

# Analysis and Decision Support of Circular Economy Strategies in Power Electronics

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***Directeur de la thèse: Jean-Christophe Crebier***

***Co-encadrante de la thèse: Thècle Alix***



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# VIVAE Project

VIVAE is a forward-looking initiative dedicated to advancing circularity within the field of power electronics.

## Objectives

- Support circularity
- Facilitate multiple life cycles
- Save residual value
- Prevent being totally recycled after first use
- Value extension



Projet-ANR-21-CE10-0010

# Agenda

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## Motivation

- *Power electronics*
- *E-waste*
- *Circular economy*
- *Scope of the study*
- *Research activity*

## Decision Tree

- *Basics of the decision tree*
- *Conceptual level*
  - *Case study at conceptual level*
- *Implementation level*

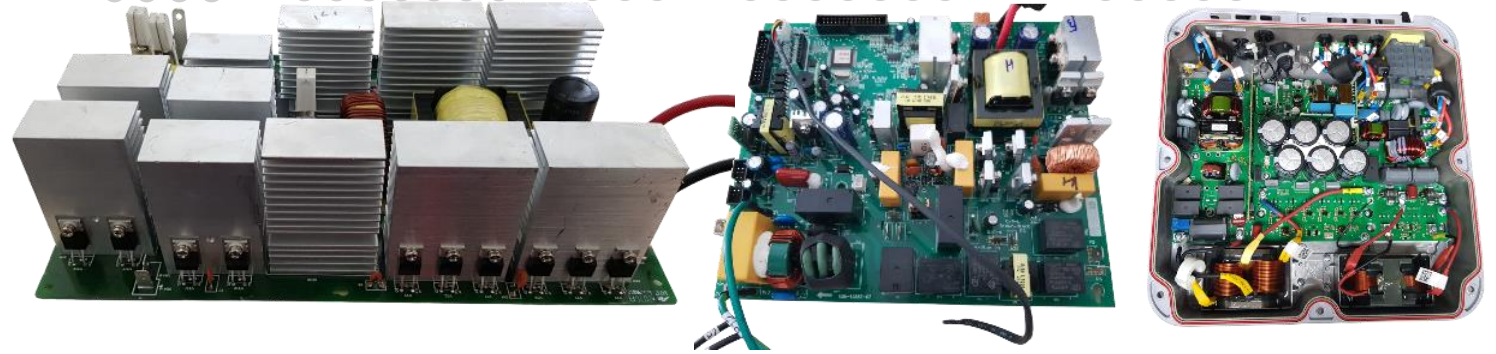
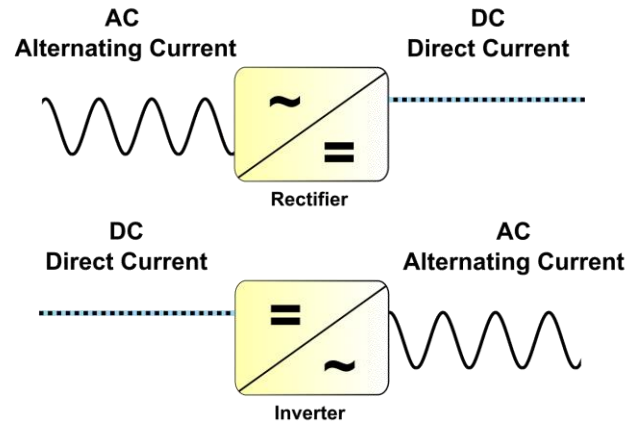
## Index

