



TECHNISCHE  
UNIVERSITÄT  
WIEN



INSTITUTE OF  
MANAGEMENT SCIENCE  
Research Group of Production and  
Maintenance Management

# Knowledge Management 4.0

Priv.-Doz. Dr.-Ing. Fazel Ansari

May 2, 2023

## Overview of the Course

Lecture (VO) and Exercise (UE)

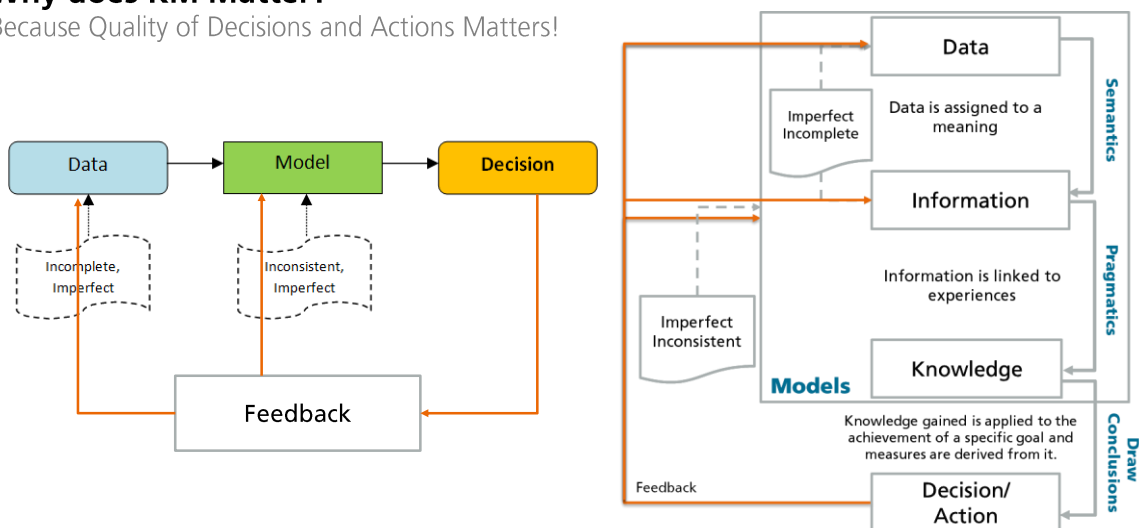


Date	Place	Topic
07.03	Bombardier Hörsaal + HS 2	<ul style="list-style-type: none"> <li>Introduction to the course</li> <li>What is a CPPS?</li> </ul>
14.03	Bombardier Hörsaal + HS 2	<ul style="list-style-type: none"> <li>CPPS &amp; Digital Twin in Industry 4.0</li> <li>Smart Factory concept including CRISP DM</li> </ul>
21.03	Bombardier Hörsaal + HS 2	<ul style="list-style-type: none"> <li>Introduction to Exercise</li> <li>Exercise 1: Introduction to IDS</li> </ul>
28.03	Bombardier Hörsaal + HS 2	<ul style="list-style-type: none"> <li>Exercise 2: Advanced IDS</li> </ul>
18.04	Bombardier Hörsaal + HS 2	<ul style="list-style-type: none"> <li>Introduction to Industrial AI and Technical Language Processing</li> </ul>
25.04	Bombardier Hörsaal + HS 2	<ul style="list-style-type: none"> <li>Knowledge Management 4.0: Theories and Foundation</li> </ul>
02.05	Bombardier Hörsaal + HS 2	<ul style="list-style-type: none"> <li>Knowledge-Based Maintenance</li> </ul>
09.05	Bombardier Hörsaal + HS 2	<ul style="list-style-type: none"> <li>Knowledge Representation (Ontologies/Knowledge Graph + Industry Project)</li> </ul>
16.05	Bombardier Hörsaal + HS 2	<ul style="list-style-type: none"> <li>Expert Talk</li> <li>Exercise Session III: Industrial Data Science Project with CRISP methodology</li> </ul>
23.05	Bombardier Hörsaal + HS 2	<ul style="list-style-type: none"> <li>Exercise Session IV: Applied Artificial Intelligence in Industrial Data Science &amp; Ontology Modelling with Protégé</li> </ul>
06.06		

# LAST WEEK...

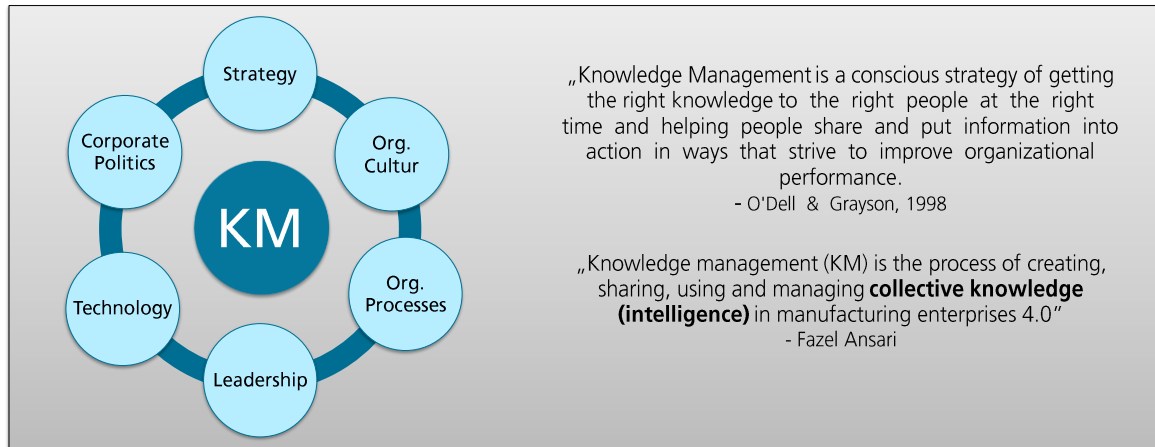
## Why does KM Matter?

Because Quality of Decisions and Actions Matters!



