





## 'Putting Science Into Standards' workshop

#### Welcome! We will start soon

#### **CREATING AND DOCUMENTING DATASETS FOR AI**

8 June, 15:45-17:15



## Panel discussion CREATING AND DOCUMENTING DATASETS FOR AI





#### **Roundtable speakers**

**Felix NAUMANN** 

Hasso-Plattner-Institut **Emmanuel KAHEMBWE** 

**VDE** 

Kasia CHMIELINSKI

**Dataset Nutrition label** 

Flora DELLINGER

Valeo, Confiance.ai

Rapporteurs: Isabelle Hupont Torres (JRC)



#### **Audience interaction**





#### slido.com

**#Standards4AI** 



- Select the Dataset for AI room on Slido
- Zoom chat only technical questions to host
- Camera and audio OFF







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### Felix Naumann Hasso-Plattner-Institut

### slido



## Please fill in the survey

## Felix Naumann (HPI)







- ▶CS PhD in Information Quality and Information Integration
- ▶ Research at Humboldt University, IBM, AT&T, QCRI, SAP
- ► Chair for "Information Systems" at Hasso Plattner Institute and University of Potsdam
- ► Data Profiling: Measuring data quality
  - ▶ Dependency discovery
- ► Data Cleaning: Improving data quality
  - **▶** Duplicate detection
  - **▶** Data preparation
  - **▶**Change exploration



https://www.vde.com/kitgar

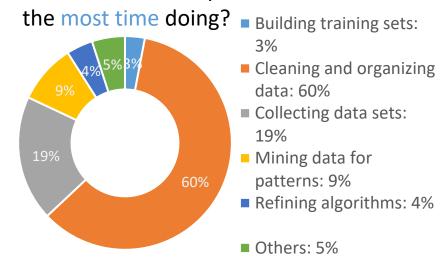
## Challenges Faced & Solutions

- ▶Bad files → bad data → bad results
  - ▶ Path of least resistance
- ► First challenge: Detect and measure problems
  - ► Novel AI-specific quality dimensions
- ► Second challenge: Prepare and clean data for AI
- ► Third challenge: Transparent documentation
  - ► Data quality measures
  - **▶** Data cleaning steps

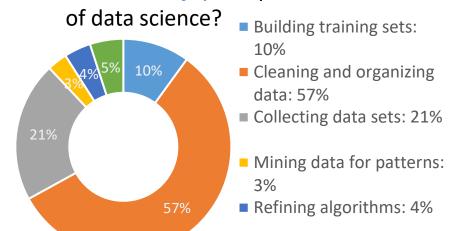




#### What data scientists spend



#### What is the least enjoyable part



'Putting science into standards' workshop – Data quality inclusive, non-biased and trustworthy Al■ Others: 5%

## Way Forward, Next Steps





- **▶** Data quality dimensions
  - ▶Which established dimensions are relevant?
    - ▶ Based on learning task, pipeline stage, domain
  - ▶ Which new dimensions are needed?
    - ▶ Diversity, privacy, bias, liability, explainability, ...
- ► Assessment and explanation of data quality
  - ▶Which dimensions are (automatically) assessable/testable?
  - ▶ Can we efficiently measure data quality?
  - ▶ Can we correlate model errors with data quality problems?









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## **Emmanuel Kahembwe VDE**

## Background





- ▶Education: PhDs in AI & Robotics
- ▶ Research:
  - ► Amazon Alexa AI Prize
  - ► Multimodal datasets
- ▶ Professional:
  - ▶CEO @ VDE (UK&I)
  - ▶ Chief AI Architect @ VDE e.V.
  - ▶ Standardization: StandICT EUOS, BSI (ART/1), OECD.AI
- ► European Projects:
  - ► AI Trust Standard/Label
  - ► AI Quality & Testing Hub

## Challenges Faced & Solutions





- ► Web Scrapping:
  - ► Copyright & Provenance
  - **►**Multimodality
    - ► Alt-text
    - ► Malignant stereotypes
    - ► Search Engine Bias
  - **▶** Curation
    - ► RTBF
    - ▶ Illicit material
    - ► Inclusivity
  - **▶** Documentation
  - **▶**Access
    - ▶ Difficult/expensive to collect, clean and maintain datasets

## Challenges Faced & Solutions





- ▶ Documentation
  - ► Datasheets (and Model Cards)
- **►**Auditing
  - ▶ Checklists
  - ► AI Trust Label/Standard
- ► Algorithmic Tools
  - ► Shapley Values
  - ► Influence functions
  - ▶ Filtering (and deletion) tools
  - **▶**Labelling tools

## Way Forward, Next Steps



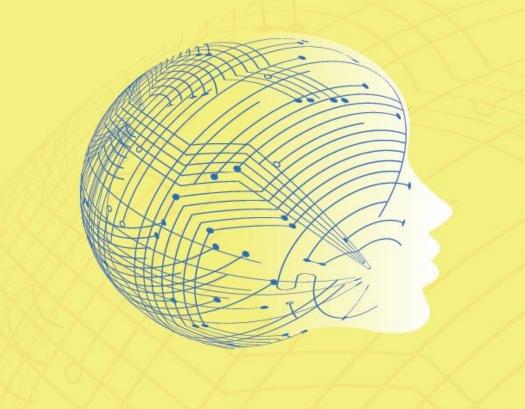


#### ►MISSING:

- ▶ A clear roadmap or set of standards/guidelines on the large scale collection and curation of web-scrapped data.
- ► How should such data be collected, stored, accessed and used within AI.

#### ►Next Steps:

- ► Aligning current AI practices with respect to existing laws and regulations.
- ▶ A set of standard guidelines and metrics for the collection and curation of web-scraped data.
- ▶ A set of standard tools to aid with data curation and documentation







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Thank you!







