

## Matchmaking work at Bristol

Miquel Perello Nieto 12 July 2023



#### Summary

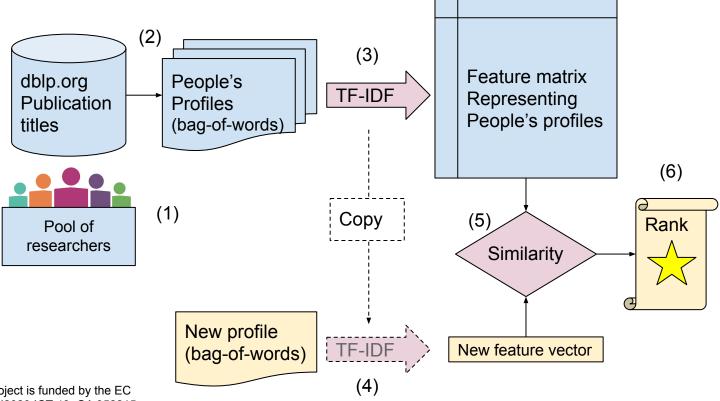
- SubSift
- Peer review process for the ACM SIGKDD'09 data mining conference
- TAILOR partners ranking website
- Synergetic groups of students with similar interests
- Matching synergetic groups of researchers and tasks
- Conference networking suggestions from previous publications

#### **SubSift**

[Price et.al. 2010]



#### SubSift [Price et.al. 2010]





#### SubSift [Price et.al. 2010]

- Automatic matching of articles and reviewers
  - Articles/Topics are characterised by TF-IDF text representation
  - Reviewers by TF-IDF titles of their articles in the <u>DBLP</u> database
  - A similarity score is computed between topics/articles and reviewers (e.g. cosine similarity)
- Other applications:
  - Matching of people with similar interest
  - Matching of articles of similar topics
  - Grouping people in teams by topic, or similarities

### TAILOR partners ranking website



#### https://subsift-webapp.onrender.com/subsift/

Home SubSift SubSift People Here you can try out a demonstrator of the SubSift matching application. SubSift was originally developed by the Intelligent Systems Laboratory at the University of Bristol as an innovative "submission sifting" application to support academic peer review. Within the TAILOR project the application About has been extended to match arbitrary text to a pre-defined set of people, based on the similarity of the text to titles of published works in the DBLP article repository. Feedback Match text Provide one or more paragraphs of text to be matched against TAILOR people in the text box below. Text to match\* Find best matches Example text The following text can be copied and pasted as an example. It is the first paragraph of the Wikipedia entry for <a href="Symbolic artificial intelligence">Symbolic artificial intelligence</a>. In artificial intelligence, symbolic artificial intelligence is the term for the collection of all methods in artificial intelligence research that are based on high-level symbolic (human-readable) representations of problems, logic and search.[1] Symbolic AI used tools such as logic programming,

production rules, semantic nets and frames, and it developed applications such as knowledge-based systems (in particular, expert systems),

# Synergetic groups of students with similar interests

2nd ACAI-TAILOR Summer School, June 13-17, 2022

### SynTeams

[Andrejczuk et. al. 2018]



#### SynTeam [Andrejczuk et. al. 2018]

- Partition of students into subgroups of similar size and competence
- Individuals are evaluated by competence, personality and gender
- Basic student's definition
  - Unique ID:
  - Gender:
  - A personality: four personality traits {-1, 1} (See Jung, 1921)
    - (SN) Sensing / Intuition
    - (TF) Thinking / Feeling
    - (PJ) Perception / Judgment
    - (EI) Extroversion / Introversion
  - A set of competences: task related (e.g. skill, knowledge, attitude)



#### Post-Jungian personality test

- 2 Psychological functions:
  - Sensing vs iNtuition
  - Thinking vs Feeling

2 Psychological attitudes:

- Perception vs Judgment
- Extroversion vs Introversion

INFP

The Mediator

ENFP

5 ternary	questions
per dime	nsion
(20 in total	al)

I..J

.ST.ISTJ

The Inspector

ISTP

The Crafter

ESTP

The Persuader

.SF. ISFJ

ISFP

The Artist

ESFP

INFJ The Protector The Advocate

.NF. .NT. INTJ

The Arcthitect

INTP

The Thinker

ENTP

The Debater

ENTJ

The Commander

- 16 personality combinations

Facilitators: E TJ This project is funded by the EC under H2020 ICT-48. GA 952215 I..P