## Definition of Knowledge Management

### Summary



F. Ansari, Knowledge Management 4.0: Theoretical and Practical Considerations in Cyber Physical Production Systems, 9th IFAC Conference on Manufacturing Modelling, Management and Control, Berlin, 28-30 August, 2019

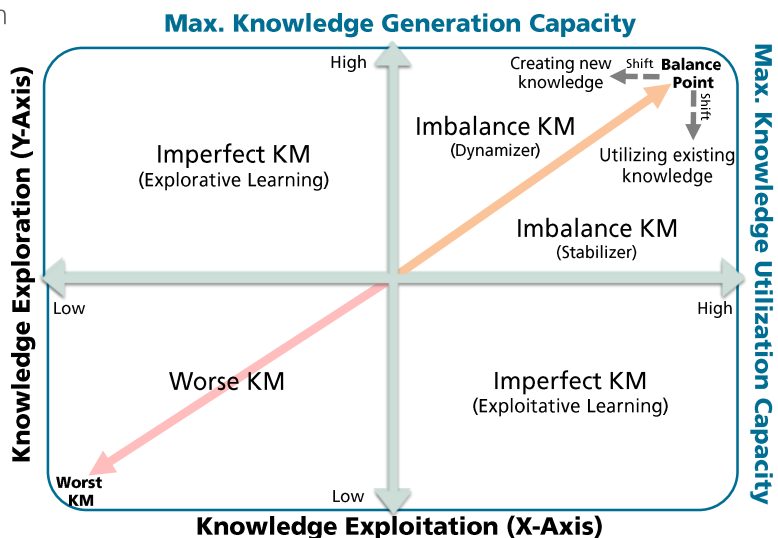
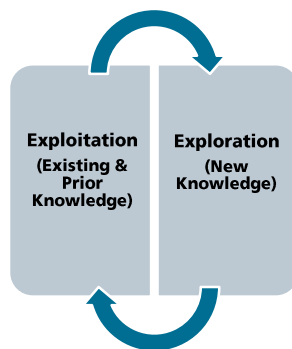
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## Portfolio Matrix for Characterization of KM4.0 as Dynamizer and Stabilizer!

### K-Exploitation and K-Exploration

KM 4.0 is the process of creating, sharing, using, managing and protecting **human-machine collective knowledge intelligence** in smart manufacturing enterprises



Ansari, F. (2019). Knowledge Management 4.0: Theoretical and Practical Considerations in Cyber Physical Production Systems, IFAC-PapersOnLine, Vol. 52, Issue: 13, pp. 1597-1602.

02.05.2023

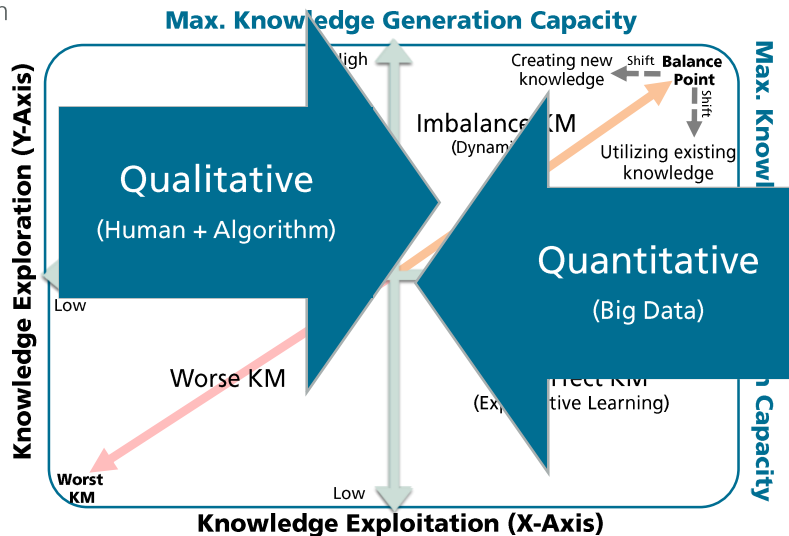
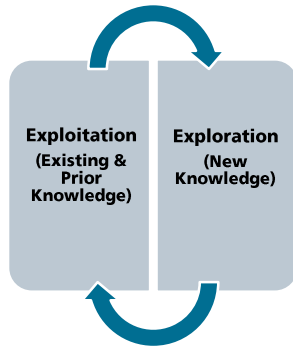
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## Portfolio Matrix for Characterization of KM4.0 as Dynamizer and Stabilizer!

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# Question of the day

## WHAT IS KNOWLEDGE-BASED MAINTENANCE?

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## 1) Theoretical Foundations

**KNOWLEDGE-BASED MAINTENANCE (KBM)****Data-driven Analysis and Modeling of RAM in Product Lifecycle Management**

How OEMs and Machine Users May Gain Benefits from Data?

**Reliability and durability** to comply with specifications over useful life time.

**Availability (Uptime)** to be able to perform required functions at time  $t$ ,  $A(t)$ , or over a stated period of time,  $A_{av}$ .

**Products (Complex Industrial Systems)** are **used** under various environmental and operational conditions in industrial value chains.



CNC-Lathe S45 © EMCO



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Industrial Furnace Copyright © AICHELIN

**Intelligent functions in products, processes, systems and services by analysis and modeling of**  
**RAM (t)\***

\*RAM (Reliability, Availability, Maintainability)

**Maintainability** to be timely and efficiently retained in, or restored to a required functional state, after performing maintenance actions.

**Integrative modeling and analysis**

Reliability	Maintainability	Availability
↔ Constant	↓ Decreases	↓ Decreases
↔ Constant	↑ Increases	↑ Increases
↑ Increases	↔ Constant	↑ Increases
↓ Decreases	↔ Constant	↓ Decreases

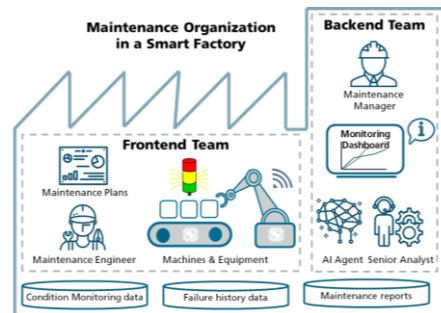
**OEM:** Original Equipment Manufacturer

## Maintenance in Smart Factories

### Frontend- and Backend Maintenance Team

- According to DIN 31051 and DIN EN 13306, maintenance is a **combination** of technical, administrative and management activities including supervision actions for keeping a **desired functional status** of an observation unit (a system/machine) during its **life cycle** i.e. retain in or restore it to the required functional state **before or after** occurrence of a **failure**.
- Maintenance activities can be classified in to two categories of **"Operation/Engineering"** and **"Management"**, which leads to creation of **frontend-** and **backend teams**.
  - **Frontend team** focuses on **proper implementation** of maintenance programs, monitoring, gathering and documenting data by means of information systems.
  - **Backend team** focuses on **planning, monitoring and controlling** of maintenance activities, establishing policies, strategies, assessing the attainment of (operational and cost) objectives and accordingly (re)formulating improvement strategies as a continuous improvement process!

