

Al supporting **Cyber Risk** Management and Resilience of **Critical** Infrastructures

30<sup>th</sup> September 2024

## Al Supporting Cyber Risks And Resilience Of Critical Infrastructures

Insights From CS-AWARE NEXT, DYNABIC, & AI4CYBER









30 September 2024

16:00 - 17:30 CEST



Prof. Juha Röning CS-AWARE NEXT Project Coordinator, University of Oulo



Erkuden AI4CYBER and DYNABIC Project Manager, TECNALIA



Victor Muntés-Mulero **Exploitation and Innovation** Manager at DYNABIC, Beawre











#### 16:00 – 17:00 – Al Solutions supporting Cyber Risk Management

Design-Science and Al harnessed for improving 'Cybersecurity on infrastructure ecosystems

Prof. Juha Röning, Professor at the University of Oulu, CS-AWARE NEXT Coordinator

- Q&A



Smart Risk Management for Business Continuity in Critical Infrastructure
Victor Muntés-Mulero, Co-founder and CEO at Beawre, Exploitation and Innovation Manager at DYNABIC
- Q&A

Trustworthy Al for cybersecurity solutions
Erkuden Rios, AI4CYBER and DYNABIC Project Manager, TECNALIA
- Q&A

17:00 – 17:30 - Roundtable with speakers Chair – Nicholas Ferguson, Trust-IT & ECCO











#### Housekeeping



- The webinar is being recorded. A link to the full recordings will be shared with participants afterwards
- You're welcome to ask questions! Please use Q&A panel to ask your questions: we will activate your microphone.
- You can also raise your hand during the dedicated Q&A time
- Roundtable at the end for further questions!





# Design-Science and Al Harnessed for Cybersecurity Infrastructure Ecosystem

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Juha.Roning@oulu.fi

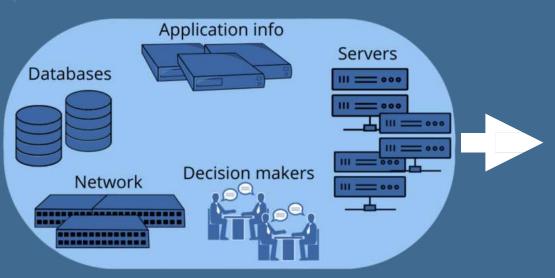


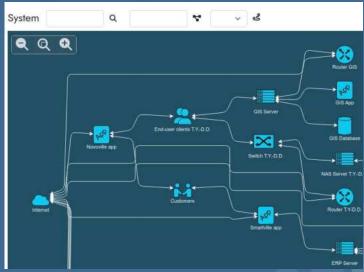
## The CS-AWARE H2020 project

- A socio-technical systems based approach to cybersecurity management in organisations based on awareness
  - Humans are a central factor in any complex system
  - CS-AWARE enables humans to be part of the solution in solving cybersecurity issues
- 2 pillars
  - Analysis: Socio-technical workshops allow the people working in an organisation to specify their systems, and how they work in practice (co-design)
  - Monitoring: Provide the technical capability for datadriven real-time monitoring and managing the system as specified by the people of an organisation



