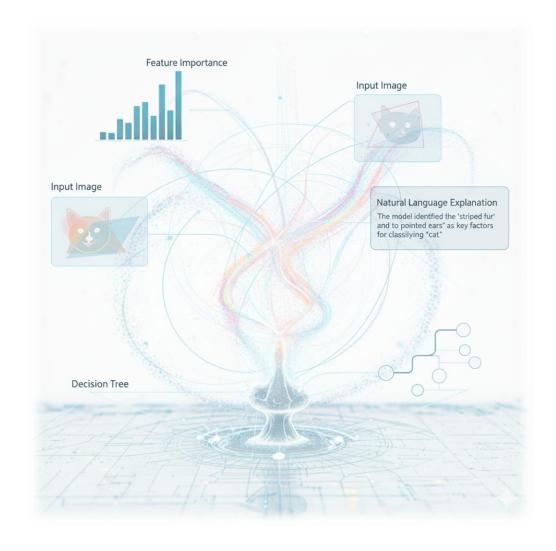


# XABPs: Towards eXplainable Autonomous Business Processes

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- Background and Motivation
- Conceptual Model for XABPs
- Challenges
- Conclusion





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# Ideation @ Dagstuhl

Dagstuhl Seminar 25192

**AUTOBIZ: Pushing the Boundaries of AI-Driven Process Execution and Adaptation** 

May 04 – May 09, 2025

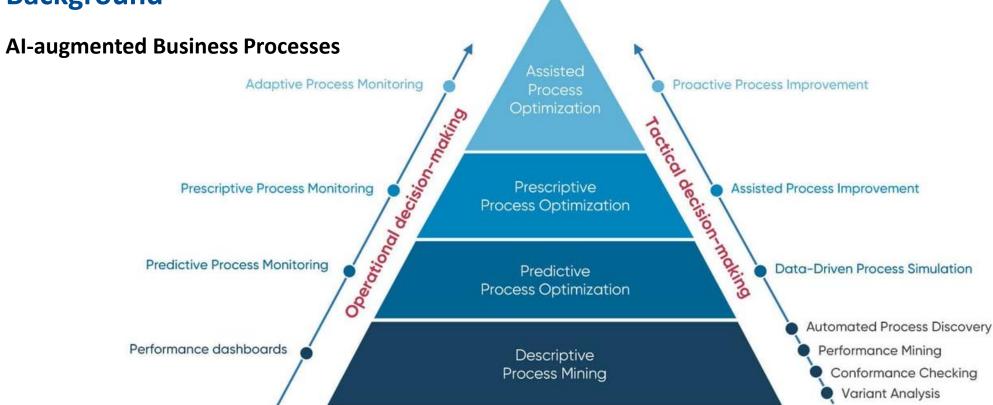
https://www.dagstuhl.de/25192











**Autonomous** business processes := next generation of AI-Augmented business processes

- Self-executing, (pro)active, agentic, ...
- Leveraging advanced AI/ML
- Operate with minimal to no human intervention

https://apromore.com/blog/enhancing-operational-excellence-with-augmented-business-process-management





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# Why Explainability?





"Responsible systems EU agenda" centers on creating sustainable and digital future ensuring systems are environmentally friendly, socially fair, and driven by trustworthy AI





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# Why Explainability?





"Responsible systems EU agenda" centers on creating sustainable and digital future ensuring systems are environmentally friendly, socially fair, and driven by trustworthy AI

# **Concerns of ABPs:**

#### Decreased Stakeholder Trust:

 Users, owners, customers may be hesitant to rely on Al-driven decisions they cannot understand

#### Bias:

 ABPs may perpetuate hidden biases of underlying AI/ML components, leading to discriminatory outcomes

# Regulatory Compliance:

Demonstrating compliance with acts like GDPR or the EU AI Act requires transparency

## Hindered Accountability:

If ABP causes unfair outcome, challenging to assign responsibility or implement corrective actions

[Kubrak et al. 2024 @ BPM: https://doi.org/10.1007/978-3-031-70396-6\_23]

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## Why Explainability?

## **Concerns of ABPs:**

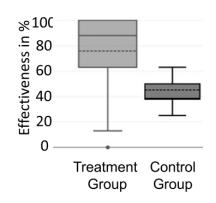
## Missed Efficiency Gains:

- Humans can perform their tasks / collaboration with Al better if provided with Al rationale
- Example: Proactive Adaptation of Software Systems [Metzger et al. 2024 @ ACM TAAS]

# Difficulty in Debugging:

 Opacity makes it hard to identify failures or understand why a process is underperforming

→ Need for **eXplainable**ABPs (XABPs)







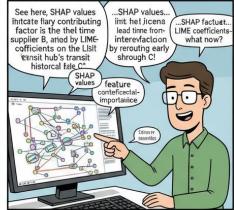
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#### Limitations of State of the Art in XAI

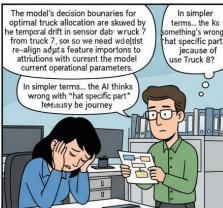
# XAI techniques are not enough!