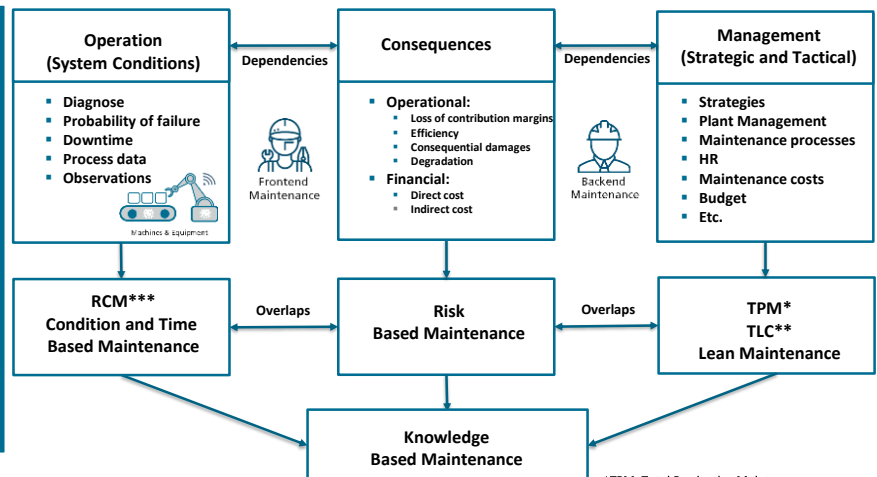
**Both frontend and backend teams hold experiential knowledge, generate data and need reliable information for their actions and decisions!**



## Knowledge-Based Maintenance

### Integrative Modeling and Analysis of RAM, based on Data and Human Experiences

- ✓ The concept of knowledge-based maintenance was coined by Pawellek 2013, however, in a holistic, generic way focusing on Organizational Learning theories.
- ✓ In (Ansari et al., 2019) this concept has been extended.
- ✓ KBM aims at **integrative analysis of RAM** considering multiple data sources, influential factors and their interrelations and thus gaining comprehensive knowledge of maintenance for improving quality of decision-making.



G. Pawellek, Integrierte Instandhaltung und Ersatzteillistik: Vorgehensweisen, Methoden, Tools. Springer-Verlag, 2013.

F. Ansari, R. Glawar, & T. Nemeth, PriMa: a prescriptive maintenance model for cyber-physical production systems, International Journal of Computer Integrated Manufacturing, 2019.

\*TPM: Total Productive Maintenance

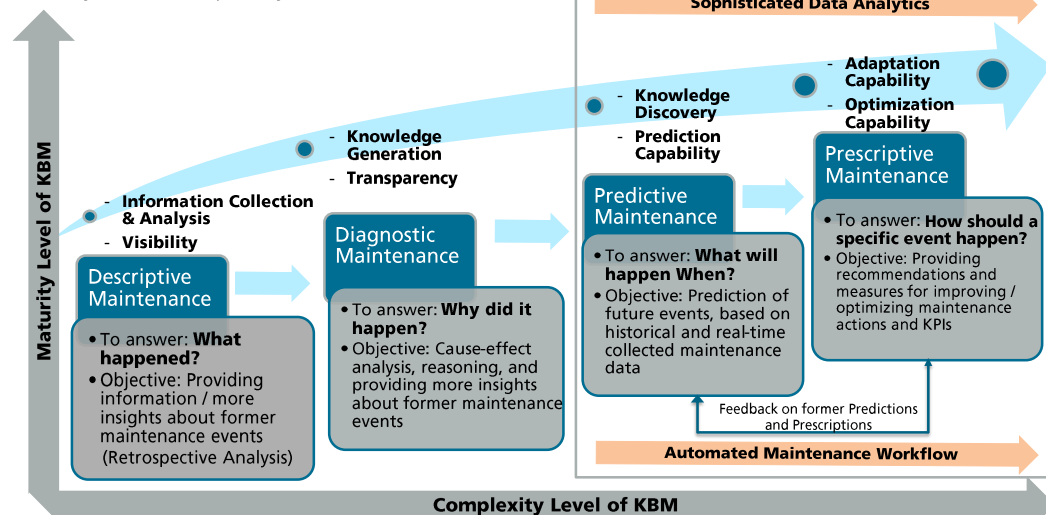
\*\*TLC: Total Lifecycle Costing

\*\*\*RCM: Reliability centered Maintenance



## Evolution of Knowledge-Based Maintenance

Maturity- and Complexity Levels



F. Ansari, R. Glawar, & T. Nemeth, PriMa: a prescriptive maintenance model for cyber-physical production systems, International Journal of Computer Integrated Manufacturing, 2019.

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## Knowledge-Based Maintenance for Modeling and Analysis of RAM

Interpretation and Challenges of KBM at the Age of Industry 4.0

- **Knowledge-Based Maintenance** is about ...
  - **employing AI\*** (methodologies, methods, algorithms, tools, technologies) for analyzing, modeling, predicting and reducing the **likelihood or frequency of failures** and thus **increasing availability** in production systems, gaining benefits from multi-channel, multi-structured data sources.
- **What are the challenges?**
  - Proper use of **multiple data sources**
  - Suboptimal use of **multi-structured** data
  - **Multi-modality** of data (semantic correlation of information)
  - **Multiple** and overlapping reliability-centered and maintenance **strategies** and approaches
  - **Multi-dimensionality** of maintenance organization/actors/teams, processes and IT-systems
  - **Economic** and **technical plausibility** of KBM

\* AI: Artificial Intelligence



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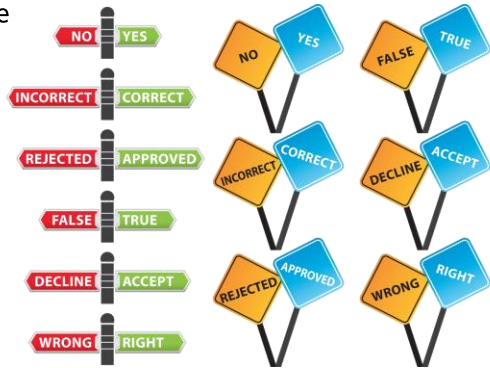
## Modeling and Analysis of RAM in Maintenance of Compressors

There is no real preference and absolute answer – It Depends on our application case!

