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SAFETY 4.0: AI-Driven Ship Safety Management System

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What is Safety 4.0?

- A new generation of workplace safety and health management systems deploying Industry 4.0 technologies
- Proactive, predictive approach by using technologies to identify risks and create a safe and healthy work environment

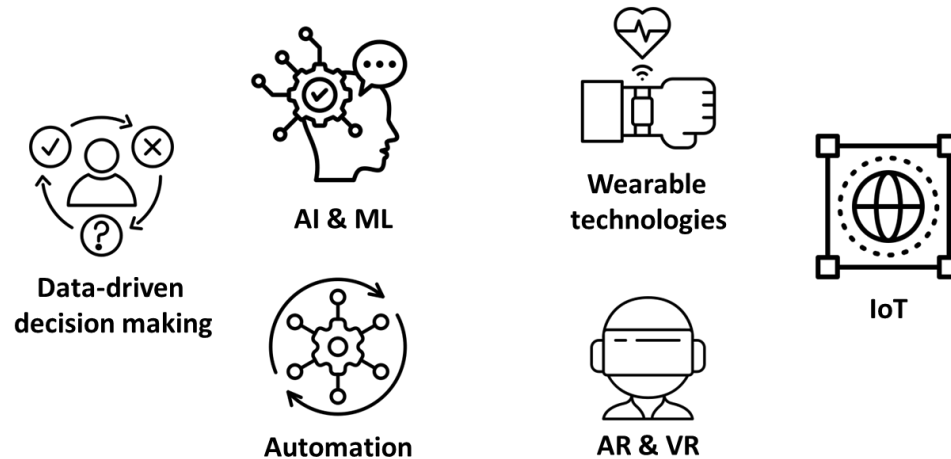


Figure 1. Principles of Safety 4.0

What is Safety 4.0?

- Developing Safety 4.0 technologies for **shipboard operations** is now feasible with the following enablers:



Automation, wearable technologies & digitalisation

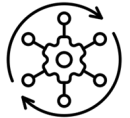


Extensive maritime safety & health data in digital format

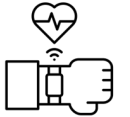


Advancement in AI methodologies & risk analytics

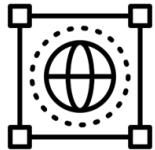
Technology Scan of Safety 4.0 Tools



Automation



Wearable technologies

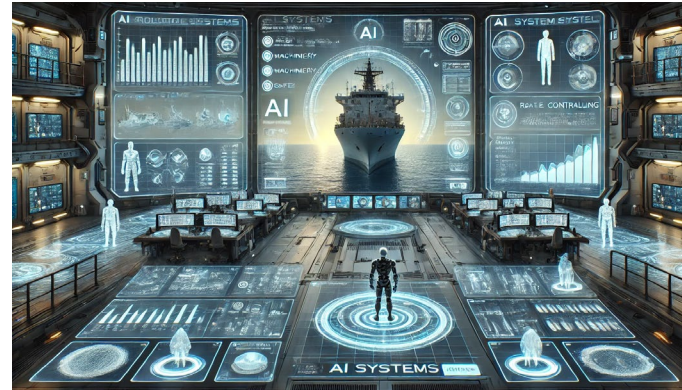
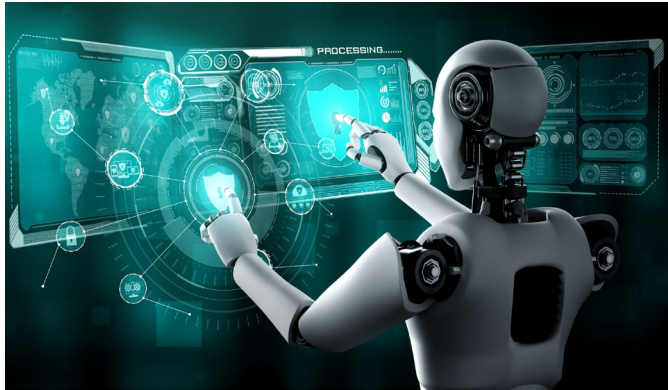


IoT

**State-of-the-art Digital Safety Management System
(SOL-X by MagellanX)**

Project Goal

- Support decision-making by integrating AI capabilities into digital safety management systems to (1) identify, monitor and assess safety and health risks in real-time and (2) recommend suitable risk control measures



Illustrations of AI managing risks in shipboard operations

Conditions for AI Implementation

1. Defined Goals & Use Case: What *should* AI monitor and control?

- *Risk Identification*: What key risks are currently faced by the ship and each seafarer?
- *Risk Assessment*: What is the combined likelihood and consequence of each identified risk?
- *Risk Control*: What measures can be implemented to manage high-risk events?