- *Equation*
- *Benchmark*
- *Results*

## ○○ Conclusion & Perspectives

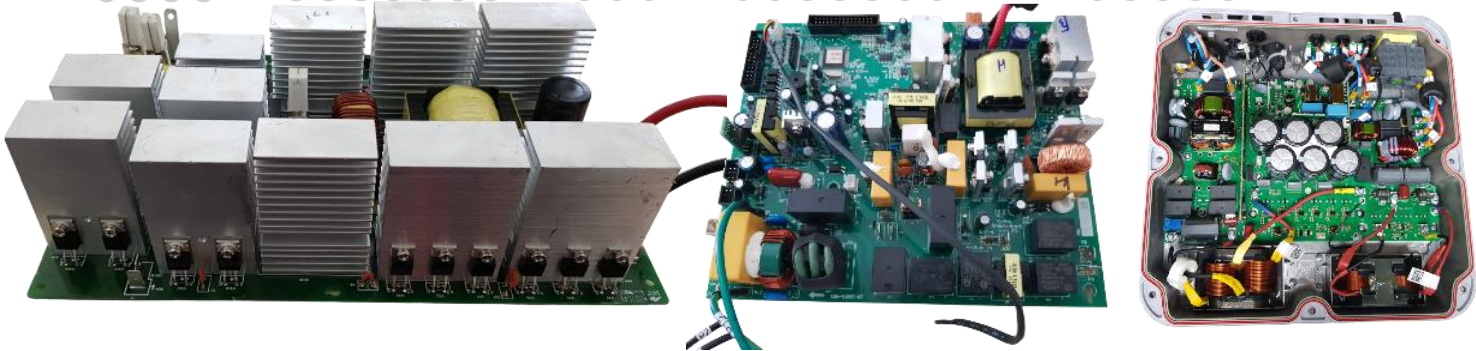
# Power Electronics

Control and convert electrical power



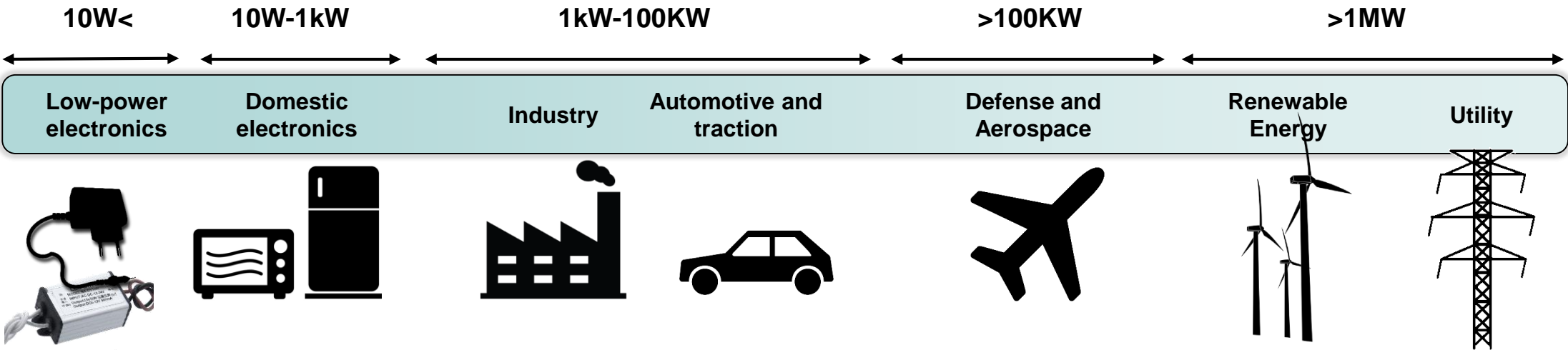
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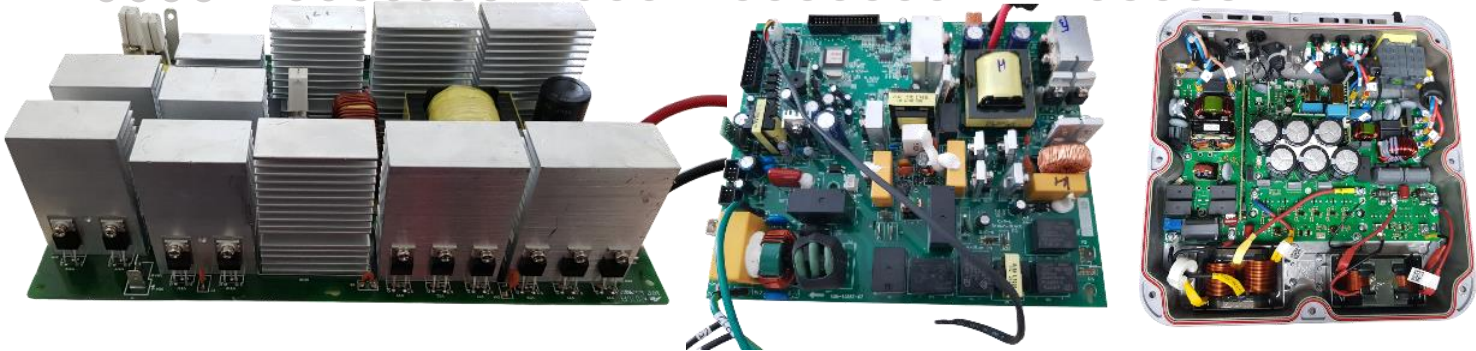
*70% of electricity flows through at least one **power electronics converter***

(ABB. Power Electronics: Revolutionizing the world's future energy systems)

