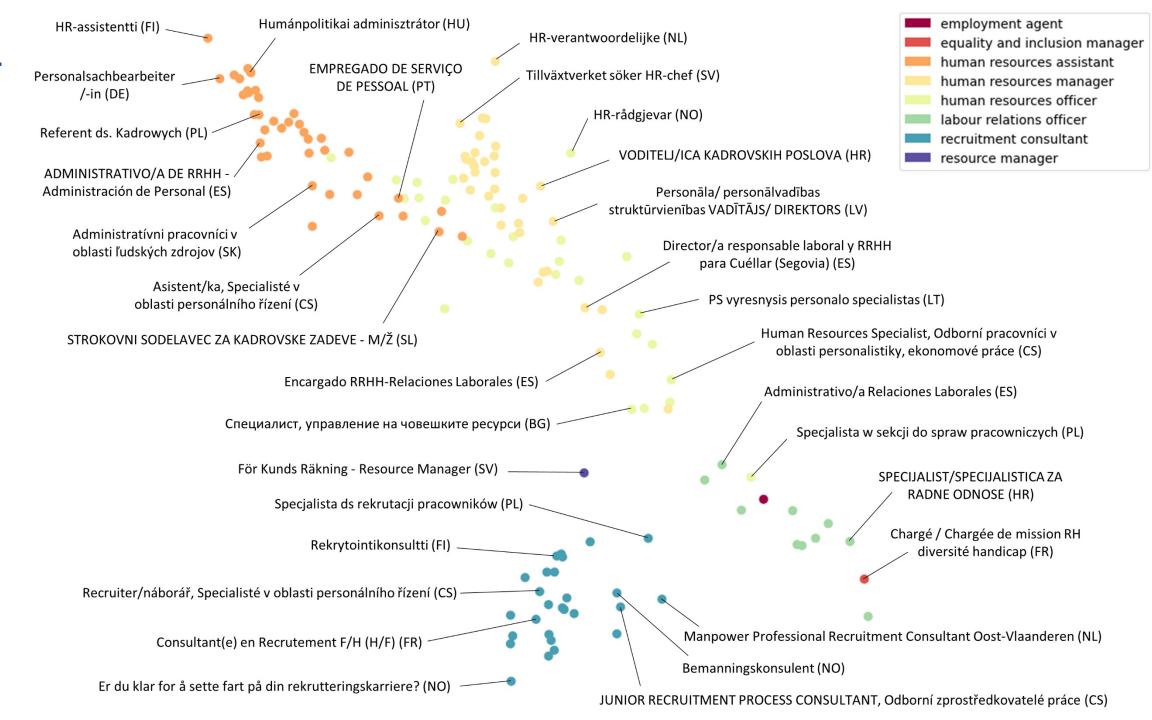
Identify potential NPTs for occupations

Multilingual embedding space with 35K unique job titles from online job advertisements:

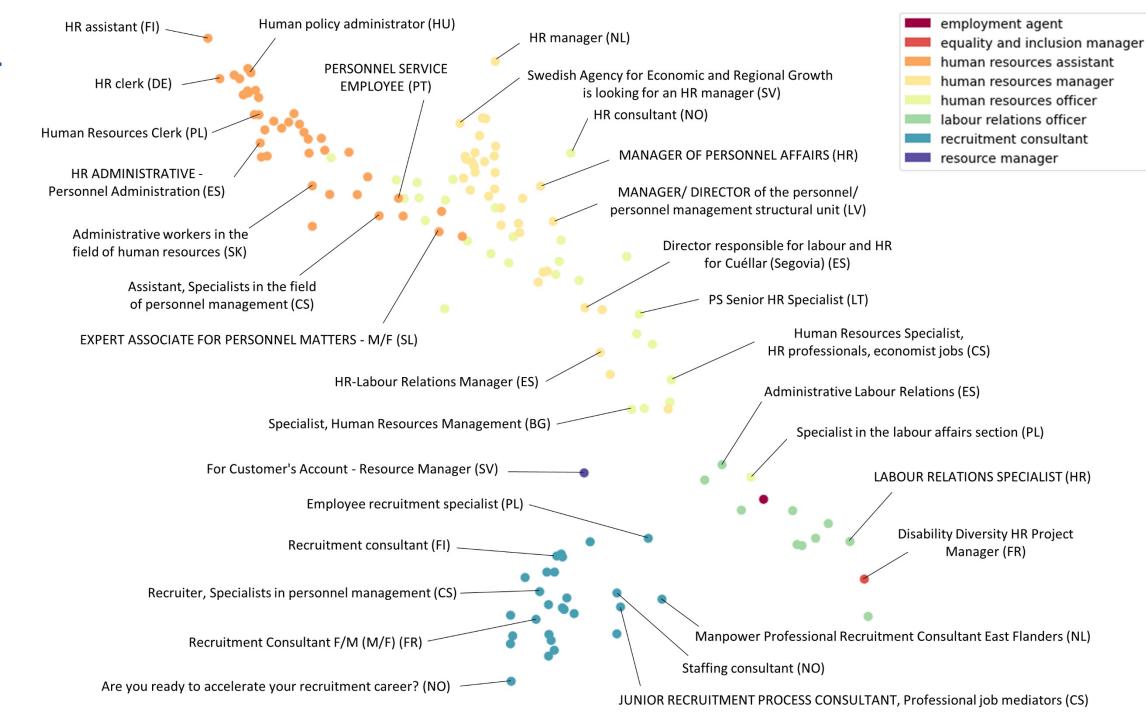




Area 1



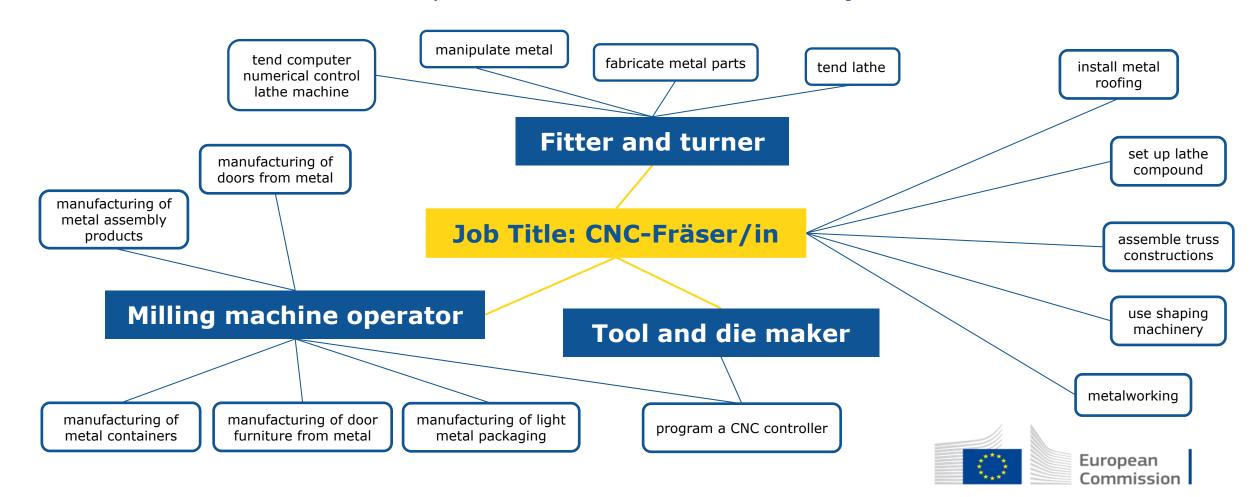
Area 1





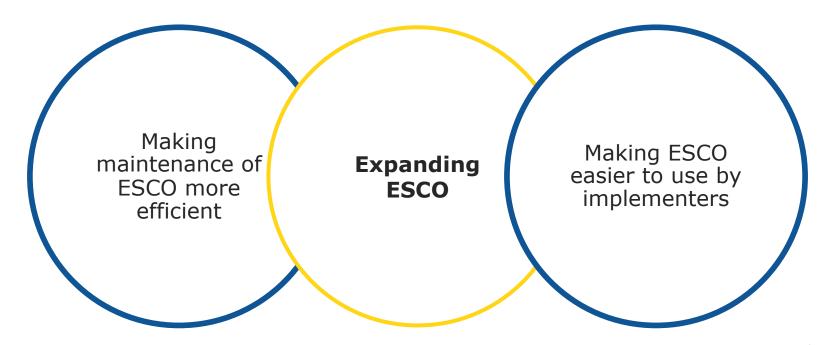
We are a medium-sized metal construction company and manufacture individual items, prototypes, tools and devices. In July 2021 we will move into new company premises (easily accessible by public transport) and continue to expand our offer for our customers. To do this, we definitely need reinforcement in the team now. We are looking for you as a <u>CNC milling cutter</u>. Your task is to manufacture individual pieces, prototypes, tools and devices using CNC milling. The operation and programming of our Heidenhain or Siemens controlled machines is the focus of your independent, responsible work. The prerequisite is a completed vocational training in the machining sector or as a tool mechanic and thus initial basic experience in programming CNC machines. We are also happy to give career starters a chance. Basic knowledge: metal construction, metalworking, turning. Advanced knowledge: CNC knowledge, CNC programming, milling

Feedback on ESCO on a European scale from millions of online job advertisements



Use of artificial intelligence in ESCO

Use an analytical approach based on <u>statistical analysis</u>, <u>data science</u> and <u>machine learning</u> to assist in:





Identify alternative terms for new occupations

Methodology: collect job titles from online vacancies and use ML model to detect similarities with ESCO occupations

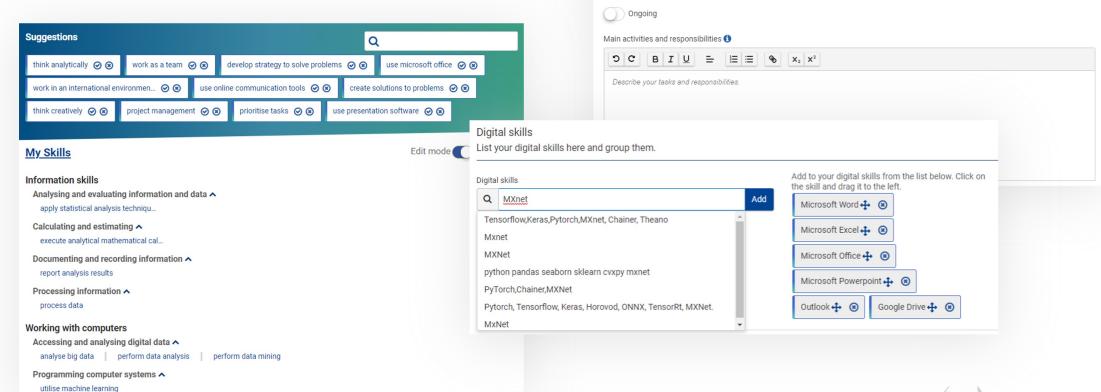
- 1. Dataset of job titles from the EURES platform
- 2. Set new occupation as input and rank EURES job titles based on semantic similarity score
- 3. Filter EURES job titles already suggested by experts
- 4. Filter the highest scores and manually validate the result: one person validates, one person reviews. Further discussion and a third validator in case of disagreement.
- 5. Include the job titles as alternative labels for the new ESCO occupation