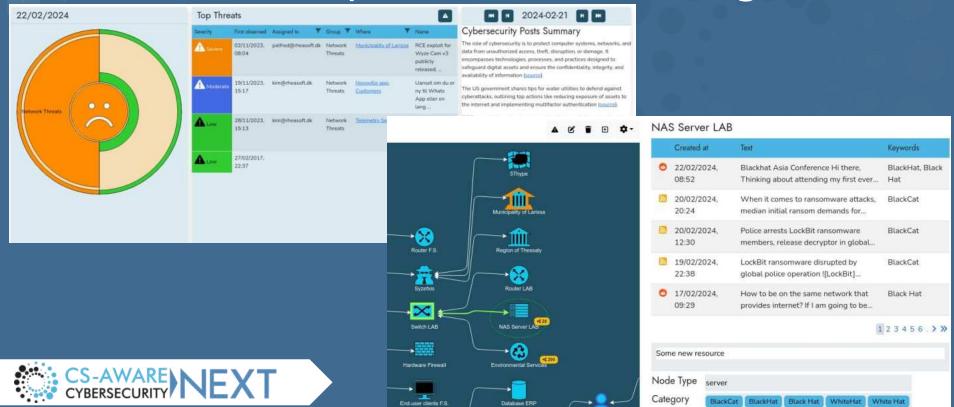
## CS-AWARE process - Analysis







## CS-AWARE process - Monitoring



#### CS-AWARE commercialization

- A start-up was founded by core partners of the CS-AWARE project
  - Common exploitation of IP developed during project
  - Common exploitation allows establishing strong branding
  - Development to market readiness
  - Establishing sales channels
- Challenges
  - A TRL7 pilot demonstrator is not a market ready product, additional funding is required for commercialisation
  - Attracting funding at such an early commercial state is challenging
  - We are trying to fundamentally change how organisations manage cybersecurity. Not easy to convince customers, even if offering may be superior.
- We are now in a market ready state with the CS-AWARE lite platform, and are hopeful to have our first customers in 2024



## Why CS-AWARE-NEXT?

- Core insight from CS-AWARE project
  - Improving cybersecurity within an organisation is not enough, as organisations are part of ecosystems
- Inter-organisational collaboration
  - Using the CS-AWARE platform as the basis for organisational cybersecurity management, how can we support collaboration among organisations (e.g. supply chain), with a focus on improving regional collaboration
  - Collaboration does not simply happen because it is required, it needs support and focus to develop norms and practices



## CS-AWARE-NEXT Objectives

- The project has 8 objectives, clearly linked to the project work plan
  - Data-driven inter-organisational collaboration as the overarching theme
  - Enabling dynamic and pro-active cybersecurity management



## CS-AWARE-NEXT Objectives

**Objective 1** 

Dynamic policy support

WP1

Ecosystem Collaboration

Al based data correlation

BC/DR and self-healing

Information sharing

**Objective 6** 

Benchmarking and Profiling

WP7

**Objective 7** 

Implementation, Integration and deployment

WP6

**Objective 8** 

Design science based project implementation and validation

WP7



## Design-science based project implementation

In the design-science paradigm, knowledge and understanding of a problem domain and its solution are achieved in the building and application of the designed artifact

-- Hevner et. al., Design Science in Information Systems Research



## Design-science based project implementation

- Design and implement information system artifacts
- Co-design: build around user needs, together with the users
- Iterative design and validation: Validate various states from conceptualisation to implementation with end users, and adopt according to insights gained



## Tools for supporting regional cybersecurity collaboration

#### **CS-AWARE PLATFORM for** information and awareness

- Organisational level
   Policy support
   New Al-based data and information engine
   BC/DR support, self-healing
   Information sharing with authorities



#### **CS-CONNECT as collaborative** interface

- Ecosystem level collaboration
  - <u>Mattermost-based</u>
  - Co-designed collaboration scenarios
- Data-driven
  - Integration with data from
  - CS-AWARE platform Availability of Al-based contextualized data



## Project implementation overview

#### **Iteration 1**

First end-user workshop in Larissa and Foggia.
Focus on environment analysis and user needs

WP1 – WP7 R&D Focus on requirements analysis

#### Results

Project Requirements

Base scenarios for collaboration

Initial design artifacts in each content WP Second enduser workshop in Larissa and Foggia. Focus on evaluating initial design artifacts

WP1 – WP7
R&D
Focus on
development,
monitoring
and
evaluation

## Results (ongoing)

Scenario design and evaluation

Implementation and integration of artifacts

Monitoring and Evaluation



**Starting point** 

Project

Objectives

## Two representative pilot regions

#### Pilot regions reflect current state in Europe well

- Larissa region
  - NIS sectors focus
  - Medium to high cybersecurity maturity
  - Pre-existing collaborations (e.g. health sector)
  - Driver: European legislation
  - High understanding of benefits of collaboration, and high motivation work together

- Foggia region
  - Industry focus
  - Low technology use and thus low cybersecurity maturity
  - **Driver:** customer demands
  - Reservations about interorganisational collaboration (e.g. competitor rivalry)

## Smart Risk Management for Business Continuity in Critical Infrastructure







This project has received funding from the European Union's Horizon Europe research and innovation programme under grant agreement No 101070455.

**Disclaimer:** Funded by the European Union. Views and opinions expressed are however those of the author(s) only and do not necessarily reflect those of the European Union or European Commission. Neither the European Union nor the European Commission can be held responsible for them.