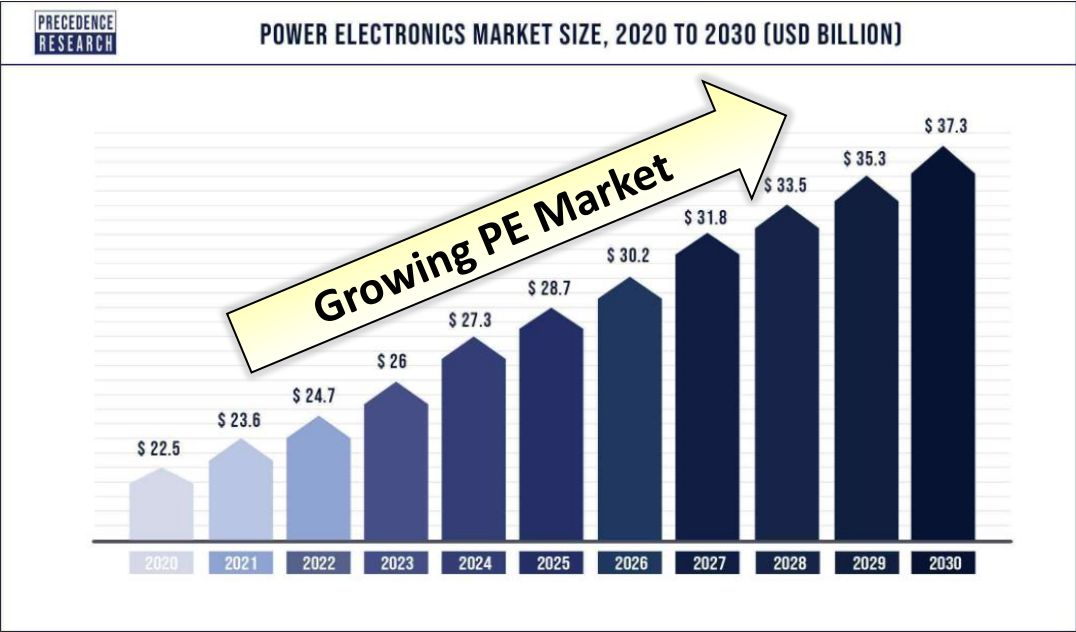


# Power Electronics

Control and convert electrical power

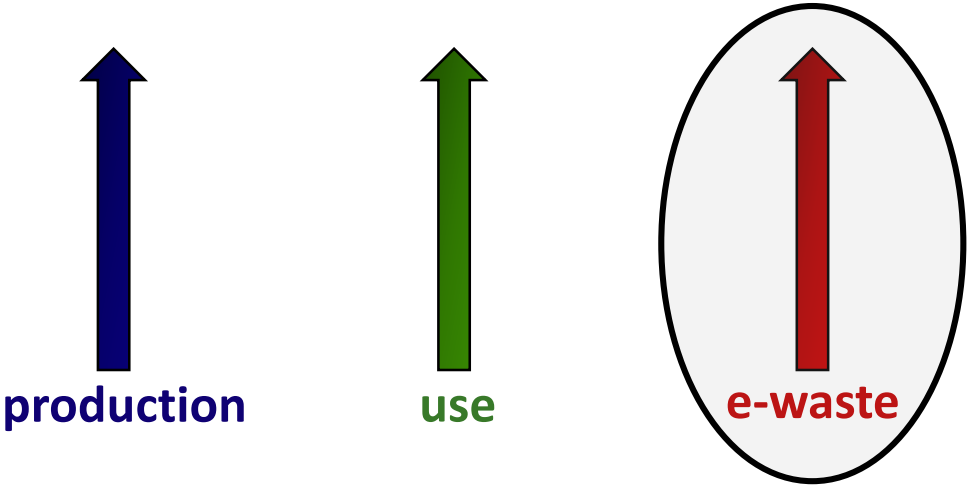


70% of electricity flows through at least one **power electronics converter**



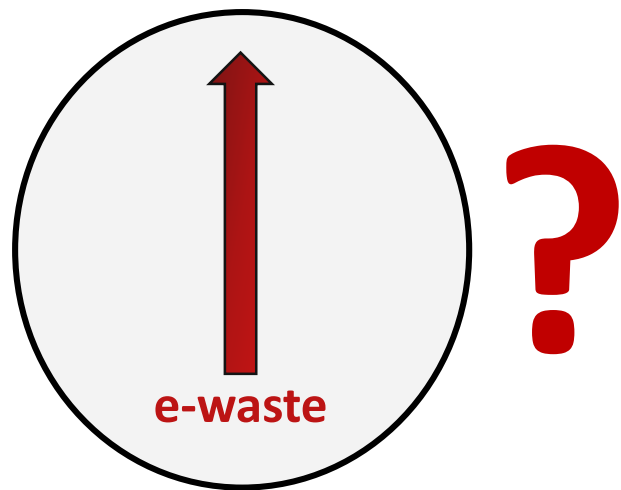
(Power Electronics Market Size, precedenceresearch.com)

(ABB. Power Electronics: Revolutionizing the world's future energy systems)





# E-waste



## Global E-waste Monitor 2020

*Generated*

53 Mt in 2019

*Projection for 2030*

74.7 Mt

## Global E-waste Monitor 2024

*Generated*

62 Mt in 2022

*Projection for 2030*

82 Mt

In just four years, the projected  
e-waste for 2030 surged by  
**7.3 million metric tons**