E..J

E..P

ESTJ The Director

The Performer ESFJ The Caregiver

The Champion **ENFJ** The Giver

		Albert Cabellos	0.00	0.06	0.07	0.05	0.03	0.04	0.07	0.05	0.07	0.04	0.08	0.05	0.05	0.04	0.04	0.06	0.04	L	0.40
		Carles Sierra	0.05	0.00	0.09	0.13	0.07	0.04	0.14	0.09	0.10	0.07	0.11	0.12	0.11	0.06	0.05	0.07	0.07		
Match people to people	atch people	André Meyer-Vitali	0.06	0.10	0.00	0.08	0.07	0.05	0.10	0.09	0.07	0.05	0.09	0.09	0.16	0.04	0.06	0.10	0.08	- 0.	0.35
	Miquel Sánchez Marré	0.05	0.13	0.07	0.00	0.06	0.05	0.13	0.32	0.08	0.07	0.14	0.14	0.11	0.05	0.05	0.08	0.07			
	heobie	Xavier Angerri	0.03	0.08	0.07	0.07	0.00	0.04	0.08	0.08	0.05	0.09	0.08	0.07	0.12	0.04	0.04	0.09	0.42	-	0.30
	TF-IDF from publication ti	Kevin Sánchez	0.04	0.04	0.05	0.06	0.04	0.00	0.05	0.06	0.04	0.04	0.07	0.05	0.06	0.05	0.06	0.07	0.05		
-	Cosine similarity	Michela Milano	0.06	0.14	0.09	0.14	0.08	0.04	0.00	0.10	0.08	0.10	0.16	0.11	0.12	0.11	0.03	0.07	0.08	L	0.25
	-	Karina Gibert	0.04	0.09	0.08	0.33	0.07	0.05	0.09	0.00	0.08	0.06	0.16	0.11	0.11	0.04	0.07	0.07	0.07		
		Ramon Sangüesa	0.07	0.11	0.07	0.10	0.05	0.04	0.09	0.09	0.00	0.06	0.08	0.07	0.06	0.04	0.05	0.06	0.05	_	0.20
		Sergi Ramírez	0.04	0.08	0.05	0.08	0.09	0.04	0.11	0.07	0.06	0.00	0.07	0.06	0.08	0.04	0.04	0.06	0.04		Line Teles
		Peter Flach	0.07	0.10	0.08	0.14	0.07	0.06	0.15	0.16	0.07	0.06	0.00	0.15	0.10	0.04	0.06	0.07	0.09	_	0.15
		Àngela Nebot	0.04	0.12	0.08	0.14	0.06	0.04	0.11	0.11	0.06	0.06	0.16	0.00	0.09	0.04	0.05	0.07	0.08		
		Ferran Marquès	0.04	0.10	0.14	0.11	0.11	0.05	0.11	0.11	0.05	0.07	0.10	0.08	0.00	0.04	0.05	0.15	0.12	_	0.10
		Ana Paiva	0.04	0.06	0.04	0.06	0.04	0.05	0.12	0.05	0.04	0.04	0.05	0.05	0.05	0.00	0.05	0.05	0.04		0.10
		Jordi Varela	0.04	0.05	0.06	0.06	0.04	0.06	0.04	0.08	0.05	0.04	0.07	0.06	0.06	0.05	0.00	0.06	0.04		0.05
		Gemma Thomas	0.06	0.08	0.10	0.09	0.08	0.07	0.07	0.07	0.06	0.06	0.08	0.08	0.18	0.05	0.06	0.00	0.11		0.03
		Javier Hernando	0.03	0.07	0.08	0.08	0.39	0.04	0.08	0.08	0.04	0.04	0.10	0.08	0.14	0.03	0.03	0.10	0.00		0.00
()	This project is funded by the EC under H2020 ICT-48, GA 952215		Albert Cabellos -	Carles Sierra -	dré Meyer-Vitali -	Sánchez Marré -	Xavier Angerri -	Kevin Sánchez -	Michela Milano -	Karina Gibert -	ımon Sangüesa -	Sergi Ramírez -	Peter Flach -	Àngela Nebot -	Ferran Marquès -	Ana Paiva -	Jordi Varela -	semma Thomas -	avier Hernando -		0.00