2. Overcoming Constraints: What *can* AI monitor and control?

- *Data Availability & Quality*: Are there relevant and useful data supporting the monitoring, identification, and assessment of risks? If not, are there proxies for these data?
- *Ethical and Regulatory Considerations*: Are the AI-generated recommendations fair, unbiased, and compliant with existing regulatory frameworks?
- *System Integration & User Centric Design*: Can AI integrate smoothly with existing data infrastructure and workflows? Is the interface user-friendly and transparent?

A Hybrid Decision Support System

- A hybrid decision support system (DSS) is designed by (1) developing a predefined set of expert rules (i.e., logic-based algorithms) and (2) learning from historical data (i.e., data-driven algorithms)



Rule-based DSS



Knowledge based: Relies on domain knowledge from occupational health and safety experts to specify risks



Rule-based logic: Mimics human decision-making process using 'if-then' rules to diagnose or predict risks



Predefined scenarios: Limited by the rules preestablished by experts; incapable of adapting to new scenarios



Learning-based DSS



Data-driven: Relies on datasets from incident and accident records, risk probabilities, medical history and meta-analysis to specify risks



Predictive analytics: Assesses and predicts risks based on learned patterns through supervised and unsupervised learning



Data availability and ambiguity: Limited by availability and quality of data, and challenges with black boxes

A Hybrid Decision Support System

1. Risk Identification:



Ship Safety Index



Crew Wellbeing Index

Primary Indicators:



Secondary Indicators:

12

31

Tertiary Indicators:

51

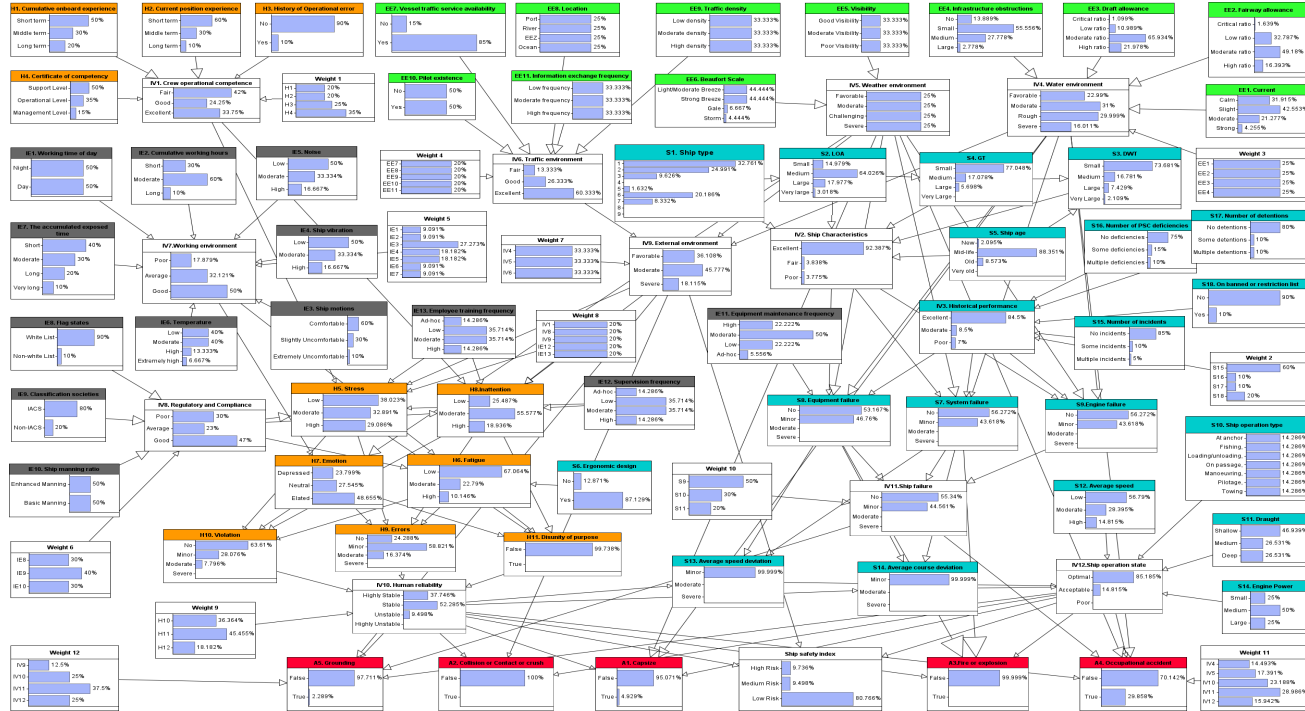
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Static & Dynamic