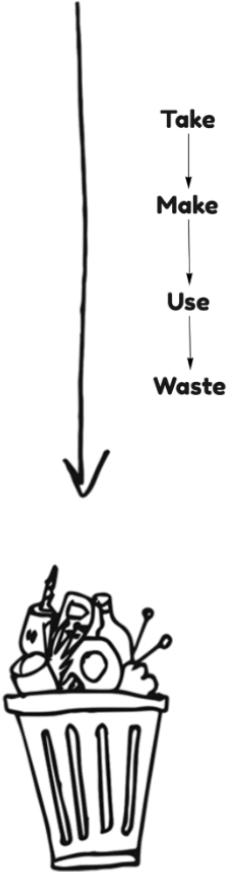


**Circular Economy**

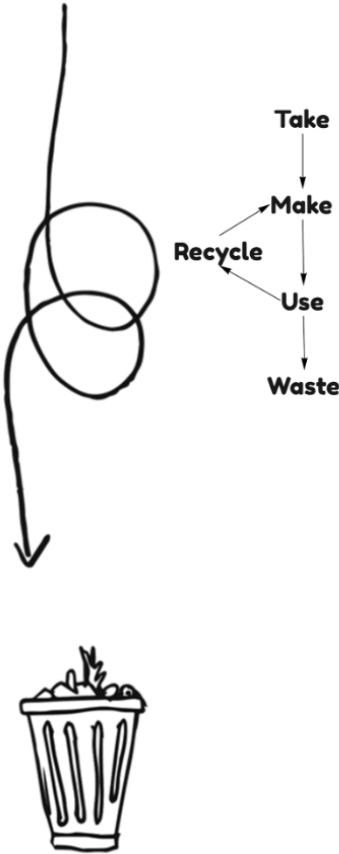


# Circular Economy

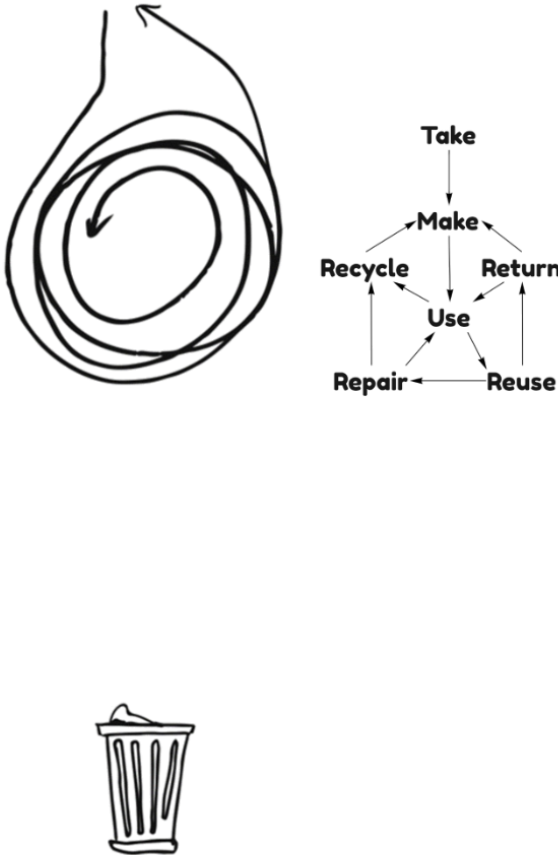
## LINEAR ECONOMY



## RECYCLING ECONOMY



## CIRCULAR ECONOMY

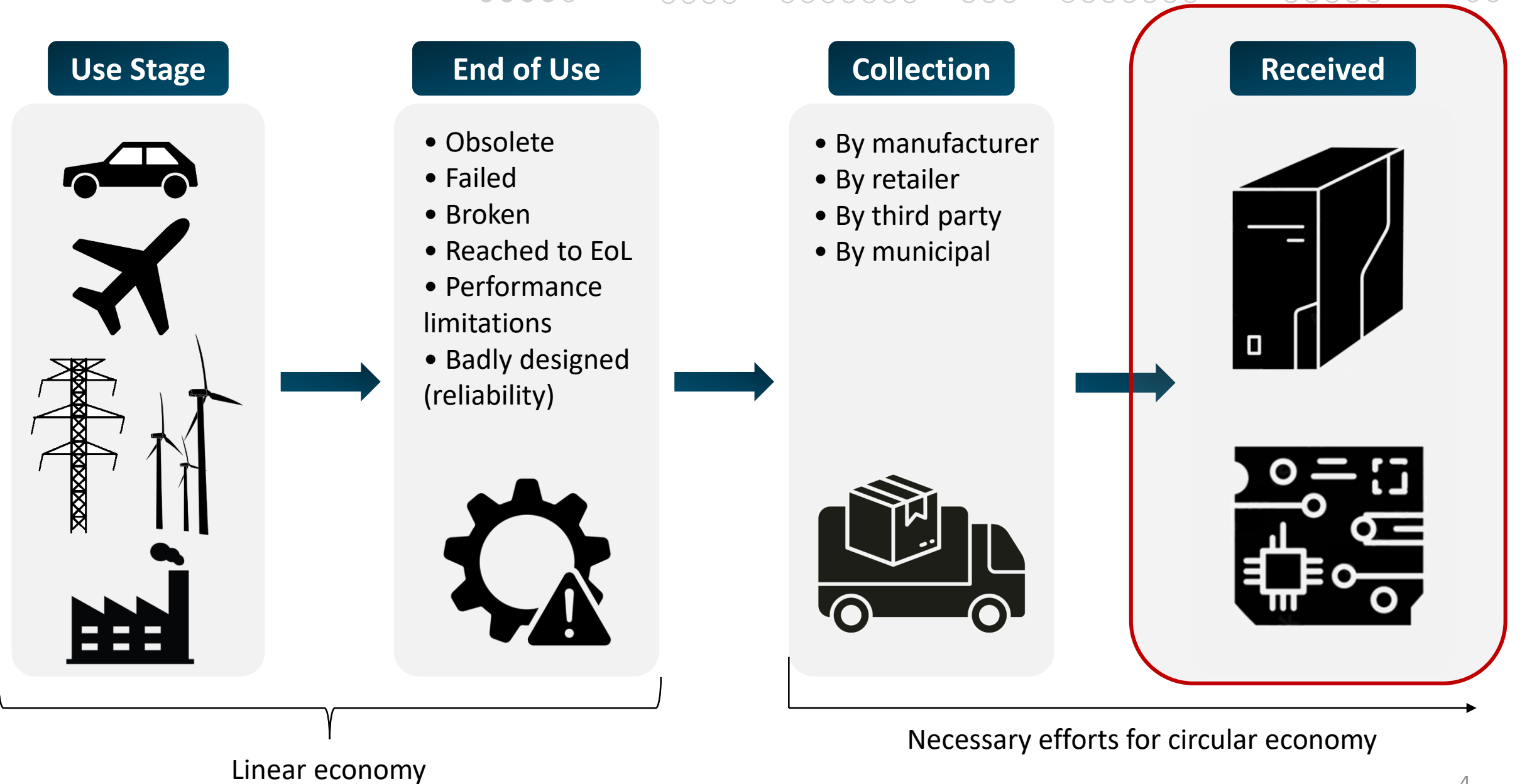


How to consider  
circular economy  
for power electronics