- Inability to express business process model constraints
- Failure to capture the richness of contextual situations that affect process outcomes
- Inability to reflect causal execution dependencies among activities in the business process
- Explanations are often nonsensical or not interpretable for human users in a process context













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**Core Concepts** 

**Explainee** "Whom is it

explained to?"



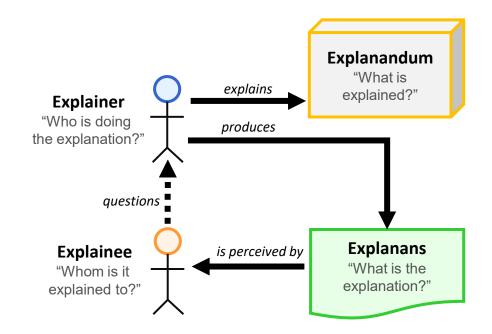
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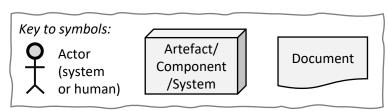


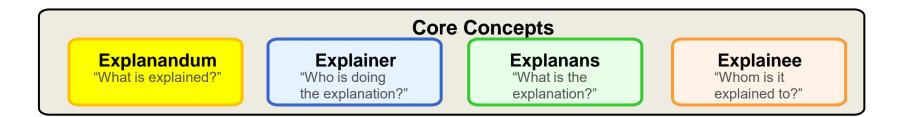
**Explainer** "Who is doing

the explanation?"

**Explanans** "What is the explanation?"



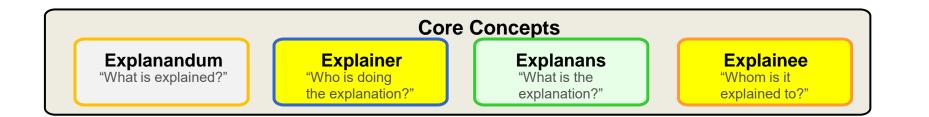






In XABPs, we must explain more than just the AI model:

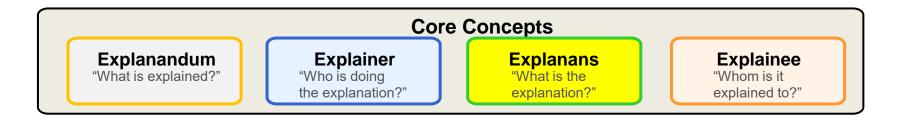
- Al Component: "Why did the Al make this recommendation?" (Traditional XAI)
  - Example: "Why was an alarm raised for process event e1?"
- Process Instance: "Why did this specific execution follow this path?"
  - Example: "Why was this loan application rejected by the process?"
- Process Model: "Why is the process structured this way?"
  - Example: "Why do we have a credit history check as a decision point?"
- Framed Autonomy Constraints: "Why is the system allowed to behave this way?"
  - Example: "Why can the AI act without a human in the loop?"





# Explanations in XABPs involve a wide range of actors, both human and systemic

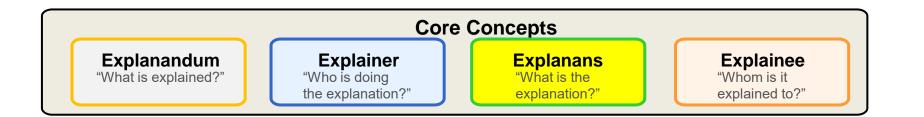
- Explainers (Who provides explanations?)
  - System Actors: AI Models/Agents, Monitoring Components, Connected Systems
  - Human Actors: Domain Experts, Supervisors, Trainers, Annotators
- Explainees (Who consumes explanations?)
  - Human Actors: End Users, Process Participants, Process Managers, Business Analysts, Compliance Officers
  - System Actors: The System Itself (for self-reflection), Connected Systems, other AI Agents





Explanans describes the "how" of the explanation, including its mechanism and timing:

- **Explanation Mechanism:** The technique used to generate the explanation
  - Feature Attribution: (e.g., SHAP, LIME)
  - Example-Based: (e.g., Prototypes, Counterfactuals)
  - Rule-Based: (e.g., Decision Trees)
  - Model Simplification: (e.g., Surrogate Models)
- **Time of Generation:** When the explanation is produced
  - Ex-ante: Before execution (to validate models)
  - Run-time: During execution (for human-in-the-loop oversight)
  - Post-hoc: After execution (for auditing or debugging)





The delivery and assessment of explanation are also part of Explanans.