- What are the data sources that we may consider for modeling and analysis of RAM in maintenance of compressor units?

### Answer: Multiple Data Sources

- Data from compressor manufacturers
- Data from similar products
- The existed site fault statistic data
- Failure databases
- Maintenance records
- Condition- and structural health monitoring data
- Experienced analyst's subjective judgment
- Data from Physical models?
- Data from Simulation models?



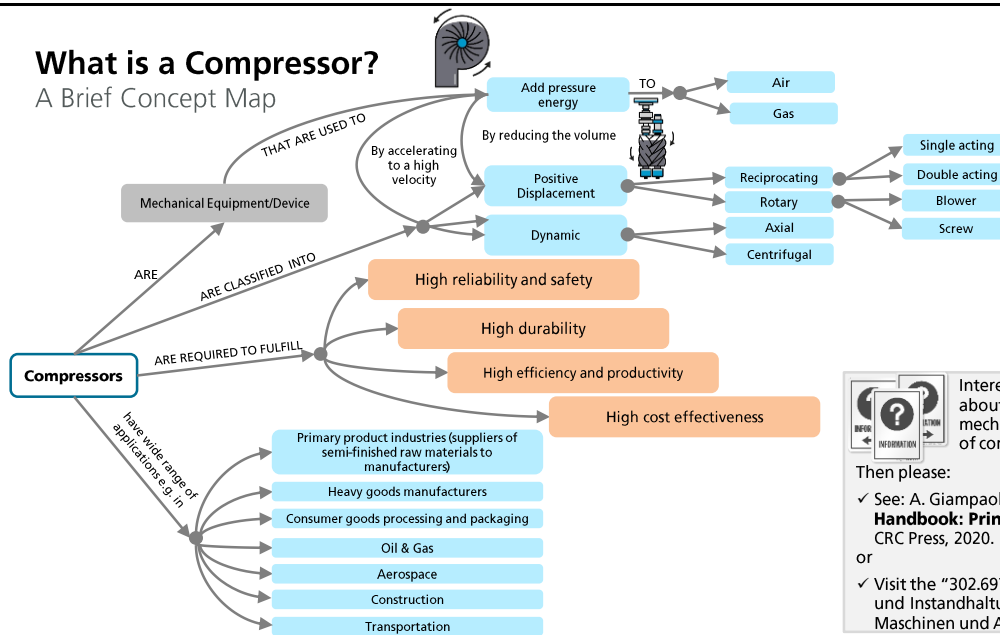
## 2) Knowledge-Based Approaches in Industrial Maintenance

### MAINTENANCE OF COMPRESSORS IN OIL AND GAS PRODUCTION PLANTS



# What is a Compressor?

## A Brief Concept Map



Interested to know more about compression theory, mechanics and applications of compressors?

Then please:

- ✓ See: A. Giampaolo, **Compressor Handbook: Principles and Practice**, CRC Press, 2020.
- or
- ✓ Visit the "302.697 Maschinendiagnostik und Instandhaltung von Hydraulischen Maschinen und Anlagen"

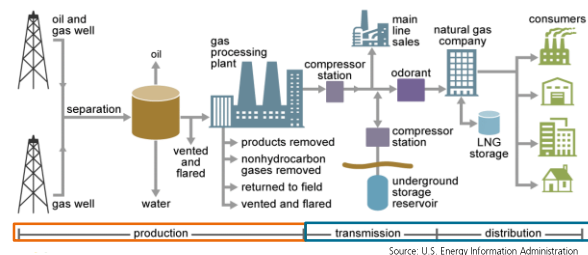
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## Compressors

### In Petroleum and Natural Gas Production Plants

- **Compressors (equipment units) are used in all aspects of petroleum and natural gas development**, e.g.
  - in the **production** segment to compress gas for fluids removal and pressure equalization with gathering equipment systems.
  - in the natural gas **processing, transmission and storage** (particularly underground storage) segments of the industry.
- **ISO 14224** specifies **typical "Types"** and **"Applications"** of compressors in the petroleum and natural gas industries.



Equipment Class	Type	Application
Compressor	Centrifugal	Gas processing
	Reciprocating	Gas export
	Screw	Gas injection
	Blowers/fans	Lift gas compression
	Axial	Compressed air
		Refrigeration

References: (Corvaro et al., 2017), (ISO 14224, 2016)

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## Maintainable Items of a Compressor Unit

Equipment Unit Subdivisions and related Maintainable Items

- Maintainable items of a compressor equipment unit, independent of the compressor type, can be summarized as depicted below:



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Subunit	Power Transmission	Compressor	Control & Monitoring	Lubrication System	Shaft Seal System	Miscellaneous
<b>Maintainable Items</b>	<ul style="list-style-type: none"> <li>Gearbox/ variable drive</li> <li>Bearings</li> <li>Coupling to the driver</li> <li>Lubrication Seals</li> <li>Coupling to the driven unit</li> </ul>	<ul style="list-style-type: none"> <li>Casing Rotor with impellers</li> <li>Balance piston</li> <li>Inter-stage seals</li> <li>Radial bearing</li> <li>Thrust bearing</li> <li>Shaft seals</li> <li>Internal piping</li> <li>Valves</li> <li>Anti-surge system including recycle valve and controllers</li> <li>Piston</li> <li>Cylinder liner</li> <li>Packing</li> </ul>	<ul style="list-style-type: none"> <li>Control</li> <li>Actuating device</li> <li>Monitoring Valves</li> <li>Internal power supply</li> </ul>	<ul style="list-style-type: none"> <li>Oil tank with heating system</li> <li>Pump with motor</li> <li>Check valves</li> <li>Coolers</li> <li>Filters</li> <li>Piping</li> <li>Valves</li> <li>Lube oil</li> </ul>	<ul style="list-style-type: none"> <li>Oil tank with heating</li> <li>Reservoir</li> <li>Pump with motor/gear</li> <li>Filters</li> <li>Valves</li> <li>Buffer gas</li> <li>Seal oil</li> <li>Dry gas seal</li> <li>Seal gas</li> <li>Scrubber</li> </ul>	<ul style="list-style-type: none"> <li>Base frame</li> <li>Piping, pipe support and bellows</li> <li>Control-isolation and check valves</li> <li>Coolers</li> <li>Silencers</li> <li>Purge air</li> <li>Magnetic bearing control system</li> <li>Flange joints</li> <li>Others</li> </ul>