Input Preferred Term	Input Description	ML Score	Output Preferred Term	Suggested by experts?
Mobility services	Mobility services managers are responsible for the strategic development and implementation of programs	0,95	Mobility manager	YES
manager	ager that promote sustainable and interconnected mobility options, reduce mobility costs and meet the transportation needs of customers, employees and the community as a		Mobility program coordinator	NO
	whole such as bike sharing, e-scooter sharing, carsharing and ride hailing and parking management. []	0,81	Campus mobility planning manager	NO





Feedback on ESCO on a European scale from millions of 'experts'



Work experience 1

New work experience

Occupation or position held

1

Data

Data scientist

Data analyst

Data centre operator

Data entry supervisor

Data entry clerk

Data warehouse designer

Data quality specialist

Describe all your work experiences. You can include paid work, volunteering, internships, apprenticeships, freelancing and other



 \circ

Erfaret Cafébiträde till långhelger fred-lörd-sönd-mån (SV)

Om jobbet Vi söker en person som kan jobba fredag-lördag-söndag-måndag 9-17. Caféet är öppet från morgon till kväll. Vi serverar frukost, lunch och lika. Vi lagar nästan allt från grunden. Vi söker dig som tycker att det är kul och givande att prestera på toppen av din förmåga och samtidigt känner uppskattning för att servera mat och dryck när den är som bäst. För att kunna bidra i detta lagarbete krävs att du ställer mycket höga krav på dig själv i din yrkesroll. Vett, etikett, genuint intresse för service, hög stresströskel och god ton är egenskaper som vi vill ska spegla din personlighet. Du skall vara glad, positiv och serviceminded samt obehindrat kunna uttrycka dig i tal och skrift. Dina arbetsuppgifter innefattar: Enklare matlagning Barista Servering Beställning Kassa Vi söker endast personer med vana av café/restaurang. Möjlighet till arrende/delägarskap finns för den drivne vid goda resultat. Välkommen!

ES.OJA

Ayudante de barra

Buscamos a un ayudante de barra, para trabajar en restaurante en pleno centro de la ciudad se barcelona, tendra que servir y preparar las bebidas, limpiar y secar copas. Buscamos a una persona amable, educada, con ganas de trabajar. Se ofrece: Trabajo a prueba y luego indefinido para barra horario 12:30 a 15:30 y de 19:00 a 00:00h Domingos siempre fiesta. Para acceder al detalle de la oferta haga

NO.OJA

Barista til xxx - Sommerjobb 2022

Om stillingene: I sommer ønsker vi å ansette en person som barista hos oss på xxx. I første omgang ser vi etter en medarbeider for sommeren 2022 med oppstart juni, og med gode muligheter for fortsettelse til høsten. Stort sett vil man jobbe alene. men i begynnelsen og når det trengs kan vi være flere til stede. Vi er flere i kollektivet som er innom og tar i et tak. Arbeidstid er fleksibel men hovedsakelig minst 4 timer i ukedagene. Hva består jobben av: Vanlig daglig drift av g, oppvask, og kundeservice. Du liker å prate med gjester og bidrar med å skape god stemning. Hovesakelig vil oppgavene bestå i å lage , daglige rengjøringsrutiner, og styre instagramkontoen for å publisere åpningstider og legge ut fine kaffebilder! Vi ser etter: Personene vi søker bør ha ordenssans og være opptatt av renhold og god hygiene. Du må beherske et nordisk språk, i tillegg til engelsk. Personlig egnethet vil bli vektlagt. Vi oppfordrer spesielt lokal ungdom til å søke på stillingen. Hva kan vi tilby: * Betalt opplæring. * Et godt, trivelig og humørfylt arbeidsmiljø. * Lønn etter tariff. * Den flotteste utsikten! Søknad: * Søknad og CV sendes på e-post til xxx@xxx.com * Ved spørsmål om stillingen kan xxx xxx kontaktes på e-post xxx@xxx.com * Søknadsfrist: Snarest. * Intervju vil skje fortløpende. Om arbeidsgiveren: xxx er en forening som driver en liten kaffebar ytterst i ha

Barista (m/w/d) für das xxx in xxx gesucht

DE.OJA

Stellenangebotsbeschreibung: Stellenbeschreibung Wir sind xxx, ein Café-Deli auf der wunderschönen xxx in xxx. Wir schenken Liebe durch Essen, daher ist bei xxx alles frisch und handgemacht. Genauso bieten wir unseren höchstem Niveau an. Obwohl wir gerade mal seit kurzem eröffnet haben, wird immer wieder unser Kaffee in den Rezensionen gelobt. Darauf sind wir stolz, und wollen das Niveau auch weiterhin halten und ausbauen. Daher suchen wir einen . der/die uns beim Auf- und Ausbau erfahrenen und unserer Erfolgsgeschichte hilft und von Anfang an dabei ist. Mehr Infos & Details zu xxx und Konzept gibt es im persönlichen Gespräch oder schau auch gerne mal auf unserer Homepage www.xxx.de oder auf unseren sozialen Kanälen (Instagram / Facebook / Google) vorbei. Nun zu Deiner Tätigkeit in allen Variationen.... Was wir von Dir erwarten: Du bist nicht nur ein(e) d bist in Deinem Fach ein Vollprofi, bleibst auch in Stresssituationen stets freundlich und gelassen Du hast mehrere Jahre Erfahrung kennst Dich nicht nur mit Siebträgermaschinen aus, sondern bist Wir freuen uns auf Deine aussagekräftigen Bewerbungsunterlagen und auf das persönliche Kennenlernen. Dort werden wir Dir unser Konzept vorstellen und Dir ganz viele Insights geben, sowie all Deine (noch) offenen Fragen klären. Dein xxx Team Ergänzende Informationen: Anforderungen an den Bewerber: Erweiterte Kenntnisse: K Expertenkenntnisse: Getränke zubereiten und anrichten.