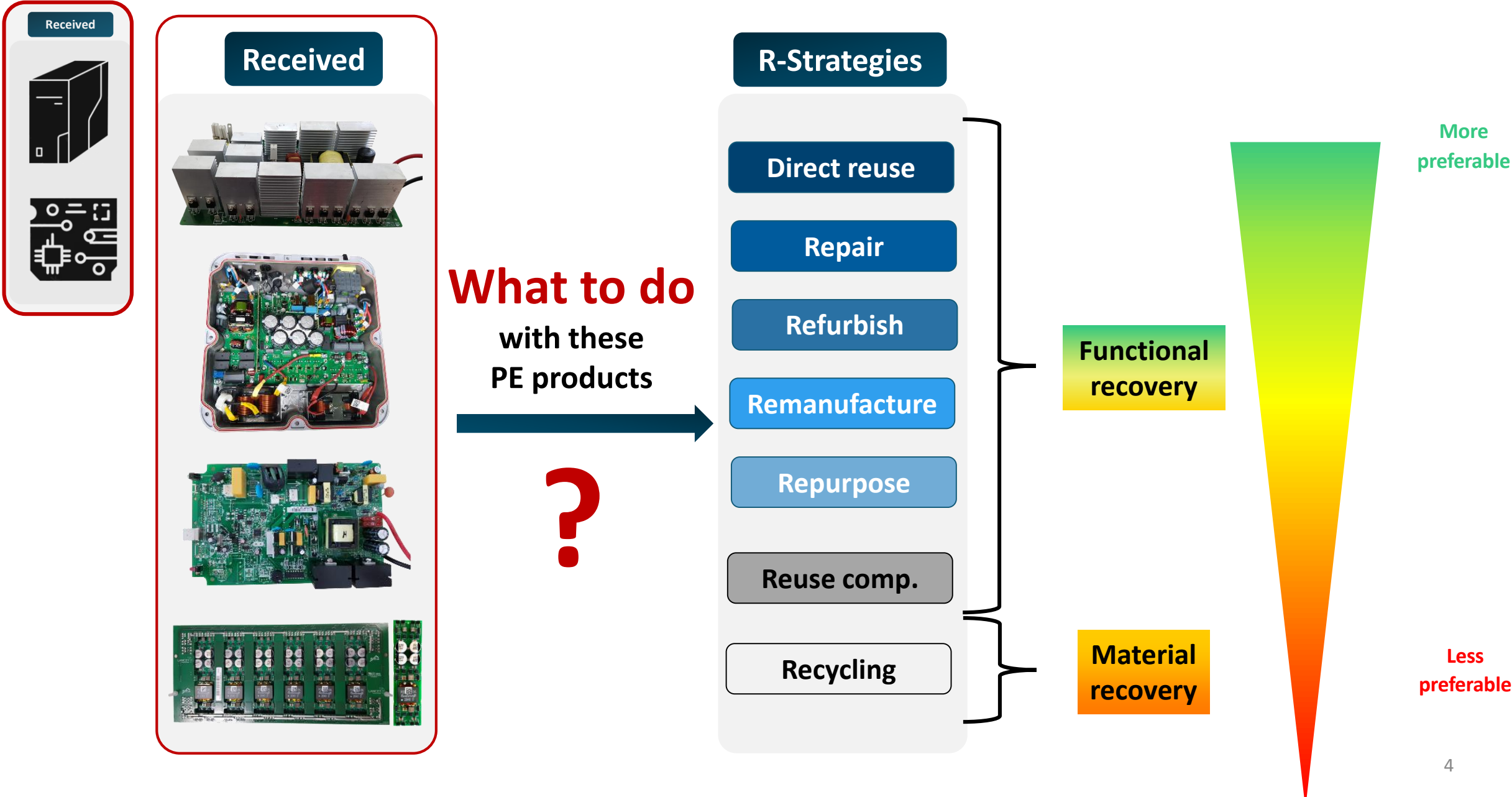




# Necessary steps to initiate circular economy



# Scope of the study



# Research activity

## Research Question

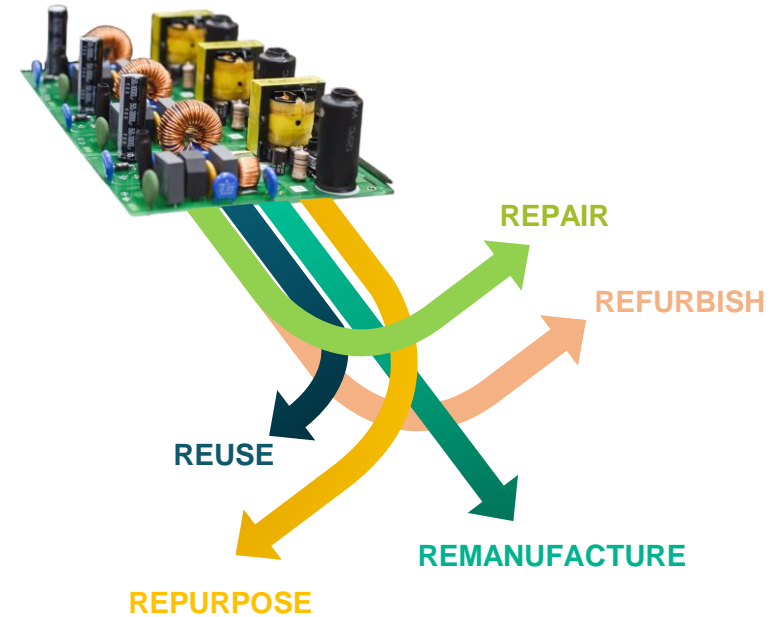
How can the optimal circular economy strategy be selected to reintroduce end-of-use PE products into the economy, while preserving their functional value ?