References: (ISO 14224, 2016)

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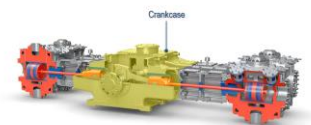
## Failure Modes Effect Analysis (FMEA) of Compressor Units

Case-Study of Reciprocating Compressor

- Reciprocating compressor includes **two major functional components**:
  - Motion mechanisms** including the crankshaft, bearing, connecting rod, crosshead, pulley or coupling, etc.
  - Work mechanism** including cylinder, piston, valves, etc.
- Compressor is also equipped with **three auxiliary systems** including the lubrication system, cooling system and control system.
- In the main unit excluding auxiliary systems, 8 items are functionally significant. Let us focus e.g. on **Crankshaft**, we may identify failure modes-cause-effects as:

MECHANICAL DESIGN

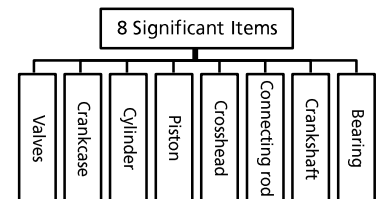
➤ Crankcase



Sources: <https://wrttraining.org/>

© 2019

Failure Modes	Failure Cause	Failure Effect		
		Local Influence	Seriously affect	Finally affect
Crack	Quality fatigue	Crack propagation	Crankshaft vibration abnormal	Crankshaft fracture
Bending	High load	Crankshaft abnormal	Crankshaft vibration abnormal	Damage compressor
Fracture	Crack, High load	Shutdown	Shutdown	Severe accident



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# Failure Modes Effect Analysis (FMEA) of Compressor Units

8 Functionally Significant Items –FMEA, related Risks Levels and Maintenance Strategies

Part Cod #	Functional Items	Potential Failure Mode	Failure Cause	Failure Effect			Functional Items	Failure Mode	Risk Level	Maintenance Strategy
				Local influence	Seriously effect	Finally effect				
01	Bearing	Loosening	Long-term use	Crankshaft vibration abnormal	Crankshaft vibration abnormal	Shutdown	Bearing	Loosening	H	condition based maintenance
		Bearing bush abrasion	Long-term use, bad lubrication	Crankshaft vibration abnormal	Crankshaft vibration abnormal	Shutdown		Bearing bush abrasion	M	Function testing
02	Crankshaft	Crack	Quality fatigue	Crack propagation	Crankshaft vibration abnormal	Crankshaft fracture	Crankshaft	Crack	M	Periodical overhaul/ Replacement
		Bending	High load	Crankshaft vibration abnormal	Crankshaft vibration abnormal	Damage compressor		Bending	M	Periodical overhaul/ Replacement
		Fracture	Crack, High load	Shutdown	Shutdown	Severe accident		Fracture	H	Real time state detection
03	Connecting rod	Crack	Fatigue stress	Crack propagation	Crankshaft vibration abnormal	Connecting rod failure	Connecting rod	Crack	M	Periodical overhaul/ Replacement
		Fracture	Fatigue crack propagation	Shutdown	Shutdown	Severe accident		Fracture	H	Real time state detection
		Small end tile wear	Long-term use, bad lubrication	Running condition variation	Shutdown	Shutdown		Small end tile wear	M	Function testing
04	Crosshead	Large end tile wear	Long-term use, bad lubrication	Running condition variation	Connecting rod failure	Shutdown	Crosshead	Large end tile wear	M	Function testing
		Pin wear	Long-term use, bad lubrication	Running condition variation	Crosshead vibration abnormal	Shutdown		Pin wear	M	Function testing
		Pin fracture	Long-term use, bad lubrication	Running condition variation	Shutdown	Severe accident		Pin fracture	H	Real time state detection
		Neck fracture	Fatigue stress concentration	Shutdown	Shutdown	Severe accident		Neck fracture	H	Real time state detection
		Slip abrasion	bad lubrication	Crosshead vibration abnormal	Crosshead failure	Shutdown		Slip abrasion	M	Function testing
05	Piston rod and piston	Connection loosening	Long-term use, fastening adverse	Cylinder vibration abnormal	Shutdown	Shutdown	Piston rod and piston	Connection loosening	M	condition based maintenance
		Piston rod fracture	Fatigue crack, stress concentration	Shutdown	Shutdown	Severe accident		Piston rod fracture	H	Real time state detection
		Research on Wear	Long-term use, bad lubrication	Not seal	Cylinder vibration abnormal	Work abnormal		Research on Wear	L	Corrective maintenance
06	cylinder	Crack	stress concentration	Not seal	vibration abnormal	Shutdown	cylinder	Crack	H	Periodical predictive maintenance
		Inner wall wear	Foreign matter, bad lubrication	Piston ring damage	Leakage	Shutdown		Inner wall wear	M	Function testing
		Oil wiper leaking	Piston rod scuffing	Lubrication oil leakage	pollution	Lubrication oil effect worse		Oil wiper leaking	M	condition based maintenance
07	Crankcase	Crack	Fatigue , stress concentration	Running condition variation	Crack propagation	Shutdown	Crankcase	Crack	H	Periodical predictive maintenance
		Combustion or explosion	Lubrication oil gasifying	Shutdown	Shutdown	Severe accident		Combustion or explosion	H	Real time state detection
08	Valves	Valve Block damage	Fatigue failure, Friction damage	Work abnormal	Shutdown	Shutdown	Valves	Valve Block damage	M	Replacement
		Spring failure	Fatigue failure, Friction damage	Work abnormal	Shutdown	Shutdown		Spring failure	M	Replacement
		Leakage	Deformation of valve plate	Work abnormal	Shutdown	Shutdown		Leakage	M	Replacement
		High temperature of exhaust	Exhaust valve leakage, bad lubrication	Valves damage	Shutdown	Shutdown		High temperature of exhaust	M	Replacement
		Valves product excess carbon	Excess lubrication oil, valves damage	Valves damage	Shutdown	Shutdown		Valves product excess carbon	M	Replacement

H= High Risk  
M= Medium Risk  
L= Low Risk

References: (Liang et al., 2012)

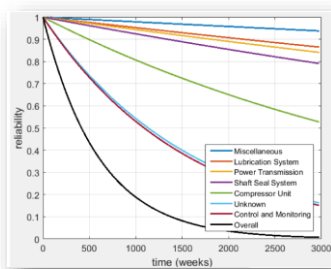
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## A Procedural Model for Determination of Maintenance Strategy

How do we determine the appropriate maintenance strategy based on FMEA?