Barista bar à chocolat (H/F)

Les missions: Tenue d'un bar à chocolat avec service du café, thé, chocolat, et divers softs Savoir faire le service en salle, service crèpes, glaces et pâtisseries Savoir nettoyer et garder son poste propre selon les règles d'hygiène en vigueur. Soigner son image car elle représente l'entreprise Polyvalence en vente et conditionnement en partie boutique de chocolats Amplitude horaire : 8h à 14h ou 8h à 19h selon les jours, possible travail le dimanche avec majoration de 25%. Planning à définir avec le/la candidat/e

LT.OJA

FR.OJA

Barmenas - padavėjas (-a)

Darbas kavinėje 'xxx', pagrindinės funkcijos: - sutikti, aptarnauti lankytojus salėje ir priimti užsakymą; - rekomenduoti lankytojui gėrimus prie patiekalų; - pateikti maistą ir gėrimus lankytojams; - paaiškinti lankytojui patiekalų ruošimo technologiją; - palaikyti švarą ir tvarką kavinės salėje; - paruošti kavinės patalpas lankytojams aptarnauti: paruošti stalo indus, įrankius, stiklo indus ir stalo aptiesalus. - maloniai, kultūringai aptarnauti lankytojus.

1)

(2)

Extract titles (T) and key phrases (KP)

Erfaret Cafébiträde till långhelger fred-lörd-sönd-mån
Barista til xxx - Sommerjobb 2022
Barista (m/w/d) für das xxx in xxx gesucht
Barista bar à chocolat (H/F)
Barmenas - padavėjas (-a)
Avudante de barra
ES.T

Caféet är öppet SV.KP1
Vi serverar frukost, lunch och fi<u>ka SV.KP2</u>

Enklare matlagning Barista Servering Beställning Kassa SV.KP3

vana av café/restaurang SV.KP4

person som barista hos oss NO.KP1
drift av kafe, bl.a. baristaoppgaver, servering, oppvask, og kundeservice NO.KP2
lage forskjellige kaffedrikker, dælige rengjøringsrutiner NO.KP3

ut fine kaffebilder NO.KP4

en liten kaffebar ytterst i havgapet NO.KP5

Kaffeentusiasme langt til NO.KP6

xxx, ein Café-Deli auf DE.KP1

unseren Gästen Barista-Kaffee auf höchstem DE.KP2

Barista-Kaffee auf nochstem DE.K

wieder unser Kaffee in DE.KP3

und engagierten Barista (m/w/d), der/die DE.KP4

Tätigkeit als Barista: Kaffee, Coffee, Café in allen DE.KP5

ein(e) hervorragende(r) Barista und bist DE.KP6

als Barista und kennst DE.KP7 Sachen Kaffeebohne DE.KP8

Kenntnisse: Kaffeekunst, Kaffee (Röstmischung) DE.KP9

Expertenkenntnisse: Getränke zubereiten und DE.KP10

Tenue d'un bar à chocolat avec service du café, thé, chocolat, et FR.KP1

faire le service en salle, service crêpes, glaces et pâtisseries FR.KP2

partie boutique de chocolats FR.KP3

Darbas kavinėje 'xxx' LT.KP1

- pateikti maistą ir gėrimus lankytojams LT.KP2

ir tvarką kavinės salėje; LT.KP3

paruošti kavinės patalpas lankytojams aptarnauti: paruošti stalo indus LT.KP4
ayudante de barra, para trabajar en restaurante en pleno centro ES.KP1

ciudad se barcelona, tendra que servir y preparar las bebidas, limpiar y secar copas ES.KP2

indefinido para barra horario 12:30 ES.KP3

Titles (T) and key phrases (KP) semantic relatedness DE.KP4 DE.KP5 DE.T DE.KP6

Online job advertisement (OJA) to ESCO occupations NO.OJA FR.OJA Barista Cocktail <u>Bartender</u>

Labelling green ESCO skills and knowledge concepts



STEP 1
Manual labelling



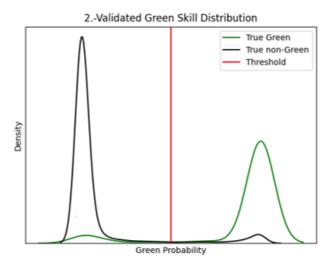
STEP 2
Machine learning classifier



STEP 3
Comparison and manual validation

The knowledge, abilities, values and attitudes needed to live in, develop and support a society which reduces the impact of human activity on the environment (Cedefop, 2012).

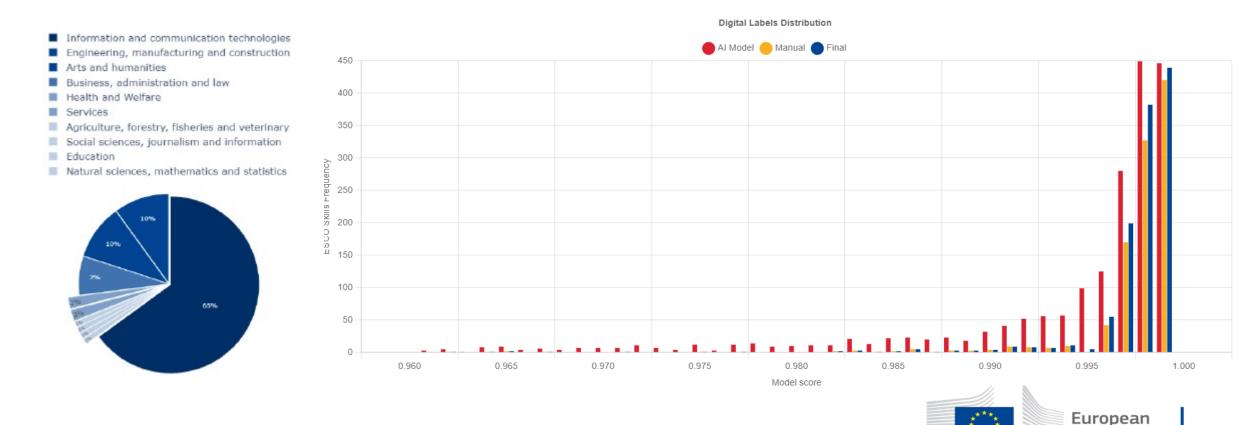
The training data is composed of text that describes activities considered as environmentally sustainable, polluting, or none of the two by official classifications, job vacancies, European or national legislation, and reports.