## The Challenge

Unforeseen **cascading impacts** within critical infrastructures, and inadequate management of business interruptions, leads to **financial losses in the millions** and reputational damage

**Ineffective risk management** due to lack of business awareness results in misguided risk mitigation efforts and diminishes decision-makers' control.

**Lack of standard-based technical security** testing makes training of Business disruption risk managers long and expensive.







#### **RISKM4BC**

RISKM4BC is a dynamic business risk management framework. Designed to offer both design and operational support, this tool is specifically tailored for cascading impact assessment and real-time risk quantification within the chain of Critical Infrastructures (CIs).



Control risks related to **cascading effects** among multiple interrelated Cls.



Prediction of unwanted incidents and risk to meet deadlines in your workflows to mitigate business disruptions.



**Bowtie Smart Center** to automate risk identification and predict threats.



Automated link between business goals and lower-level system risks leveraging LLMs.





## **Technology**

#### **Key technical features:**

- Automated risk likelihood and impact learning.
- Risk propagation through cascading effects calculation.
- Workflow digital twins for workflow execution prediction.
- Live preventive and mitigative action recommendation in natural Language.
- Automated link of business goals with system risks.



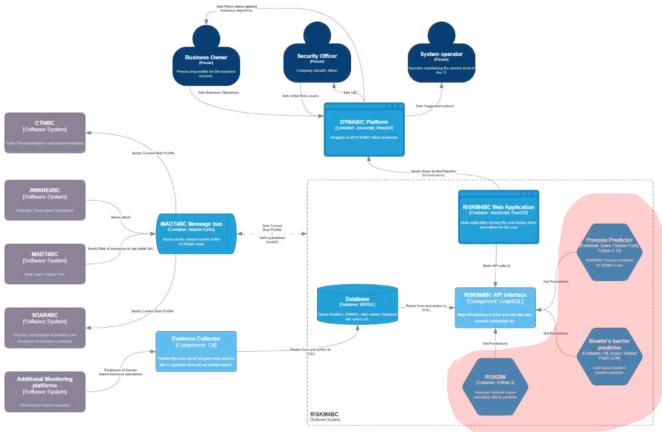
Proprietary predictive AI algorithms (transformers, LSTM, ...)



Advanced use of the latest innovations in generative AI (LLM)

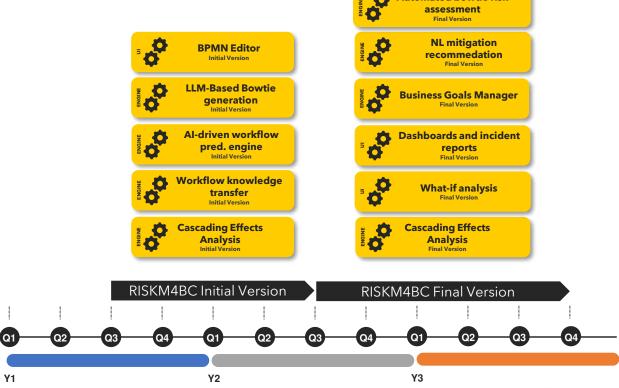


#### **RISKM4BC Context within DYNABIC**





## **Current status and technical roadmap**



**Automated bowtie risk** 

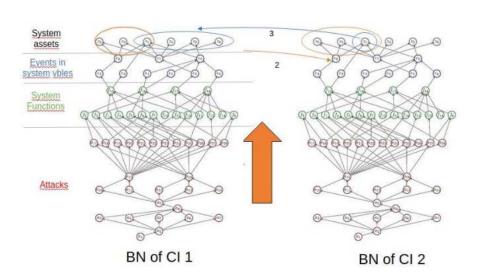






## RISKM4BC Research goals

Research Objective 1: Create a system to control risks related to cascading effects among multiple interrelated Cls.