## Research Objective

Find an optimal way to determine the circular economy strategy for end-of-use PE products

## Research Methodology

Identify the **different paths and actions** that should be done in order to determine the best circular economy strategy for end-of-use PE products



### Why decision tree

- Breaking down process into sequential steps
- Effective way to map all steps, interrelations
- Providing a layered analysis



## DECISION TREE

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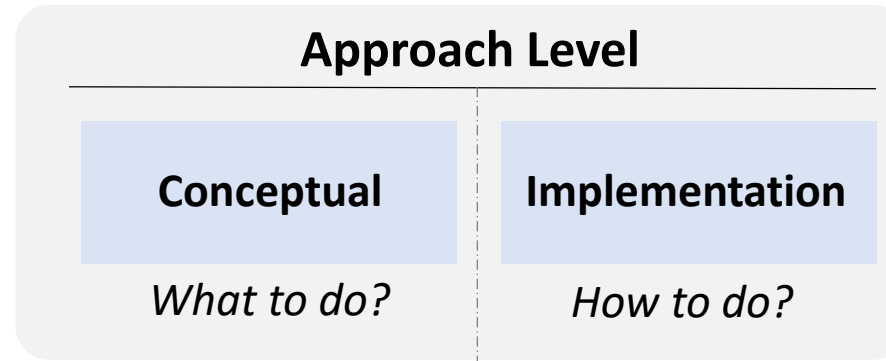
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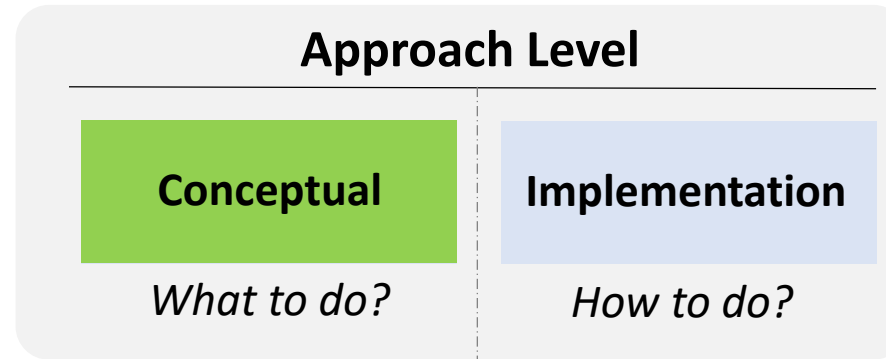
- *Equation*
- *Benchmark*
- *Results*

- **Conclusion & Perspectives**

# Basics of the decision tree



# Basics of the decision tree

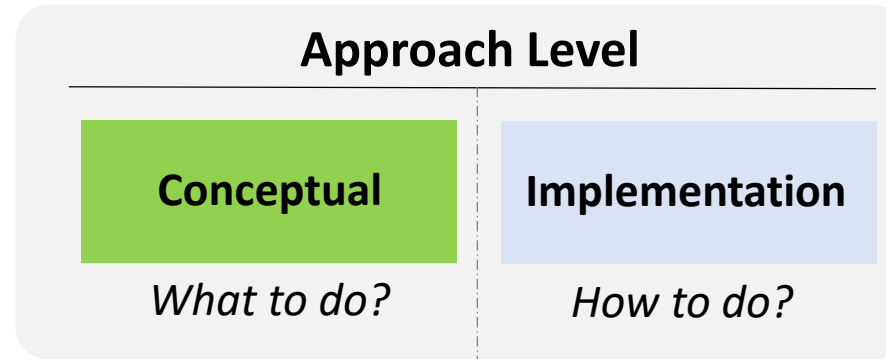


**“What to do to determine the R-strategy for PE?”**

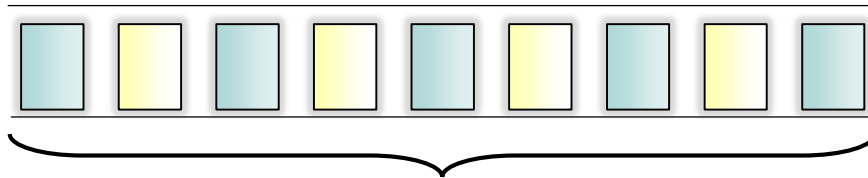
**Main objective**



# Basics of the decision tree

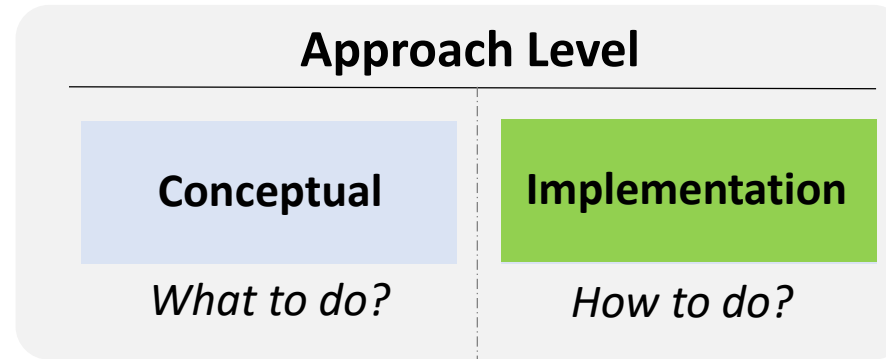


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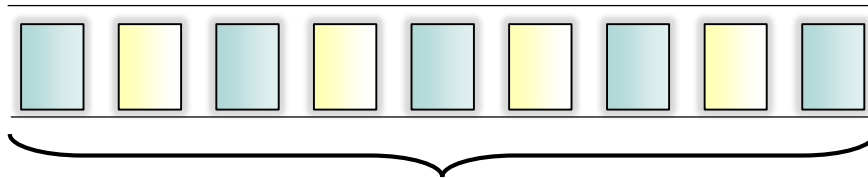