Labelling digital ESCO skills and knowledge concepts

Goal: create and label the concepts in the Skills Pillar considered digital

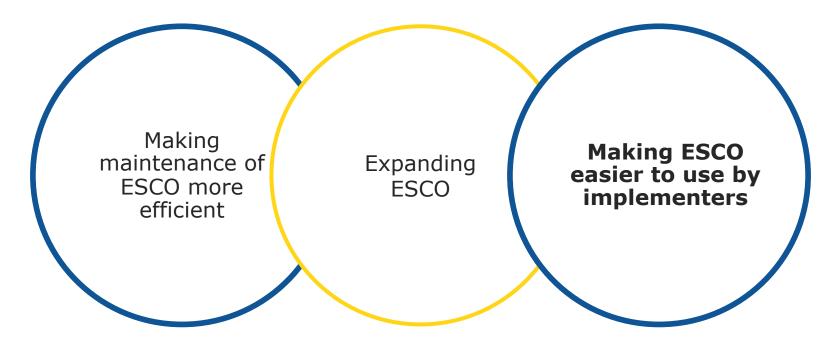
Methodology: manual labelling, ML classifier, human validation



Commission

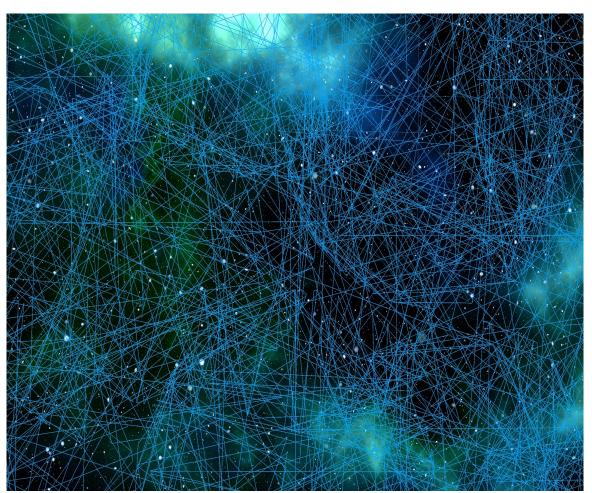
Use of artificial intelligence in ESCO

Use an analytical approach based on <u>statistical analysis</u>, <u>data science</u> and <u>machine learning</u> to assist in:





Increasing interoperability in the labour market



ESCO-O*NET crosswalk

An official mapping that was **jointly developed and approved** by the owners of both classifications;

Use of machine learning suggestions and human validation; Results available on our website as free <u>download</u>

EURES MS mapping tables

Results of the mapping of national taxonomies to ESCO; Available on our website as <u>free download</u>



Increasing interoperability: O*NET crosswalk

Machine learning #10

200 O*NET to ESCO occupations suggestions

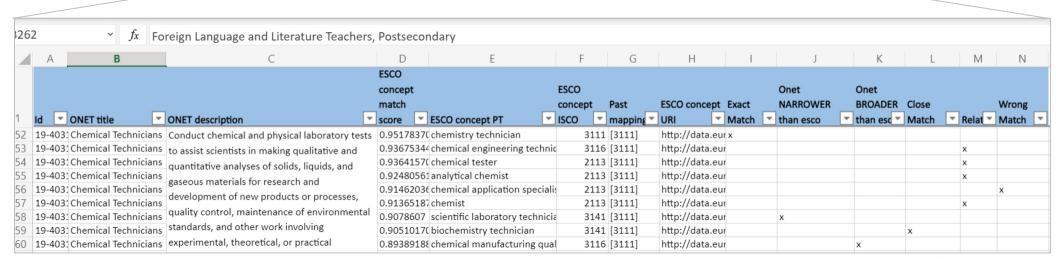
Human labelling Select among 6 labels. 12 working days.

Quality assuranc Validation and discussion ± 2 working days

Machine learning 79 O*NET to ISCO occupations #5 suggestions

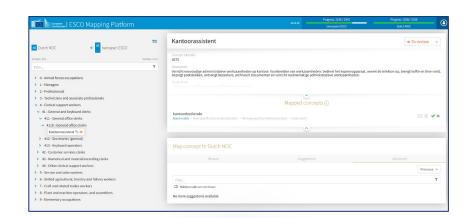
Human labelling Select among 2 labels ± 2 working days