- Targeting CI interdependencies and Cascading Effects with other CIs.
- High degree of granularity on each CI, effects on different parts on connected CIs.
- Cls do not share their risk models (and live with it)



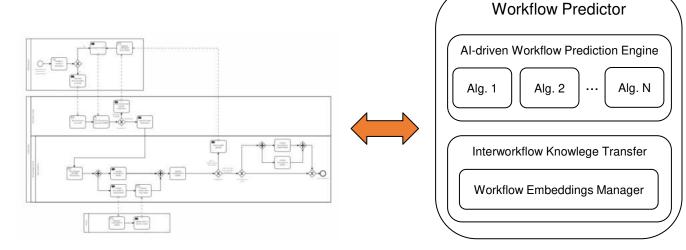


### **RISKM4BC** Research goals

## Research Objective 2: Create a live risk matrix leveraging Al-driven workflow digital twins to predict workflow evolution probability distributions

- Create and compare different Al-driven predictive algorithms to forecast current workflows evolution
- Create an ensemble approach with weighted algorithms

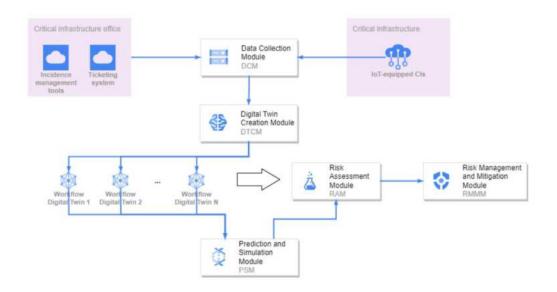
 Enable prediction capacity in non-observed workflows through knowledge transfer from different past observed workflows







## **Continuous Risk Management Concept**

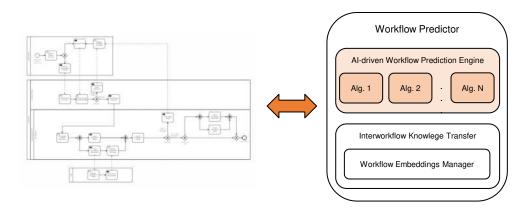






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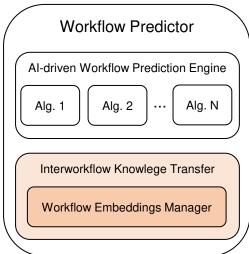


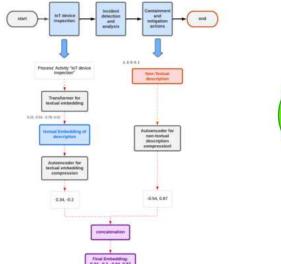


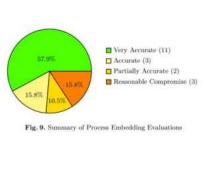


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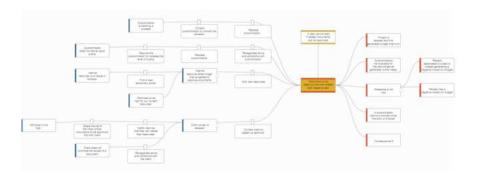








- Create mechanisms to automatically create bowties out of existing workflows, initial textual descriptions or partially defined bowties
- Create a continuous self-learning model to predict bowtie activations
- Enable prediction capacity in non-observed bowties through knowledge transfer from different past observed bowties
- Automated link of business objectives with lower-level bowtie components through LLMs







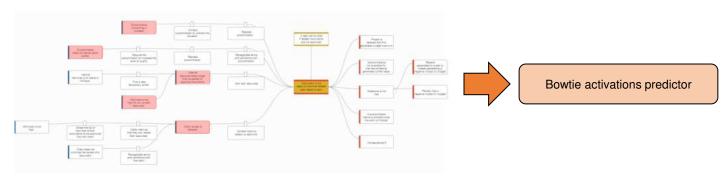
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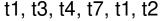






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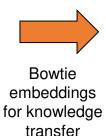


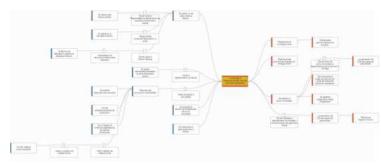




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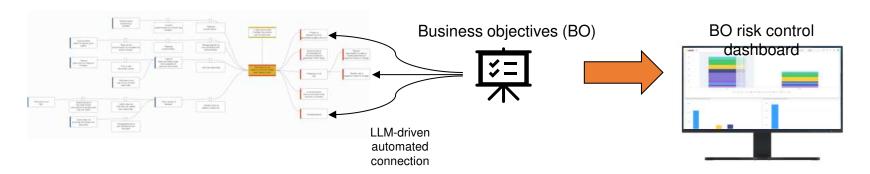








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Insights From
CS-AWARE-NEXT,
DYNABIC,
& AI4CYBER

30 September 2024

16:00 - 17:30



**Online Webinar** 





## AI4CYBER

TRUSTWORTHY ARTIFICIAL INTELLIGENCE FOR CYBERSECURITY REINFORCEMENT AND SYSTEM RESILIENCE

## Trustworthy AI for cybersecurity solutions

Webinar "Al supporting Cyber Risks and Resilience of Critical Infrastructures"

30/09/2024

Erkuden Rios, AI4CYBER Project Manager erkuden.rios@tecnalia.com





This project has received funding from the European Union's Horizon Europe research and innovation programme under grant agreement No 101070450.