smaller and manageable activities

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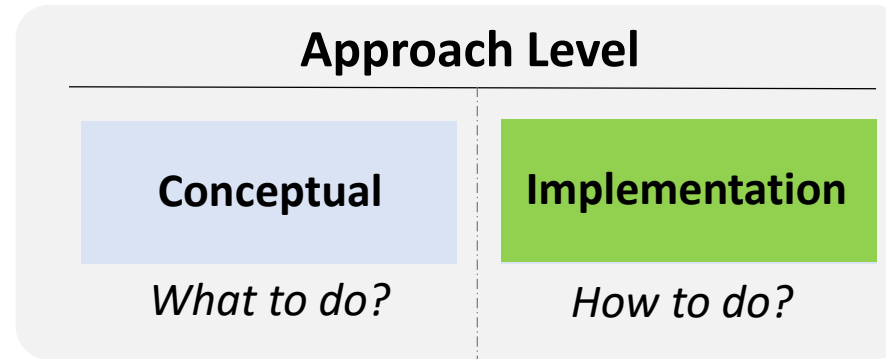


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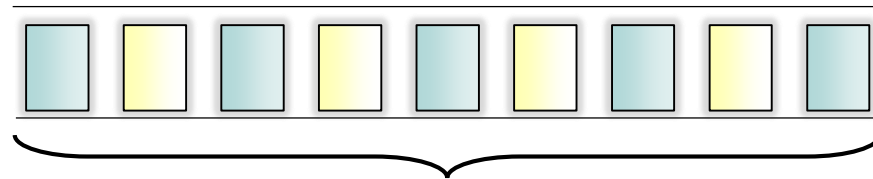


smaller and manageable activities

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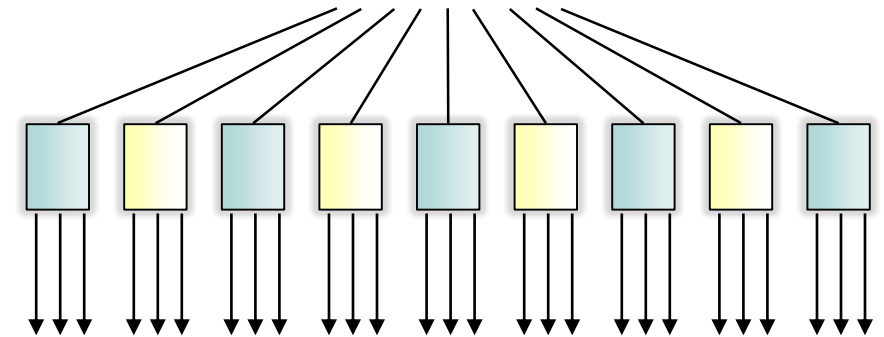


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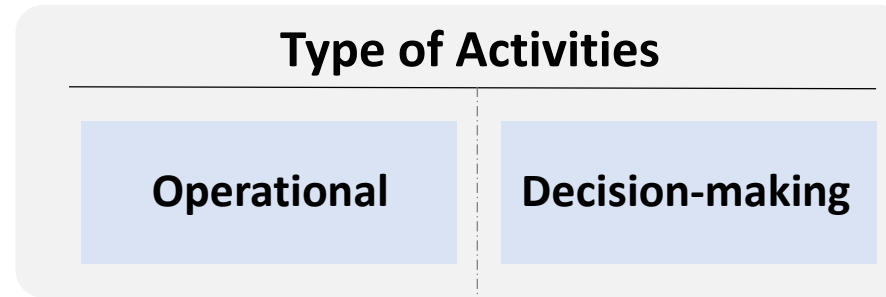
smaller and manageable activities

**“How to perform each activity?”**

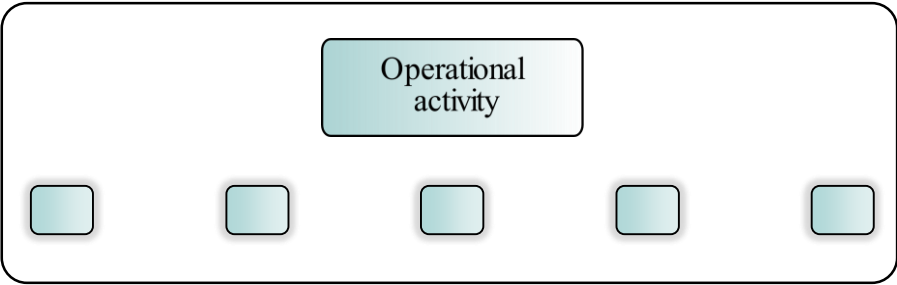
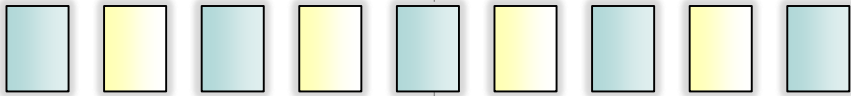
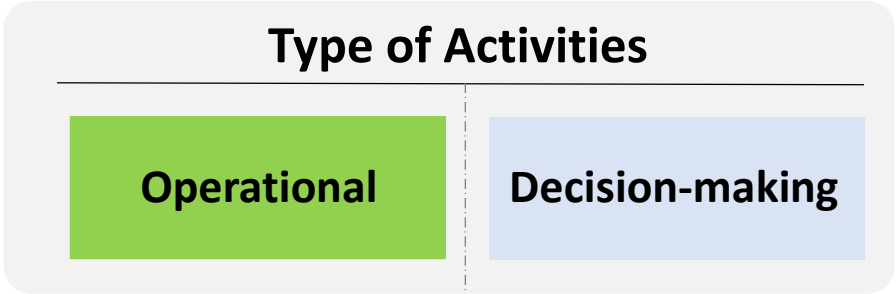