Quality assuranc Validation and discussion >1 working day





Increasing interoperability: Member State crosswalks





1	http://data.europa.eu/esco/occupation/bf89925d-00a1-4f94-ab3b-2148c887af33	detailhandelaar	Bedrijfsleider / ondernemer verkoop gedenkstenen	skos:narrowMatch
2	http://data.europa.eu/esco/occupation/d5eb6150-bbff-4a9c-9d0c-21eab4dbe2b6	restaurantmanager	Manager cateringbedrijf	skos:narrowMatch
3	http://data.europa.eu/esco/occupation/cb3b2662-774a-4e6f-841e-f120244d7031	sergeant	Onderofficier logistieke dienst verzorging (ldv) koninklijke marine	skos:broadMatch
4	http://data.europa.eu/esco/occupation/a79d9e58-36be-4e67-a4db-ea6c8ff445fc	afdelingsmanager detailhandel	Afdelingsmanager verkoop herenkleding	skos:narrowMatch
5	http://data.europa.eu/esco/occupation/8ec8df02-e9dd-43b7-b416-5846ae0414ab	vastgoedmakelaar	Verhuurmedewerker woondiensten	skos:narrowMatch
6	http://data.europa.eu/esco/occupation/664f7498-8e4b-48f8-9fe2-436a692f1204	manager detailhandel muur- en vloerbekleding	Afdelingsmanager verkoop woningtextiel en vloerbedekkingen	skos:narrowMatch
7	http://data.europa.eu/esco/occupation/810e5e67-acd5-499a-b307-cf5bea330859	ict information manager	Hoofd informatievoorziening en automatisering	skos:exactMatch
8	http://data.europa.eu/esco/occupation/d792974a-077b-44a7-9421-b3ab7fdc7c40	operator persmachine	CNC-forceur	skos:broadMatch
9	http://data.europa.eu/esco/occupation/9e81adde-9983-44fa-b74b-c548d0dbfbdd	winkelmanager	Bedrijfsleider / ondernemer verkoop parket en laminaat	skos:closeMatch
10	http://data.europa.eu/esco/occupation/544cd9cf-e2ee-4ac0-8a02-7147af6b97d7	manager bedrijfseenheid	Algemeen directeur	skos:broadMatch
11	http://data.europa.eu/esco/occupation/cb3b2662-774a-4e6f-841e-f120244d7031	sergeant	Marechaussee	skos:narrowMatch
12	http://data.europa.eu/esco/occupation/aa9c6416-6a17-4e2f-a7c4-6d47c205d480	verkoopspecialist zorgartikelen en -hulpmiddelen	Verkoopspecialist zorgartikelen en -hulpmiddelen	skos:exactMatch
13	http://data.europa.eu/esco/occupation/0a5356bc-7f81-4e40-971d-c1dc789c5fb4	nanny	Kinderoppas particulieren	skos:exactMatch
14	http://data.europa.eu/esco/occupation/731ecac4-06e8-4ec2-a559-101fecbd9183	medewerker huishoudelijke dienst	Huishoudelijk medewerker (hotel, instelling)	skos:broadMatch
15	http://data.europa.eu/esco/occupation/3cc87d40-f402-4f57-9353-4b36a031cfc5	verhuurmedewerker autoverhuurbedrijf	Verhuurmedewerker autoverhuurbedrijf	skos:exactMatch
16	http://data.europa.eu/esco/occupation/0368c4d4-94cf-4168-a84d-283a25880e0d	manager metaalproductie	Manager metaalbewerkingsbedrijf / constructiebedrijf	skos:narrowMatch
17	http://data.europa.eu/esco/occupation/771955d9-e988-47f3-b60f-207adb2cd571	manager recreatie-accommodatie	Manager recreatie-accommodatie	skos:narrowMatch
	http://data.europa.eu/esco/occupation/a9068f84-cecd-4cbb-9acb-e20c714435ec	betonafwerker	Betonreparateur	skos:narrowMatch
19	http://data.europa.eu/esco/occupation/c6a26e11-bdf1-47a1-849d-fdcf819d458d	officier	Officier vlieger en loadmaster koninklijke luchtmacht	skos:broadMatch
20	http://data.europa.eu/esco/occupation/c6e5e0e7-fa99-4f71-9fc1-9889d85282a5	generaal	Marechaussee	skos:narrowMatch
21	http://data.europa.eu/esco/occupation/0ab64770-9fd7-4baf-8abf-b1ac0e1538ba	bediener hydraulische smeedpers	Metaalperser	skos:narrowMatch
22	http://data.europa.eu/esco/occupation/9ba74e8a-c40c-4228-9998-eb3c7a5c11df	verkoopmedewerker	Verkoopmedewerker boeken, tijdschriften en kantoorartikelen	skos:narrowMatch
23	http://data.europa.eu/esco/isco/C1323	Leidinggevende functies in de bouwnijverheid	Bedrijfsleider / ondernemer kabel- en leidinginfra	skos:narrowMatch
24	http://data.europa.eu/esco/occupation/e9cf8b24-6b8b-47cc-9dd3-b601aa135960	functionaris van een belangengroep	Bestuurder sportbond	skos:narrowMatch
25	http://data.europa.eu/esco/occupation/02d4f153-8e43-444d-8bd4-8171d49eab12	werktuigkundige aandrijvingen	CNC-draaier (inclusief programmeren)	skos:broadMatch
26	http://data.europa.eu/esco/occupation/bbd1fe06-1b55-4937-9317-fc162311ab38	brigadegeneraal	Marechaussee	skos:narrowMatch
27	http://data.europa.eu/esco/occupation/985400a7-362f-4f91-941a-2e149d94ac2a	biersommelier	Medewerker bediening horeca (luxe restaurant)	skos:broadMatch
28	http://data.europa.eu/esco/occupation/068c2787-58ff-468e-bbb6-c4e5dd6ee482	raadgevend actuaris	Actuaris	skos:exactMatch
	http://data.europa.eu/esco/occupation/94e0bedd-e56e-42be-a5a4-b74a260f437c	afdelingsmanager	Afdelingsmanager verkoop elektrotechnische artikelen en apparaten	skos:narrowMatch
30	http://data.europa.eu/esco/occupation/6e8917c8-d883-4475-954c-ec241215ca18	manager fotowinkel	Bedrijfsleider / ondernemer verkoop fotografische artikelen	skos:exactMatch
31	http://data.europa.eu/esco/occupation/6426ada1-4d8c-4612-99e3-91bc569805ee	productiemanager	Chef textielindustrie	skos:narrowMatch
32	http://data.europa.eu/esco/occupation/5779aa3b-b32f-42f7-9581-ef5ce2092621	verkoopmanager vlees en vleeswaren	Bedrijfsleider / ondernemer verkoop vlees en vleeswaren	skos:exactMatch
33	http://data.europa.eu/esco/occupation/64e38ce7-3901-4261-bfee-77c7a77397f2	beleidsverantwoordelijke	Manager organisatieadviesbureau	skos:narrowMatch