Lagging & Leading

A Hybrid Decision Support System

2. Risk Assessment and Scoring:



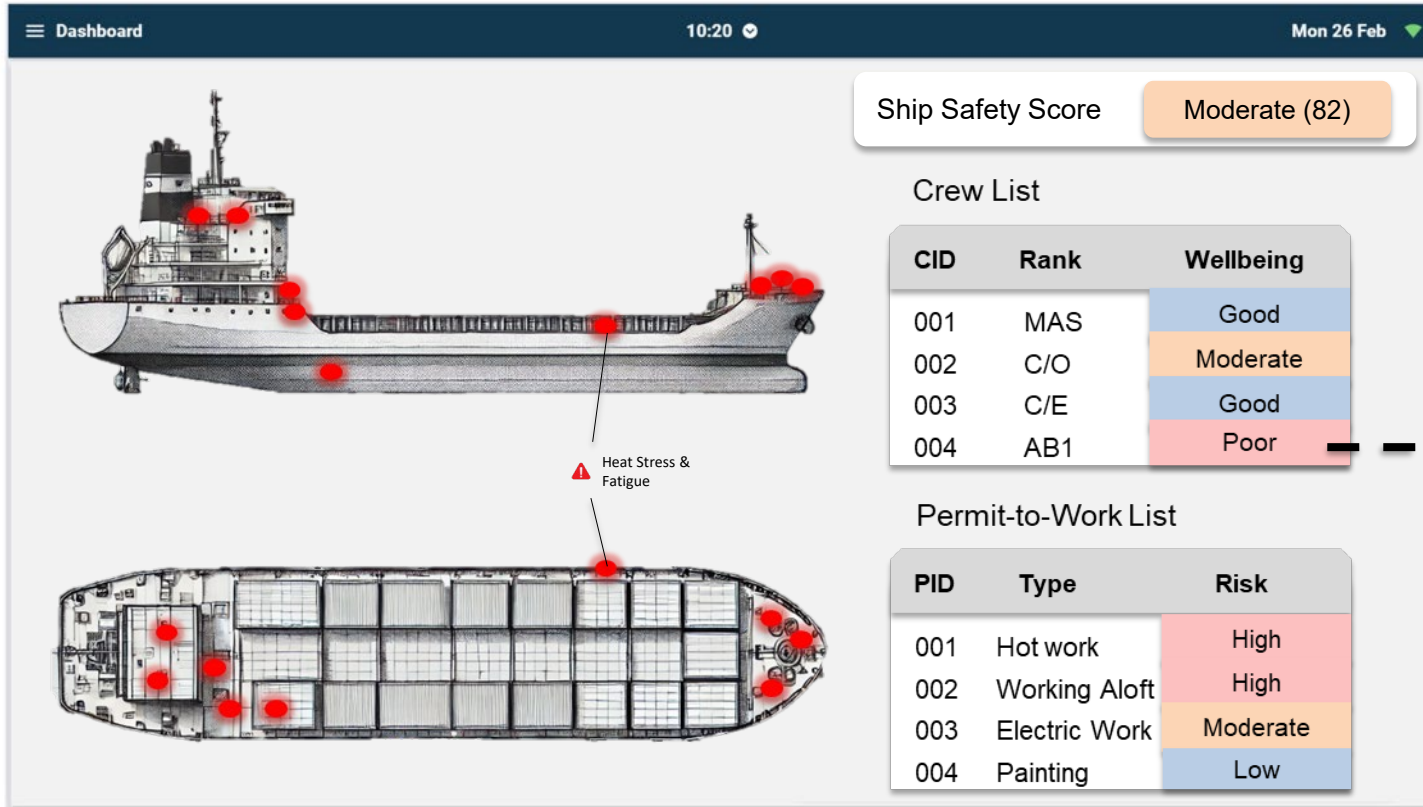
Bayesian Network Model for Ship Safety

A Hybrid Decision Support System

3. Immediate Risk Control & Long-term Continuous Improvement:

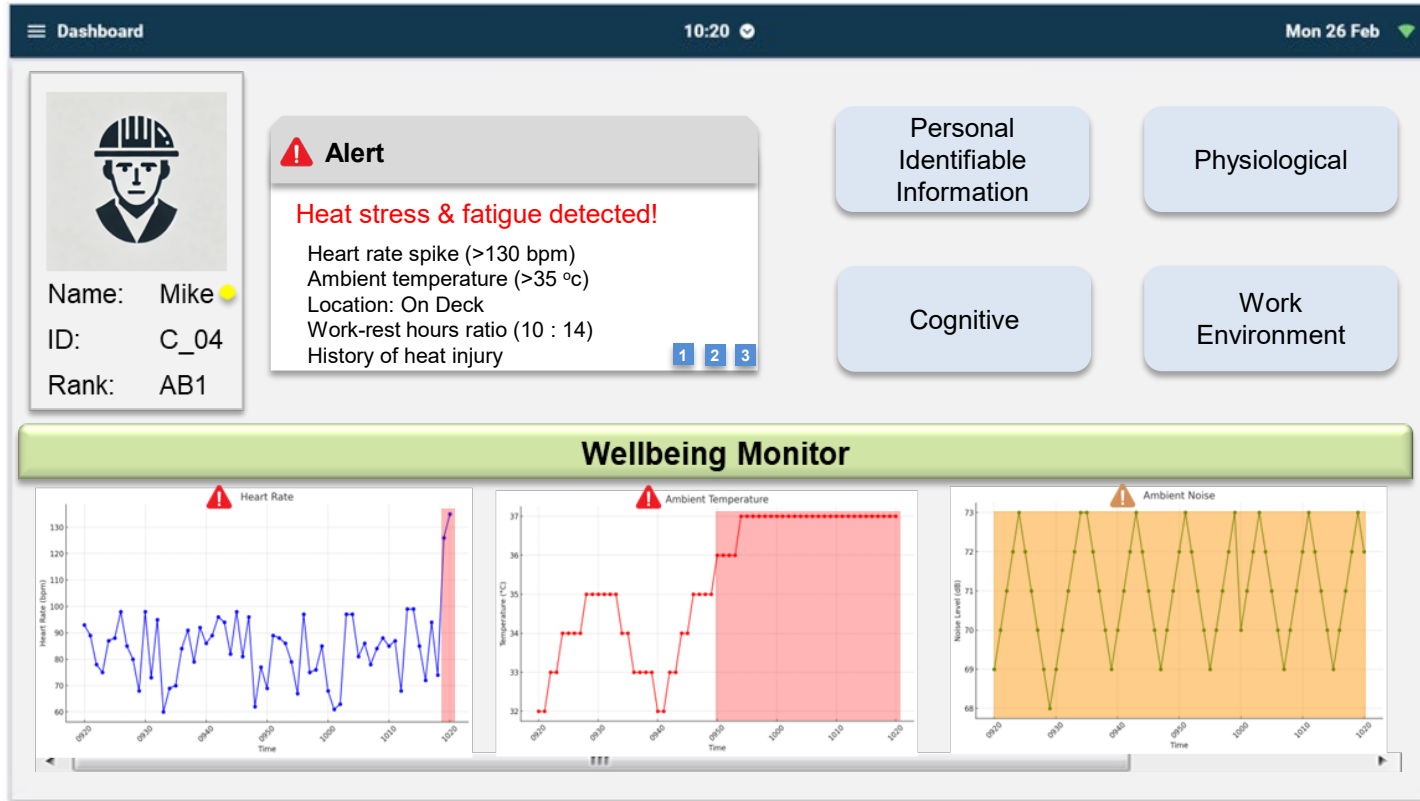
- Real time scoring and identification of critical nodes (i.e., risk indicators) that contribute to *immediate* risk
 - Identify and simulate interventions that can control immediate, critical risk
 - Send prompts and interventions to users
- Recommend best practices to management and operations to address persistent, long-term risk to improve ship safety score