**Next Step** is to identify how to **model and quantify the probability of failure and predict RAM over time.**



\* Determination of appropriate maintenance strategy is based on two main policies: preventive (periodic, condition-based, etc.) or corrective maintenance (repair and replace), before and after failure moments, which are intended to retain or restore a functional unit in or to a desired functional state.

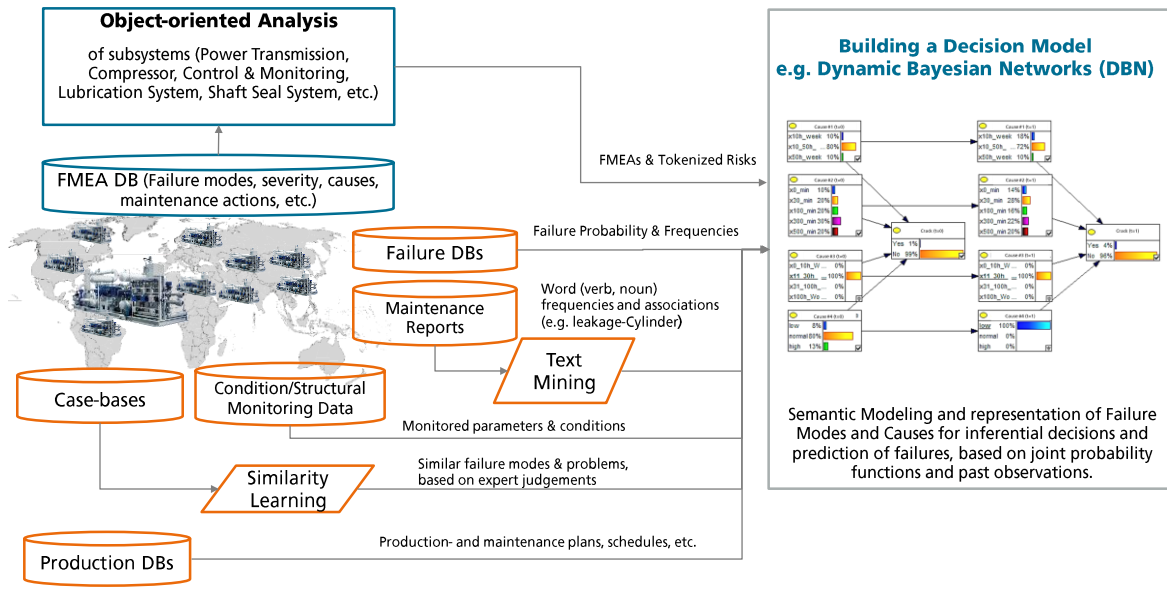
References: Adopted from (Corvaro et al., 2012), (Spünptrup et al., 2018)

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# Knowledge-Based Modeling and Analysis of RAM

in Maintenance of Compressor Units – From OEMs and Users Perspectives



## What are (Dynamic) Bayesian Networks?

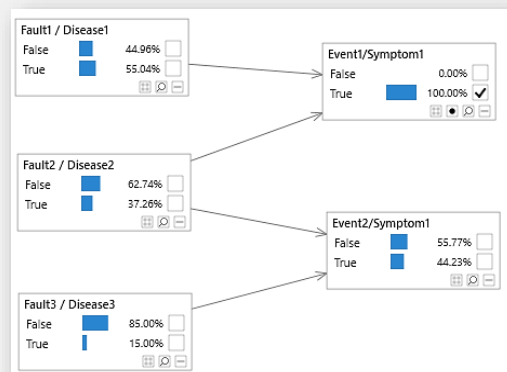
Definition

### ■ What are Bayesian Networks (BNs)?

- Bayesian networks are a type of Probabilistic Graphical Model that can be used to **build models from data and/or expert opinion**.
- They can be used for a **wide range of tasks** including prediction, anomaly detection, diagnostics, automated insight, reasoning, time series prediction and decision making under uncertainty.
- They are also commonly referred to as **Bayes nets**, **Belief networks** and sometimes **Causal networks**.

### ■ What are Dynamic BNs (DBNs)?

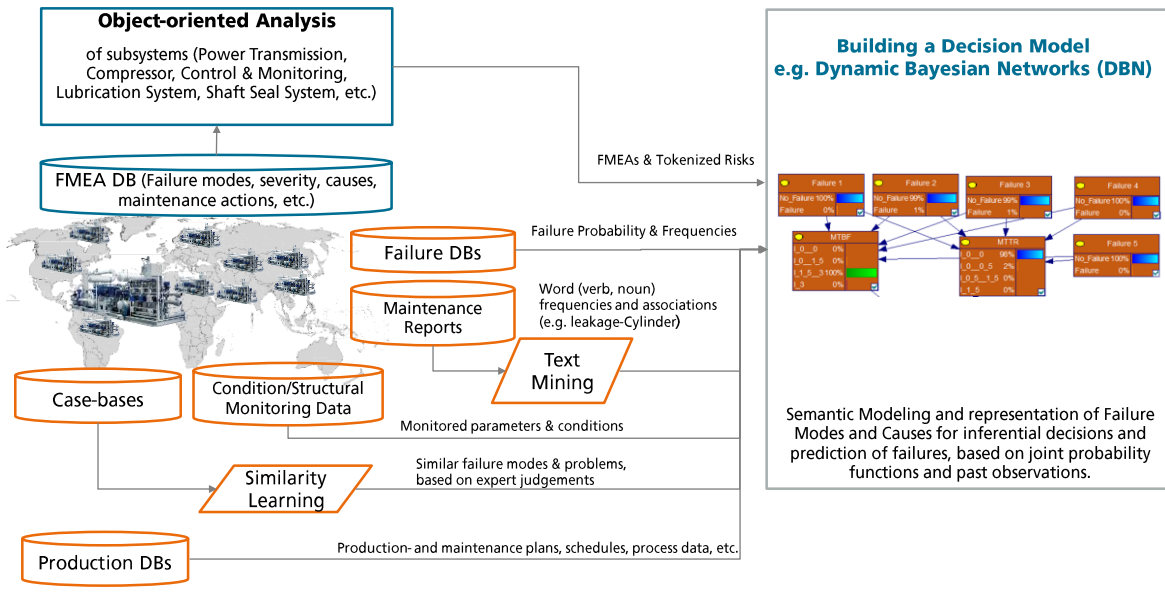
- Dynamic Bayesian networks **extend standard Bayesian networks with the concept of time**.
- This **allows us to model time series or sequences**.
- In fact they can model complex multivariate time series, which means we can **model the relationships between multiple time series in the same model**, and also **different regimes of behavior**, since time series often behave differently in different contexts.