- Presentation Format: How the explanation is delivered to the explainee
  - Visual: Heatmaps, charts, dashboards
  - Verbal: Natural-language output, written rules, factual/counterfactual statements
- Interaction Mode: How the user interacts with the explanation
  - One-shot: Provided once, passively
  - Conversational: Interactive, iterative dialogue
- Explanation Quality: How the explanation is assessed
  - Technical Quality: Fidelity (accuracy), stability
  - User-centric Quality: Usefulness, meaningfulness, relevance

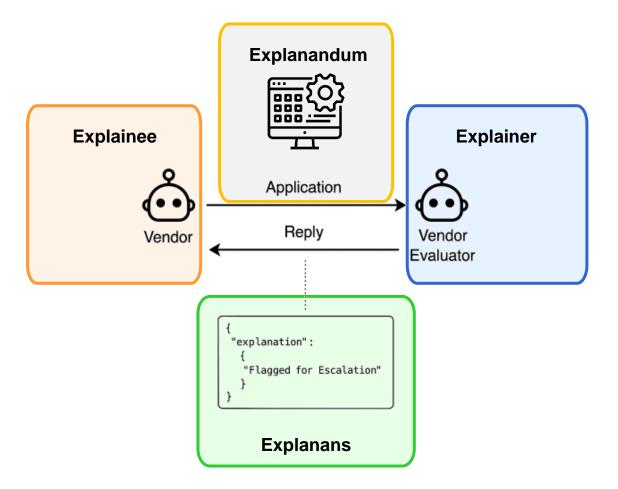


# **Example**



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Agentic BPM system for vendor procurement



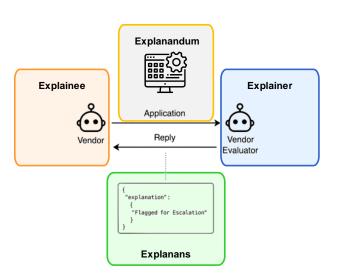


# **Example**



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Agentic BPM system for vendor procurement



```
"vendor": "Vendor D (GreenBox Logistics)",
"total_score": 4.05,
"threshold": 5.0,
"status": "Flagged for Escalation",
"explanandum": "Why did Vendor D receive an overall evaluation score below the acceptance threshold?",
"explanans":
  "technical_compliance": { "score": 3, "justification": ["No ISO cert", "No GDPR", "Unspecified hosting region"] },
  "delivery timeline": { "score": 4, "justification": ["14-month timeline", "No mitigation plan"] },
  "price competitiveness": { "score": 5, "justification": ["High cost", "No added value"] },
  "vendor reputation": { "score": 4, "justification": ["Few references", "Early termination in 2022"] }
"explainability": {
  "techniques_used": ["causal-inference", "SHAP-style"],
  "causal counterfactual": {
   "description": "Adding compliance would improve score to 6.3.",
    "predicted score": 6.3
  "feature contributions": { "technical compliance": -2.25, "delivery timeline": -1.25 },
  "contribution_summary": "Compliance and timeline account for 87% of score gap."
"recommendation": {
 "summary": "Do not proceed without major revisions.",
  "required_improvements": ["Add ISO certification", "Specify hosting", "Shorten timeline"]
```





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# **Identified Research Challenges**



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## **Explainee:**

 How to effectively capture, specify, and resolve conflicts in user preferences for explanations (e.g., detail vs. conciseness)?

### **Explanandum:**

• What is the full taxonomy of explanation subjects needed for ABPs, beyond AI models (e.g., process instances, autonomy constraints)?

## **Explainer:**

 What new techniques are needed to generate explanations that account for causality and process-specific constraints?



# **Identified Research Challenges**



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## **Explanans:**

- How to identify and communicate true causal explanations versus spurious correlations?
- How should explanations evolve over time based on new feedback or changing contexts (e.g., sensor data drift)?
- How to articulate actionable explanations (especially to other agents) that preserve autonomy and enable corrective action?
- How can we generate explanations for why certain behaviors did not occur?



# **Identified Research Challenges**



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## Overarching:

- How do we assess explanation quality, balancing objective metrics (e.g., accuracy) with user-centric metrics (e.g., usefulness, actionability)?
- What benchmark datasets are needed to evaluate and compare XABP systems?
- How can we provide transparency without revealing privacy-sensitive information or businesscritical intellectual property?





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## Conclusion



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**The Situation:** Autonomous Business Processes (ABPs) are a paradigm shift for BPM, but introduce significant risks related to trust, accountability, bias, and compliance

**Our Proposal:** We introduce the concept of eXplainable ABPs (XABPs), which can articulate the rationale behind their actions

#### **Our Contributions:**

- Conceptual Explainability model tailored for the BPM context
- Illustrative example using an Agentic BPM system
- Set of key research challenges to guide future work

The Path Forward: XAI techniques are insufficient

→ Process-aware explainability research needed