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### Kasia Chmielinski

CO-FOUNDER, DATA NUTRITION PROJECT SHORENSTEIN CENTER, HARVARD KENNEDY SCHOOL OF GOVERNMENT

## Professional background





► *Industry: (2007-2021)*Building algorithmic systems











► Research: (2017-current)

Dataset standards, documentation as a transparency mechanism











## Challenges





► Incentives [Why should I document?]

Key insight: Internal momentum must be paired with clear expectations and support from leadership, including real power to adjust existing org structures

▶ Usability / Usefulness [How does this fit into my existing tasks?]

Key insight: Friction can be reduced through integrating tools into workflow and focusing on user experience (not just schema)

► Technical Challenges [**How do I document?**]

Key insight: Large, unstructured streaming datasets are very challenging to document and will require new tools and approaches. Additionally, there will need to be different standards for different data domains.

► Engagement [How do we engage communities and create culture?]

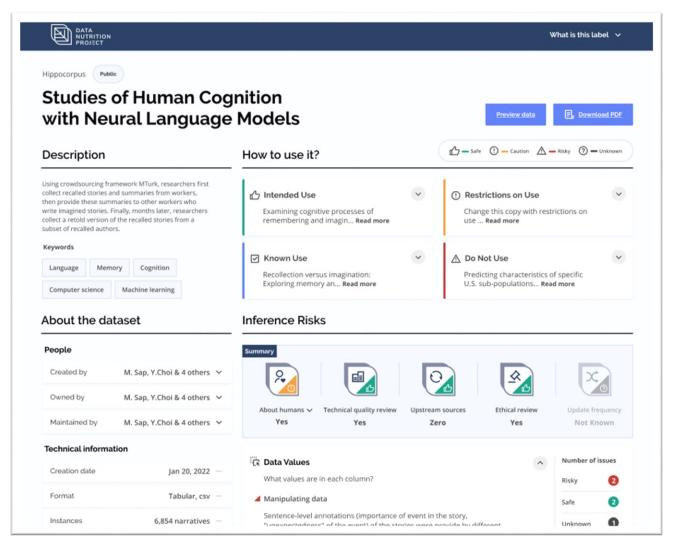
Key insight: This will require balancing values, e.g. community values may be incompatible with open data / science principles

### **Opportunities**

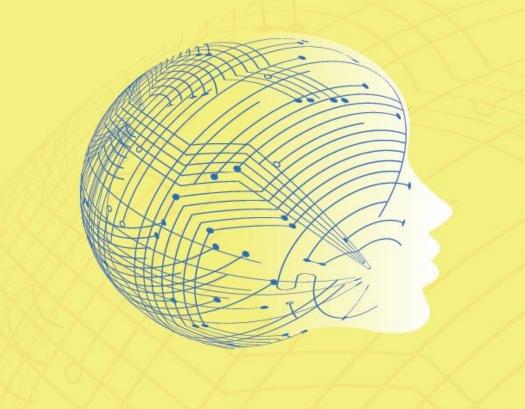




- ► Legibility: Provide standardized, accessible dataset documentation
  - ▶ "Nutrition Label" for Datasets (Fall 2022)
  - ► Streamlined for two pathways: **use** the data and **understand** the data
  - Strong user experience focus for easy reading and comparing
- ► Ecosystem: Leverage existing knowledge structures
  - ▶ Impact Assessments, Datasheets, Model Cards, FactSheets, etc
  - Qualitative information prioritized, especially provenance and domain knowledge
- ► Impact: Short and Long Term
  - ► Labels can be consulted individually, comparatively
  - ► Future integrations with certification programs
  - Drives consumer expectations of data quality transparency even when Label isn't present



'Putting science into standards' workshop – Data quality requirements for inclusive, non-biased and trustworthy AI







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Thank you!







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## Flora DELLINGER Valeo, Confiance.ai

## Professional background





- ► Flora Dellinger (Valeo, Confiance.AI)
  - ► PhD in computer vision and image processing
  - ► Machine Learning engineer in the industry



Development of AI-based camera perception modules for driving assistance systems.



**Confiance.AI**: French consortium to design and industrialize trustworthy AI-based critical systems [2021-2024].

Leader of the project "Trust by data": development of methods and tools to obtain trustworthy and relevant datasets for AI.

## Challenges Faced & Solutions







#### Behaviour of AI components is difficult to assess!

- → Datasets are not representative enough of encountered real-world situations (biases, domain gap, corner cases...).
- → Datasets lack quality and integrity over lifecycle.
- → Metrics to evaluate AI models are too generic and research oriented.



How to build relevant datasets for a specific use case? How to ensure quality of a dataset?



#### Create a methodology for data specification and data collection activities

- → To guide processes
- → To ensure compliance with input requirements (safety, functional, operational design domain)
- → Inspired by work done by ASAM (OpenODD, OpenScenario)



- Propose and develop metrics for trustworthiness datasets
  - → To measure representativity, diversity, traceability, compliance...



#### Develop tools to process and analyse datasets

- → To facilitate data processing and get insights on datasets
- → Fully integrated in a platform to ensure data integrity.



## Way Forward, Next Steps





- ► Today:
  - ► No standards or methodology for data creation, rely mainly on engineers experience.
- ▶Tomorrow, we need to develop new standards for:
  - ▶ Data format and label
    - ► To facilitate data exchanges and processes.
  - ► Dataset design and collection
    - ▶ To ensure relevance of data and to guide data acquisition step.
  - ► Data quality
    - ► To monitor datasets and provide trust in AI components.







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## Thank you!





# Thank you for joining us today See you tomorrow!