Source: <https://www.bayesserver.com/docs/techniques/diagnostics>

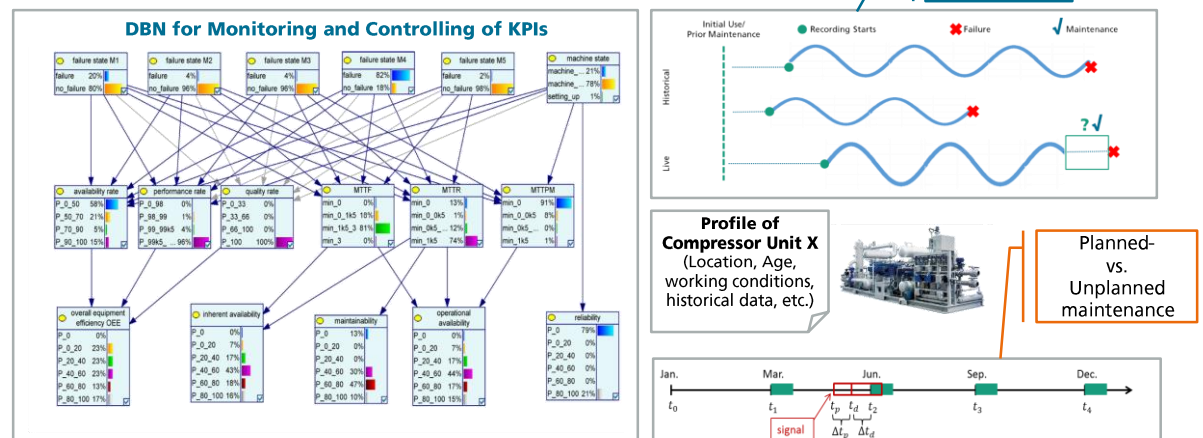
# Knowledge-Based Modeling and Analysis of RAM

in Maintenance of Compressor Units – From OEMs and Users Perspectives



# Knowledge-Based Modeling and Analysis of RAM

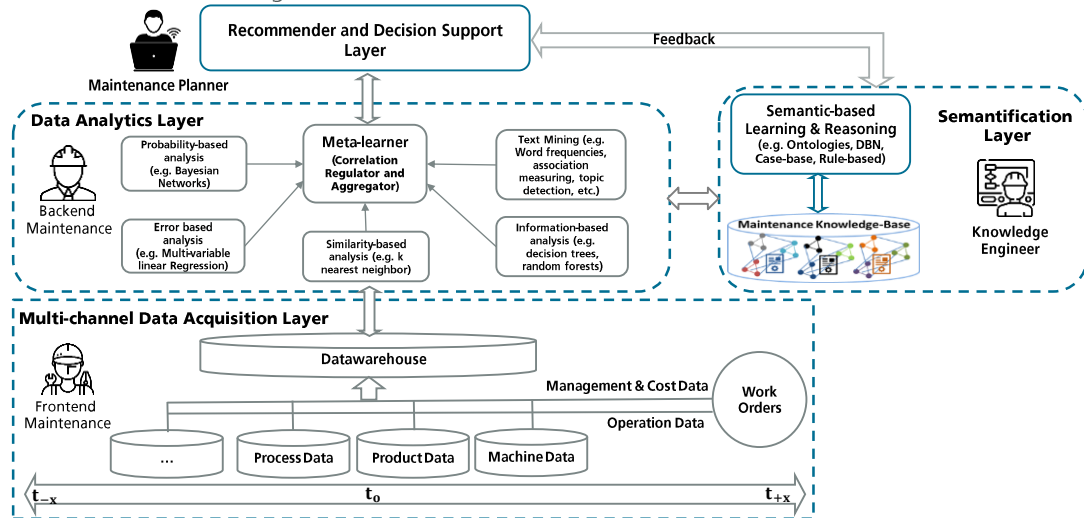
in Maintenance of Compressor Units – From OEMs and Users Perspectives



**DBN semantically represents FMEA's relations learned from multimodal data, and supports complex decision-making and prescriptive analytics using RAM's KPIs**

# PriMa: Prescriptive Maintenance Model

Reference Model for Knowledge-Based Maintenance



F. Ansari, R. Glawar, & T. Nemeth, PriMa: a prescriptive maintenance model for cyber-physical production systems, International Journal of Computer Integrated Manufacturing, 2019.

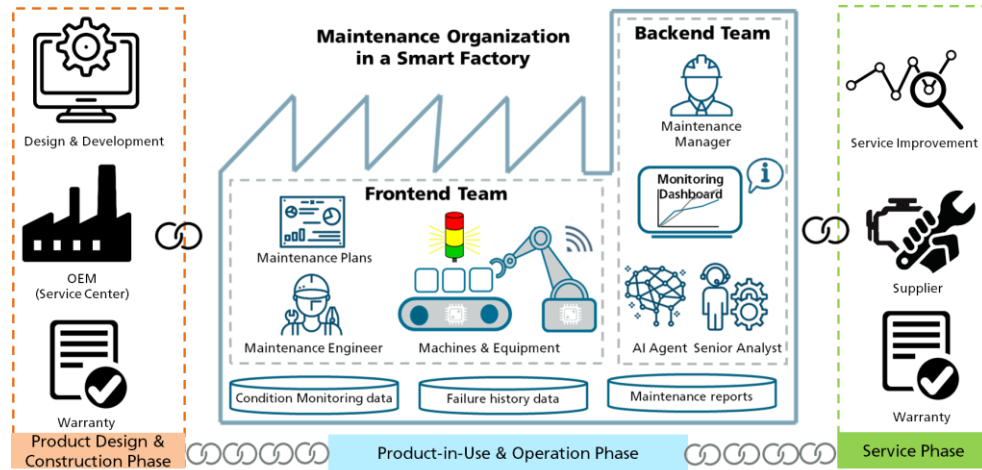
F. Ansari and R. Glawar, Knowledge-Based Maintenance, Book Chapter, In Instandhaltungstechnik, K. Matyas (Ed.), 7th Edition, Carl Hanser Verlag, 12/2018, pp. 318-342.