A Hybrid Decision Support System



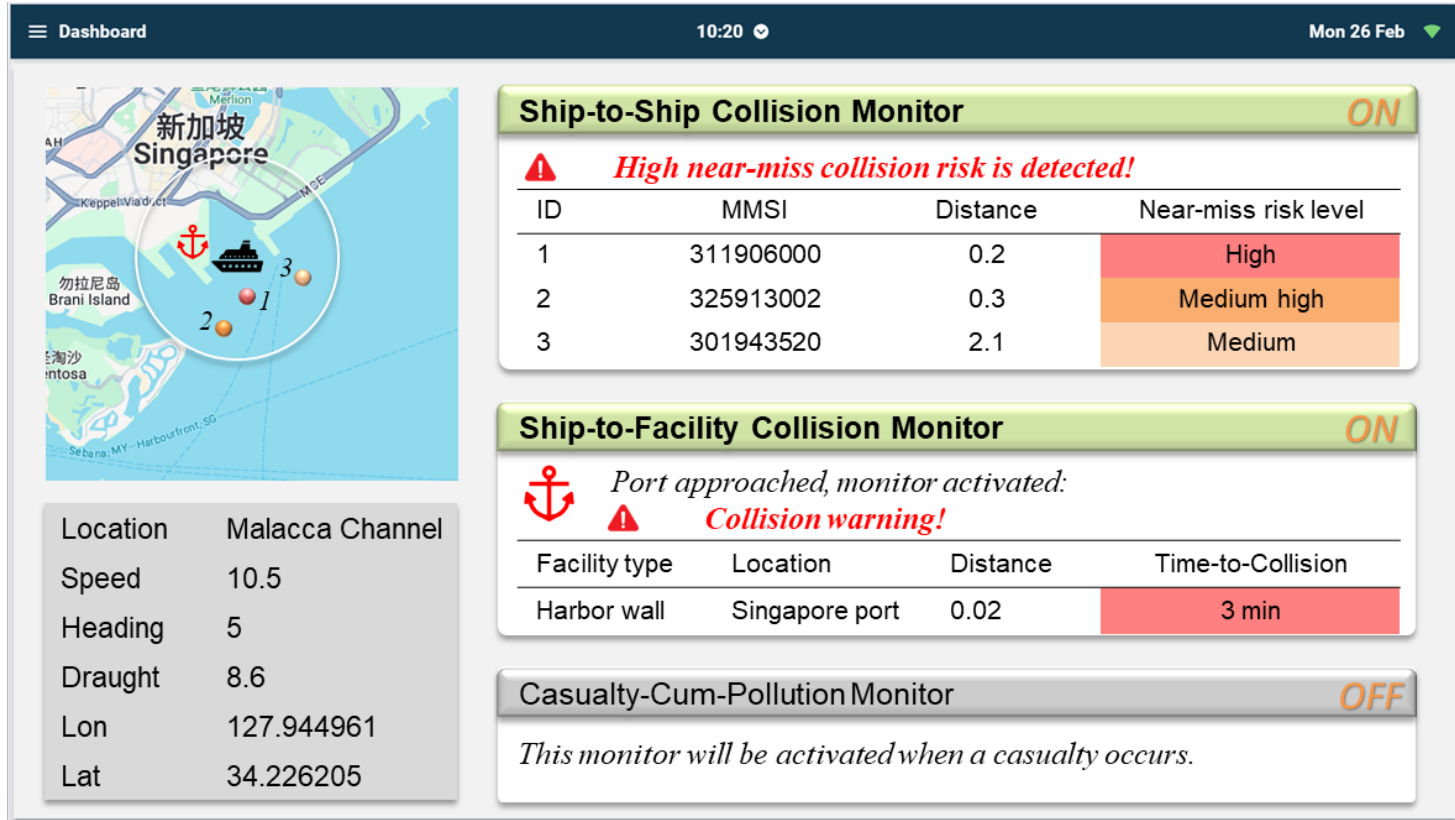
Immediate Risk Detection and Intervention (Illustration)

A Hybrid Decision Support System



Immediate Risk Detection and Intervention (Illustration)

A Hybrid Decision Support System



Immediate Risk Detection and Intervention (Illustration)



Outcomes

- **Enhanced safety and well-being:** Real-time risk assessment and prediction of hazards and risks
- **Cost savings:** Risk management models help avoid incidents that could result in costly repairs, downtime, loss of cargo
- **Increased crew confidence:** Real-time risk assessment tools can increase crew confidence in their own safety and the safety of the ship
- **Scalability:** Solution has potential applications on other industries or sectors (e.g., oil and gas, tunnelling, construction or mining)

Collaborators



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Thank You