AI assisted mapping in 28 languages

Source classification Source concept (Country)		Score	ESCO suggestion	Expert validation	
Latvijas	jas Bagarēšanas		bagarēšanas mašīnu operators	exact	
Profesiju klasifikators	mašīnu operators	91	ekskavatora vadītājs		
(LV)	(8342.01)	89	buldozera vadītājs		
	-SISPE 2011 Entrevistadores/ Encuestadores 87 (44301013)	encuestador/ encuestadora	exact		
(FS) E		87	encuestador de estudio de mercado/ encuestadora de estudio de mercado	broad	
		77	responsable de estudios de campo		
Swedish	Distributionschef	90	distributionschef	narrow	
Standard Classification	Standard , logistik och	90	distributionschef, avfall och skrot	broad	
of Occupations (SE)	(TN3u_buC_wJF)	89	distributionschef, levande djur	broad	



Increasing interoperability: Member State crosswalks

Benchmark analysis:

- Multilingual model to suggest ESCO occupations for concept from national classification
- Compare top k suggestions with EURES expert validation
- Map to source language / English ESCO variant
- Map from source concept title and title + description

			MRR				Accuracy			
Country (# mapped occupations)	Input	ESCO language	Micro	Top 1	Top 2	Top 3	Top 5	Top 10	Top 20	Top 30
LV (2747)	Title	EN	0.5719	0.4536	0.5784	0.6400	0.7153	0.7961	0.8591	0.8890 0.9057 0.9101 0.9142 0.9149 0.9402 0.8956 0.9029 0.9447 0.9558 0.9819
LV (2747)	nue	LV	0.6231	0.5169	0.6298	0.6837	0.7543	0.8231	0.8824	
ES (2190)	Title	EN	0.6150	0.4982	0.6284	0.6890	0.7560	0.8326	0.8872	0.9101
ES (2180)	Title	ES	0.6358	0.5266	0.6422	0.7064	0.7729	0.8413	0.8945	0.8890 0.9057 0.9101 0.9142 0.9149 0.9402 0.8956 0.9029 0.9447 0.9558
SE (2292)	Title	EN	0.6033	0.4838	0.6143	0.6824	0.7426	0.8229	0.8866	0.8890 0.9057 0.9101 0.9142 0.9149 0.9402 0.8956 0.9029 0.9447 0.9558
3E (2292)	Title	SV	0.6689	0.5620	0.6837	0.7365	0.7958	0.8687	0.9136	
	Title	EN	0.6666	0.5725	0.6806	0.7260	0.7789	0.8391	0.8821	0.8890 0.9057 0.9101 0.9142 0.9149 0.9402 0.8956 0.9029 0.9447 0.9558
IT (814)	Title	IT	0.6930	0.6093	0.7052	0.7506	0.7887	0.8342	0.8894	0.9029
11 (614)	Title,	EN	0.7141	0.6278	0.7224	0.7617	0.8145	0.8796	0.9214	0.9447
	Desc	IT	0.7308	0.6413	0.7494	0.7887	0.8280	0.8907	0.9361	0.9558
O*NET (940)	Title	EN	0.8671	0.8128	0.8809	0.9106	0.9362	0.9553	0.9734	0.9819
	Title, Desc	EN	0.8811	0.8351	0.8915	0.9138	0.9415	0.9564	0.9755	0.9787

Open access mapping tool: multilingual content to **ESCO** occupations

Launch early 2023 of a free tool for all our stakeholders:

Input (language)	Input – English translation	Score	ESCO suggestion
Sosiaalityöntekijä, Oulun kaupunki, Kiimingin lastensuojelu, Oulu (FI)	Social worker, City of Oulu, Kiiming child protection, Oulu	86	child welfare worker
Werkvoorbereider Tekenaar AutoCad, Noordwijkerhout (NL)	Planner Draftsman AutoCad, Noordwijkerhout	88	drafter
Майстер нігтьового сервісу (манікюр, педикюр) (UK)	Nail service master (manicure, pedicure)	93	manicurist
Sprzedawca-kasjer w stacji paliw 1/2 etatu (PL)	Salesperson-cashier at a gas station 1/2 time	91	fuel station specialised seller
Salvatore cerca una baby sitter a Fiano Romano (IT)	Salvatore is looking for a babysitter in Fiano Romano	90	babysitter

Input – English translation	Score	ESCO suggestion
Employee for machine cleaning and horticulture	89	horticulture worker
Do you dream of becoming self-employed and do you have experience in either recruitment, sales, management or perhaps all three parts?	80	recruitment consultant
Happy and mischievous 13- year-old boy looking for resourceful and responsible assistant 75%	79	nanny
Grocery shopping for an older person	83	companion
Caring for an older person	85	residential home older adult care worker
	Employee for machine cleaning and horticulture Do you dream of becoming self-employed and do you have experience in either recruitment, sales, management or perhaps all three parts? Happy and mischievous 13-year-old boy looking for resourceful and responsible assistant 75% Grocery shopping for an older person	Employee for machine cleaning and horticulture Do you dream of becoming self-employed and do you have experience in either recruitment, sales, management or perhaps all three parts? Happy and mischievous 13-year-old boy looking for resourceful and responsible assistant 75% Grocery shopping for an older person 89 80 80 81