AIACYBER

Trustworthy Artificial Intelligence for Cybersecurity Reinforcement and System Resilience

► Grant Agreement ID: 101070450

Project Type: RIA

Project Coordinator: Tecnalia

Consortium: 13 partners

▶ Budget: € 3.998.413,00 €

▶ Start Date: 01/09/2022

Duration: 3 years







# Key objectives

To establish an Ecosystem Framework of next generation Al-based services for supporting critical system developers and operators to efficiently manage system robustness, resilience, and appropriate response in the face of advanced and Al-powered cyberattacks.

01 02 03 04

AI4CYBER **Ecosystem** Framework of nextgeneration trustworthy cybersecurity services.

Al-driven software robustness and security testing services for flaw identification and code fixing automation.

Services for detection and analysis of advanced and Alpowered attacks to prepare the critical systems to be resilient against them.

Mechanisms to optimize the orchestration of security protections, and continuously learn from system status and defences' efficiency.

Ensure European fundamental rights and valuesbased Al technology in AI4CYBER. ensurina explainability. fairness and

security

05

Continuum of care



06

Foster open innovation and business opportunities through demonstration of AI4CYBER services integrated into critical services.













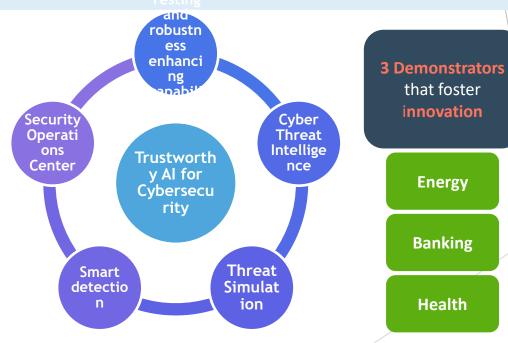




### AI4CYBER in a nutshell

Establishing an **Ecosystem Framework** of next generation **Al-based services** for critical system **robustness**, **resilience**, and appropriate **response in the face of advanced and Al-powered cyberattacks**.

11 Key Results
that cover
6 cybersecurity
areas

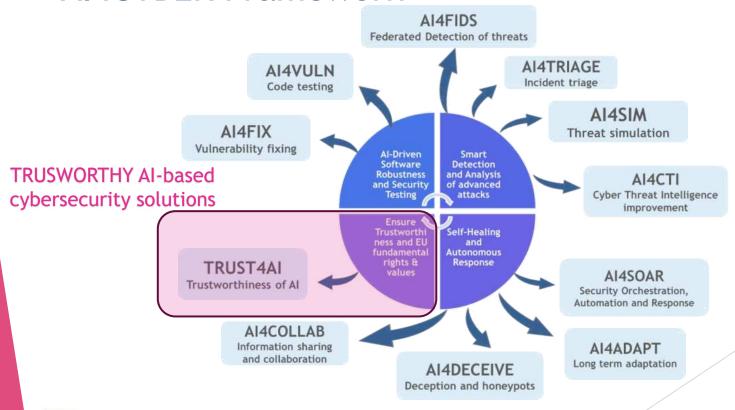




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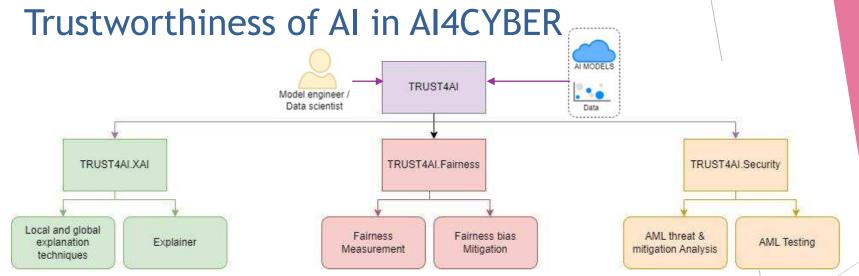
### AI4CYBER Framework





This project has received funding from the European Union's Horizon Europe research and innovation programme under grant agreement No 101070450.