Matching synergetic groups of researchers and tasks

2nd TAILOR Conference September 13-14, 2022 Prague



#### The Strategic Roadmap, SRIR

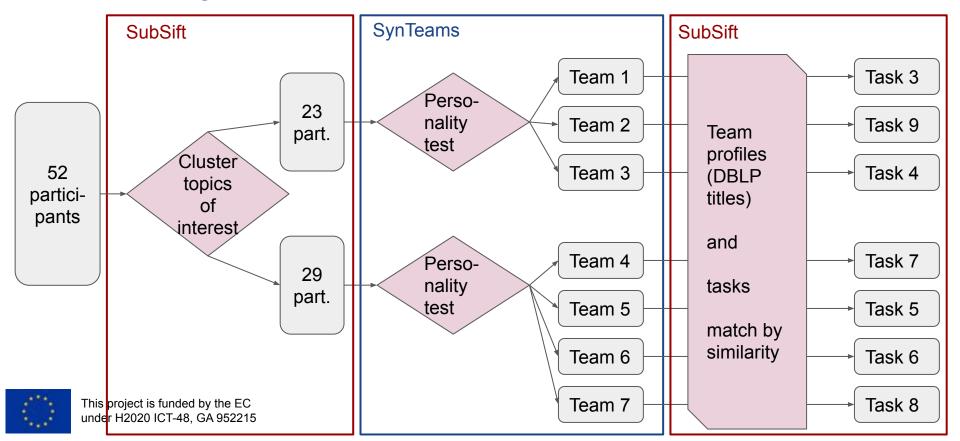
- Definition of the foundations of Trustworthy AI for the years 2022-2030
- Clear recommendations for future research on Trustworthy AI
- For researchers, policy makers and funding agencies
- The first version filed M23
- The Group work will contribute to version 2







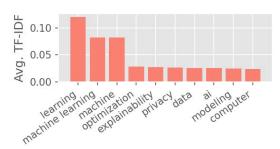
#### Task assignation overall pipeline





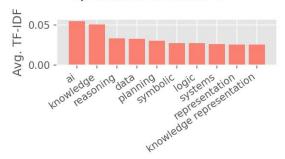
#### 2 Clusters based on topics of interest

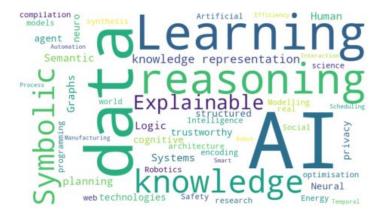






#### Top 10 terms for cluster 1





### Conference networking suggestions from previous publications

3rd TAILOR Conference, June 5-6, 2023, Siena



#### SHapley Additive exPlanations

Example of a positive (red) vs negative (blue) sentiment classifier trained on movie reviews of IMDB.



i went and saw this movie last night after being coaxed to by a few friends of mine. i'll admit that i was reluctant to see it because from what i knew of ashton kutcher he was only able to do comedy. i was wrong. kutcher played the character of jake fischer very well, and kevin costner played ben randall with such professionalism. the sign of a good movie is that it can toy with our emotions, this one did exactly that the entire theater (which was sold out) was overcome by laughter during the



#### Example of ranking and explanation

- Score 1.00 Miquel Perello-Nieto
- Score 0.30 Peter Flach
- Score 0.09 Saso Dzeroski
- Score 0.08 JERZY STEFANOWSKI
- Score 0.07 Francesca Pratesi
- Score 0.06 Stefano Teso
- Score 0.05 Maria Bielikova
- Score 0.05 Luciano Cavalcante Siebert
- Score 0.05 Benjamino Di Martino
- · Score 0.05 Francisco Chicano
- Score 0.05 Andrea Visentin
- · Score 0.05 Neil Yorke-Smith
- Score 0.04 Joaquin Vanschoren
- Score 0.04 Giuseppe De Giacomo
- · Score 0.04 Holger Hoos
- Score 0.04 Flavio Lombardi
- · Score 0.04 Ana Paiva
- Score 0.04 Andrea Orlandini
- Score 0.04 Fredrik Heintz