## 3) Outlook

**FUTURE OF KBM: WHERE DOES THE JOURNEY MAY GO IN FUTURE?**

## Today's Big Picture of Maintenance

Industrial Maintenance Landscape including OEMs, Operators and Service Suppliers



**OEM:** Original Equipment Manufacturer

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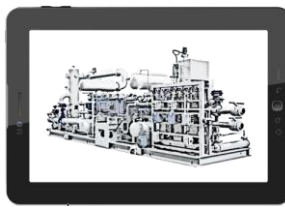
## Future of Knowledge-Based Maintenance: Question for Research!

Human-AI Agent Cooperation in KBM

**Can a compressor unit itself assist frontend and backend team in maintenance planning and actions?**



**Human Expert**



**Digital Twin**



**Physical Asset**

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## Can a Machine help us maintaining its health score?

Human-AI Agent Cooperation in KBM



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## Knowledge-Based System in Practice

Knowledge Graph-based Assistance System for Troubleshooting & Documentations



Ansari, F., Hold P., & Khobreh, M., (2020). A Knowledge-Based Approach for Representing Jobholder Profile toward Optimal Human-Machine Collaboration in Cyber Physical Production Systems, CIRP Journal of Manufacturing Science and Technology, Elsevier, Vol. 28, pp. 87-106.



Ansari, F., Kohl, L., Giner, J., & Meier, H., (2021). Text mining for AI enhanced failure detection and availability optimization in production systems. CIRP Annals, 70(1), 373-376.

Project funded by Infineon Technologies in Austria (since 2020)



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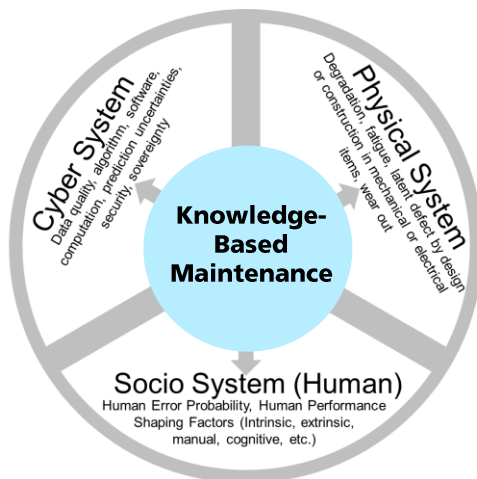
## To Sum Up



Thesaurus.plus

## Scientific Challenge: Why Knowledge-Based Maintenance Matters?

Interconnected Failure Sources of Human-centered Cyber Physical (Systems of) Systems



**Human-centered Cyber Physical (Systems of) Systems**

**are more complex and error-prone than**

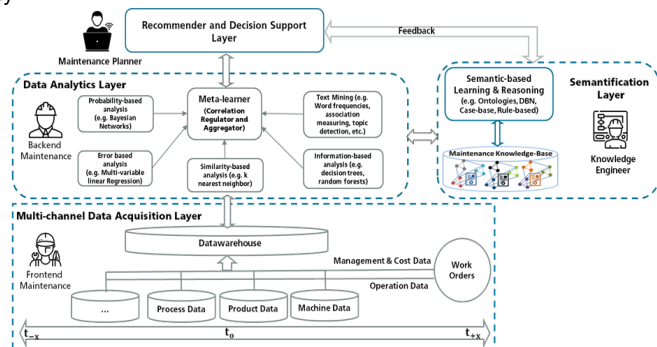
**Conventional Human-Machine Systems**

## To Bring our Vision of PriMa Model into Reality ...

Still we have several challenges in Data Modeling and Analysis in Industrial Context

- **Success of KBM in industrial context** is strongly dependent on

- Existence of data (e.g. failure data) and evidences (observations)
- Correctness and validity of data
- Correct interpretation of data (by algorithms and human)
- Explainability of algorithm's decision to humans
- Modeling and incorporation of human knowledge/experiences
- Employing simulation-based and physics-based models



**As we are industrial engineers, on the top of this, we should examine economic and technical plausibility of KBM in each industrial application.**

## References (1/3)

that help you to learn more about today's lessons – All are Accessible for free via TU's Library

- K. Matyas, Instandhaltungslogistik: Qualität und Produktivität steigern, Carl Hanser Verlag GmbH Co KG, 2018. [Link \(Only in German\)](#)
- G. Pawellek, Integrierte Instandhaltung und Ersatzteillogistik: Vorgehensweisen, Methoden, Tools. Springer-Verlag, 2013. [Link \(Only in German\)](#)
- M. Rausand, A. Barros and A. Hoyland, System Reliability Theory: Models, Statistical Methods, and Applications, John Wiley & Sons, 2020. [Link](#)
- ISO 14224, Petroleum and Natural Gas Industries - Collection and Exchange of Reliability and Maintenance Data for Equipment, 2016. [Link](#)
- W. Liang, et al., Reliability-centered Maintenance Study on Key Parts of Reciprocating Compressor, 2012, International Conference on Quality, Reliability, Risk, Maintenance, and Safety Engineering, IEEE, 2012. [Link](#)
- F. S. Spüntrup, et al., Reliability Improvement of Compressors based on Asset Fleet Reliability Data, IFAC-PapersOnLine 51.8 (2018): 217-224. [Link](#)
- A. Giampaolo, Compressor Handbook: Principles and Practice, CRC Press, 2020. [Link](#)
- F. Corvaro, et al., Reliability, Availability, Maintainability (RAM) Study on Reciprocating Compressors API 618, *Petroleum* 3.2 (2017): 266-272. [Link](#)

Links are uploaded in



## References (2/3)

Two Chapters that discuss today's lessons



## References (3/3)

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## Q&A?

- Any question so far?
- Next Lecture: 02.05.2023
- Topic of Next Week:  
**Knowledge Representation**  
**(Ontologies/Knowledge Graph)**



**Technology for People!**



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