Explainability - XAI (i.e. Interpretability) of ML/AI models, to allow better understanding of the model to the data scientist who develops the ML model or to a potential end-user.

Fairness of the ML/AI models, to allow to correct potential bias against some sensitive attributes or against sub-populations.

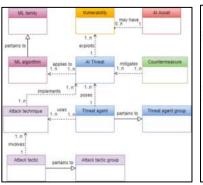
Security of the ML/AI models, to allow to learn potential Adversarial Machine Learning attacks and to protect against them.



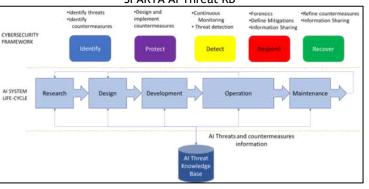


# Al Security landscape

#### AI4CYBER AI Threat model



#### SPARTA AI Threat KB



#### **ETSI SAI**



#### **ENISA**







### MITRE ATLAS

#### ATLAS"



#### NIST AI 100-2e2023 ipd AML taxonomy





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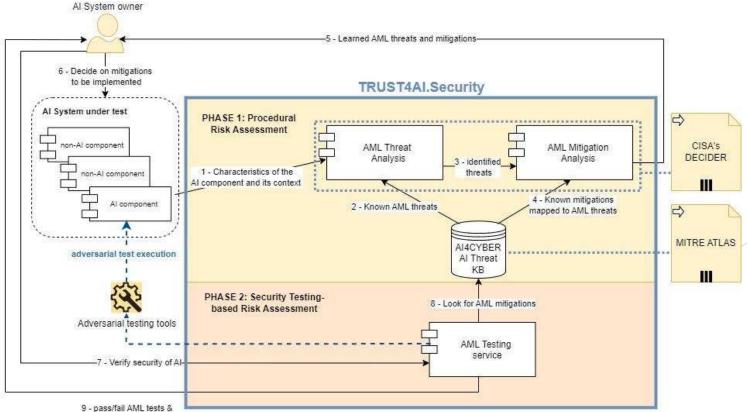
# TRUST4AI. Security Objectives

- Security of Al as part of Robustness of Al.
- Protect models from Adversarial Machine Learning (AML) attacks, including: data protection, poisoning, evasion, and oracle (privacy) attacks.
- ▶ Offer mechanisms for countering attacks to the AI-based cybersecurity tools, e.g., intrusion and anomaly detection tools based on AI models.
- ▶ Builds on top of the *AI Threat and Countermeasure Knowledge Base* from H2020 SPARTA project and MITRE ATLAS.
- ► Leverages CISA's Decider tool.





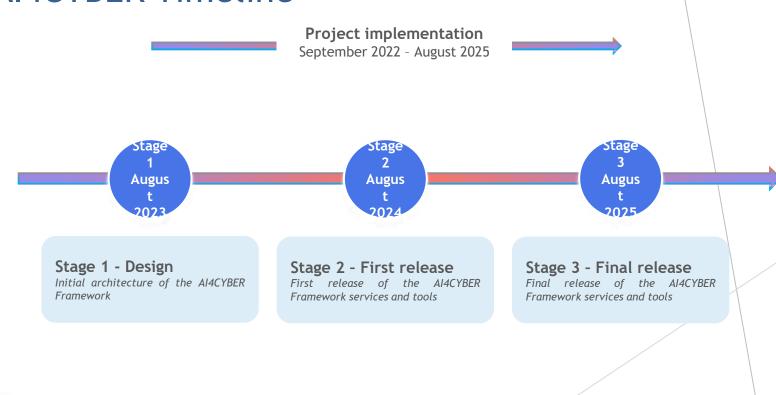
# Al system risk assessment with TRUST4AI.Security