Co-designing opportunities for Human-Centred Machine Learning in supporting Type 1 diabetes decision-making. When the Ground Truth is not True: Modelling Human Biases in Temporal Annotations. MIDI-Draw: Sketching to Control Melody Generation. Empirical Evaluation of Predictive Models: A keynote at ECIR 2022. FAT Forensics: A Python toolbox for algorithmic fairness, accountability and transparency. LIMESegment: Meaningful, Realistic Time Series Explanations. Understanding Reinforcement Learning Based Localisation as a Probabilistic Inference Algorithm. Self-Enhancer: A Selfsupervised Framework for Low-Supervision, Drifted Data with Significant Missing Values. The Weak Supervision Landscape. The Weak Supervision Landscape. Simply Logical - Intelligent Reasoning by Example (Fully Interactive Online Edition). FAT Forensics: A Python Toolbox for Implementing and Deploying Fairness, Accountability and Transparency Algorithms in Predictive Systems. What and How of Machine Learning Transparency: Building Bespoke Explainability Tools with Interoperable Algorithmic Components. Efficient and Robust Model Benchmarks with Item Response Theory and Adaptive Testing, Multi-label thresholding for cost-sensitive classification, Co-Designing Personal Health? Multidisciplinary Benefits and Challenges in Informing Diabetes Self-Care Technologies. Human Activity Recognition Based on Dynamic Active Learning, CRISP-DM Twenty Years Later: From Data Mining Processes to Data Science Trajectories, Machine Learning Explanations as Boundary Objects: How AI Researchers Explain and Non-Experts Perceive Machine Learning, Continual Density Ratio Estimation in an Online Setting, You Only Write Thrice; Creating Documents, Computational Notebooks and Presentations From a Single Source. Risk Sensitive Model-Based Reinforcement Learning using Uncertainty Guided Planning. Classifier Calibration: How to assess and improve predicted class probabilities: a survey. Explainability Is in the Mind of the Beholder: Establishing the Foundations of Explainable Artificial Intelligence. Uni- and multivariate probability density models for numeric subgroup discovery. N Forensics: A Python Toolbox for Implementing and Deploying Fairness, Accountability and Transparency Algorithms in Predictive Systems. One Explanation Does Not Fit All. Reflections on reciprocity in research. FACE: Feasible and Actionable Counterfactual Explanations. Model-Based Reinforcement Learning for Type 1 Diabetes Blood Glucose Control. Explainability fact sheets; a framework for systematic assessment of explainable approaches. Polsar Image Classification via Robust Low-Rank Feature Extraction and Markov Random Field. One Explanation Does Not Fit All: The Promise of Interactive Explanations for Machine Learning Transparency, LIMEtree: Interactively Customisable Explanations Based on Local Surrogate Multi-output Regression Trees. Bypassing Gradients Re-Projection with Episodic Memories in Online Continual Learning, Towards Faithful and Meaningful Interpretable Representations, Model-Based Reinforcement Learning for Type 1 Diabetes Blood Glucose Control. A Big Data platform for smart meter data analytics. Setting decision thresholds when operating conditions are uncertain. An application of hierarchical Gaussian processes to the detection of anomalies in star light curves. Performance Evaluation in Machine Learning: The Good, the Bad, the Ugly, and the Way Forward. Counterfactual Explanations of Machine Learning Predictions: Opportunities and Challenges for AI Safety, Desiderata for Interpretability: Explaining Decision Tree Predictions with Counterfactuals, \$\\$63\$-IRT: A New Item Response Model and its Applications. Distribution calibration for regression. Beyond temperature scaling: Obtaining well-calibrated multi-class probabilities with Dirichlet calibration. B Distribution Calibration for Regression, HyperStream: a Workflow Engine for Streaming Data, FAT Forensics; A Python Toolbox for Algorithmic Fairness, Accountability and Transparency, FACE: Feasible and Actionable Counterfactual Explanations. sining well-calibrated multiclass probabilities with Dirichlet calibration, bLIMEy: Surrogate Prediction Explanations Beyond LIME, Explainability Fact Sheets: A Framework for Systematic Assessment of Explainable Approaches, Introduction to the special issue on Data Science in Europe, A Comprehensive Study of Activity Recognition Using Accelerometers, Activities of Daily Living Ontology for Ubiquitous Systems: Development and Evaluation. Anomaly detection in star light curves using hierarchical Gaussian processes. Analysis of Patient Domestic Activity in Recover From Hip or Knee RePlacement Surgery: Modelling Wrist-worn Wearable RSSI and Accelerometer Data in The Wild. The Facets of Artificial Intelligence: A Framework to Track the Evolution of AI. Conversational Explanations of Machine Learning Predictions Through Class-contrastive Counterfactual Statements, Glass-Box: Explaining AI Decisions With Counterfactual Statements Through Conversation With a Voice-enabled Virtual Assistant, Releasing eHealth Analytics into the Wild: Lessons Learnt from the SPHERE Project, Non-Parametric Calibration of Probabilistic Regression, Computational support for academic peer review: a perspective from artificial intelligence. Unsupervised learning of sensor topologies for improving activity recognition in smart environments. Beta calibration; a well-founded and easily implemented improvement on logistic calibration for binary classifiers. The Role of Textualisation and Argumentation in Understanding the Machine Learning Process. Classifier Calibration. First-Order Logic. ROC Analysis. Probabilistic Sensor Fusion for Ambient Assisted Living. CASP-DM: Context Aware Standard Process for Data Mining. Reframing in

context: A systematic approach for model reuse in machine learning. On the need for structure modelling in sequence prediction. Cost-sensitive boosting algorithms: Do we really need them? Feature Construction and Calibration for Clustering Daily Load Curves from Smart-Meter Data. Declaratively Capturing Local Label Correlations with Multi-Label Trees. Active transfer learning for activity