Multilingual content to ESCO occupations: unseen languages

Flexible methodology to extend to other languages

Input (language)	Input – English translation	Score	ESCO suggestion
Šef smene u skladištu logistike mleka i mlečnih proizvoda (SR)	Head of the shift in the logistics warehouse of milk and dairy products	89	dairy products and edible oils distribution manager
Vozač drumskog vozila u domaćem i međunarodnom drumskom saobraćaju (SR)	Driver of a road vehicle in domestic and international road traffic	90	cargo vehicle driver
Zamenik poslovođe maloprodajnog objekta (SR)	Deputy manager of a retail store	87	department store manager
Per EKSELENTET! Intership/praktike: Kontabilitet/Fiskalitet VLORE (SQ)	For EXCELLENCES! Internship/practice: Accounting/Fiscal VLORE	78	accounting assistant
Zhvillues Software, Sektori i Zhvillimit IT (SQ)	Software Developer, IT Development Sector	83	software developer
ofroj vend pune Inxhinier Mjedisi ne degen e Energjetikes (SQ)	I offer a job as an Environmental Engineer in the Energy department	87	energy engineer

Input (language)	Input – English translation	Score	ESCO suggestion
마케팅전문가 (KO)	marketing expert	92	marketing consultant
제조업 사무직 자재구매 및 입출고 사무업무 (매입,매출전표관리) 거래처 발주 접수 및 거래명세서 작성 (KO)	Manufacturing office worker Material purchasing and warehouse/shipping office work (purchase and sales slip management) Receiving customer orders and preparing transaction details	81	purchaser
화학제품생산직(기계조작) 표면처리 약품 제조 회사 입니다. 약품 원료를 가지고 배합하여 제조 및 말통 포장 하는 업무. 주 5 일 근무 9 시- 18 시 (KO)	Chemical product production job (machine operation) We are a manufacturer of surface treatment chemicals. Manufacturing and packaging of pharmaceutical raw materials by mixing them. Working 5 days a week 9:00 - 18:00	90	chemical mixer

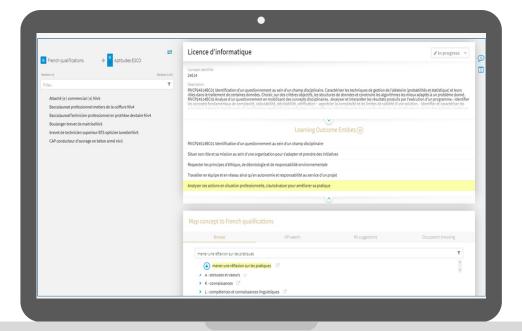
Linking qualifications with ESCO skills

1

Linking learning outcomes of qualifications with ESCO skills

3

Using a platform that assists in the process for easier validation



2

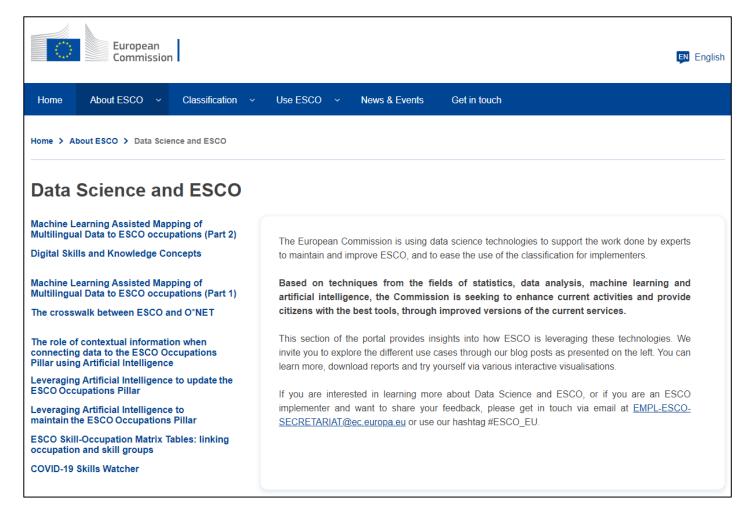
EU Member states, private training providers, social partners, ETF

4

Launch early 2023 of a free tool for all our stakeholders



ESCO Data Science Blog

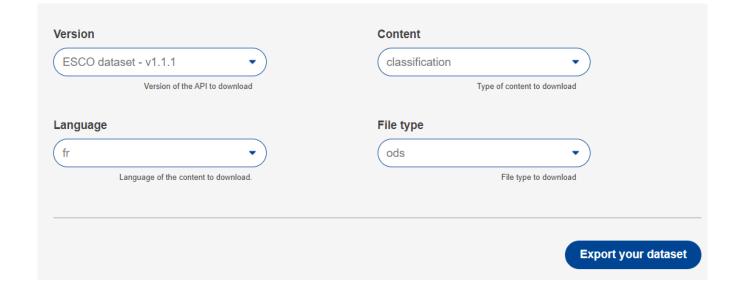


https://esco.ec.europa.eu/en/about-esco/data-science-and-esco

Learn more about ESCO

DOWNLOAD or API from the ESCO Portal

https://esco.ec.europa.eu/en/use-esco/download



UPON REQUEST

Technical support on how to use ESCO & knowledge exchange on AI

CONTACT:

ESCO Secretariat:

EMPL-ESCO-SECRETARIAT@ec.europa.eu
laura.visan@esco-support.eu
jan.luts@esco-support.eu

European Commission

Thank you!



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