### **AI4CYBER Timeline**





# **TRUST4AI** publications

- Kurek, W., Pawlicki, M., Pawlicka, A., Kozik, R., & Choraś, M. (2023, July). Explainable Artificial Intelligence 101: Techniques, Applications and Challenges. In International Conference on Intelligent Computing (pp. 310-318). Singapore: Springer Nature Singapore (SPRINGER LNCS).
- Pawlicki, M.: Towards Quality Measures for xAI algorithms: Explanation Stability, DSAA2023 (CORE A)
- Pawlicki, M., Pawlicka, A., Śrutek, M., Kozik, R., Choraś, M. Interpreting Intrusions The Role of Explainability in Albased Intrusion Detection Systems (IP&C 2023)
- Thouvenot V., Huynh C.B. **TSCFKit and CFKit, two Python modules dedicated to counterfactual generation**, JDS 2023.
- Dr. Marek Pawlicki panelist in CLAIRE AQuA: Cybersecurity of AI and AI for Cybersecurity. (https://www.youtube.com/watch?v=u44CiZhkbnY)
- Prof. Michał Choraś keynote on "Trustworthy and Explainable AI (xAI) in Emerging Network Security Applications" in ARES2023 (https://www.ares-conference.eu/workshops-eu-symposium/ens-2023/)
- Uccello, F., Pawlicki, M., D'Antonio, S., Kozik, R., & Choraś, M. (2024, April). A Novel Approach to the Use of Explainability to Mine Network Intrusion Detection Rules. In Asian Conference on Intelligent Information and Database Systems (pp. 70-81). Singapore: Springer Nature Singapore.
- Pawlicki, M., Puchalski, D., Szelest, S., Pawlicka, A., Kozik, R., & Choraś, M. (2024, July). Introducing a Multi-Perspective xAl Tool for Better Model Explainability. In Proc. of the 19th International Conference on Availability, Reliability and Security (pp. 1-8).
- Kozik, R., Kątek, G., Gackowska, M., Kula, S., Komorniczak, J., Ksieniewicz, P., ... & Choraś, M. (2024). Towards explainable fake news detection and automated content credibility assessment: Polish internet and digital media use-case. *Neurocomputing*, 608, 128450.



### **TRUST4AI** publications

- Pawlicki, M. (2024). ARIA, HaRIA and GeRIA: Novel Metrics for Pre-Model Interpretability. IEEE Access.
- Nguyen, M. D., Bouaziz, A., Valdes, V., Rosa Cavalli, A., Mallouli, W., & Montes De Oca, E. (2023, August). A deep learning anomaly detection framework with explainability and robustness. In Proc. of the 18th International Conference on Availability, Reliability and Security (pp. 1-7).
- Asimopoulos, D. C., Radoglou-Grammatikis, P., Makris, I., Mladenov, V., Psannis, K. E., Goudos, S., & Sarigiannidis, P. (2023, August). Breaching the defense: Investigating fgsm and ctgan adversarial attacks on IEC 60870-5-104 Al-enabled intrusion detection systems. In Proc. of the 18th International Conference on Availability, Reliability and Security (pp. 1-8).
- Villarini, B., Radoglou-Grammatikis, P., Lagkas, T., Sarigiannidis, P., & Argyriou, V. (2023, July). **Detection of Physical Adversarial Attacks on Traffic Signs for Autonomous Vehicles**. In 2023 IEEE International Conference on Industry 4.0, Artificial Intelligence, and Communications Technology (IAICT) (pp. 31-37).
- Bouaziz, A., Nguyen, M. D., Valdés, V., Cavalli, A. R., & Mallouli, W. (2023, July). Study on Adversarial Attacks
  Techniques, Learning Methods and Countermeasures: Application to Anomaly Detection. In ICSOFT (pp. 510-517).
- Iturbe, E., Rios, E., & Toledo, N. (2023, December). **Towards trustworthy Artificial Intelligence: Security risk assessment methodology for Artificial Intelligence systems.** In 2023 IEEE International Conference on Cloud Computing Technology and Science (CloudCom) (pp. 291-297).
- Blog post "Trustworthy AI" General overview of TRUST4AI <a href="https://ai4cyber.eu/?p=1136">https://ai4cyber.eu/?p=1136</a>







# AI4CYBER

### TRUSTWORTHY ARTIFICIAL INTELLIGENCE FOR CYBERSECURITY REINFORCEMENT AND SYSTEM RESILIENCE



https://ai4cyber.eu/



Erkuden Rios



https://x.com/Ai4Cyber



AI4CYBER Project Coordinator



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### Thank you for your attention!







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Insights From CS-AWARE-NEXT, DYNABIC, SAI4CYBER

**Online Webinar** 

30 September 2024

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