detail each activity

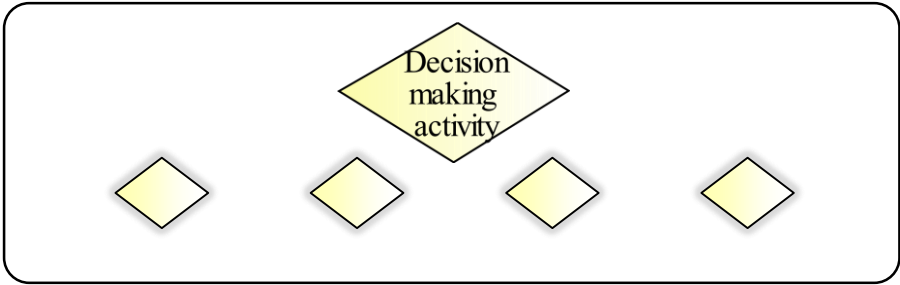
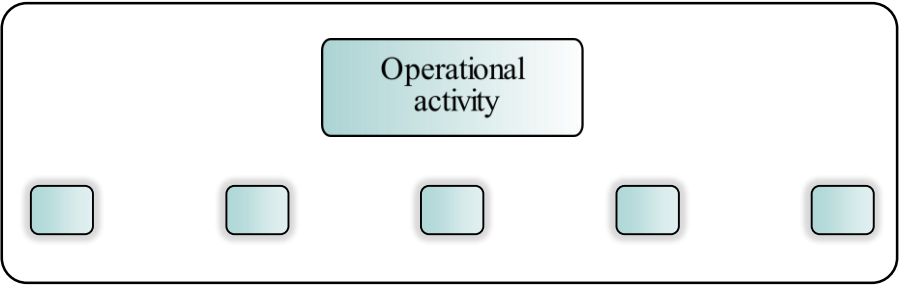
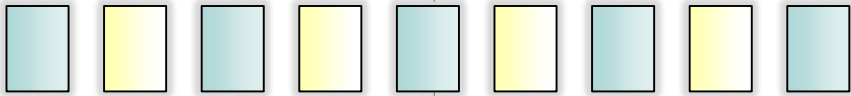
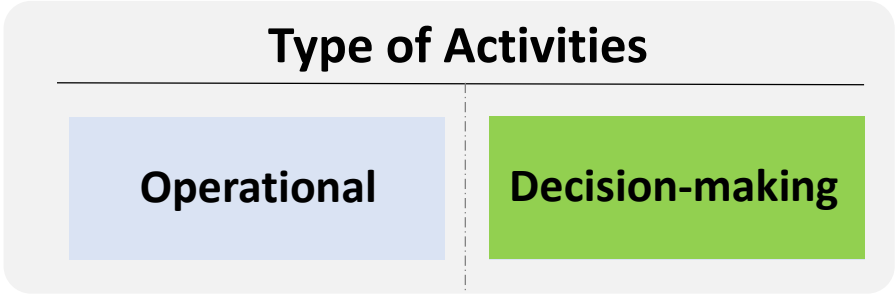
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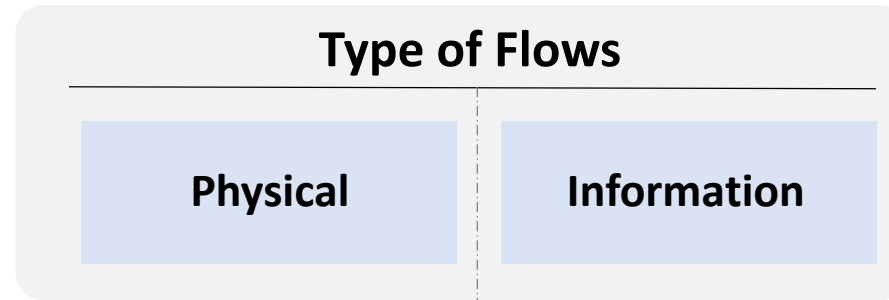


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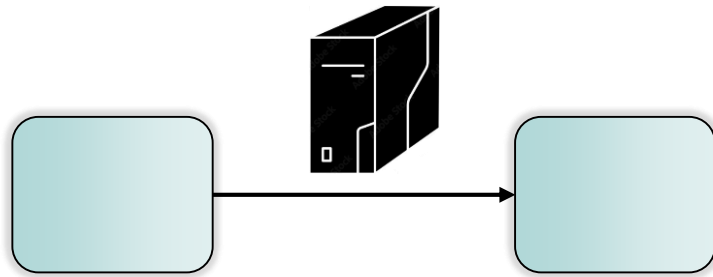
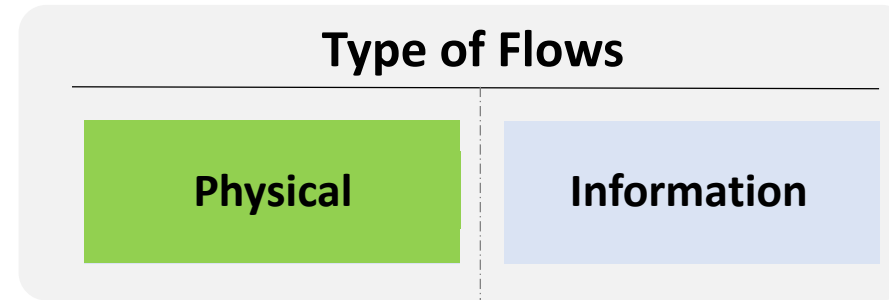




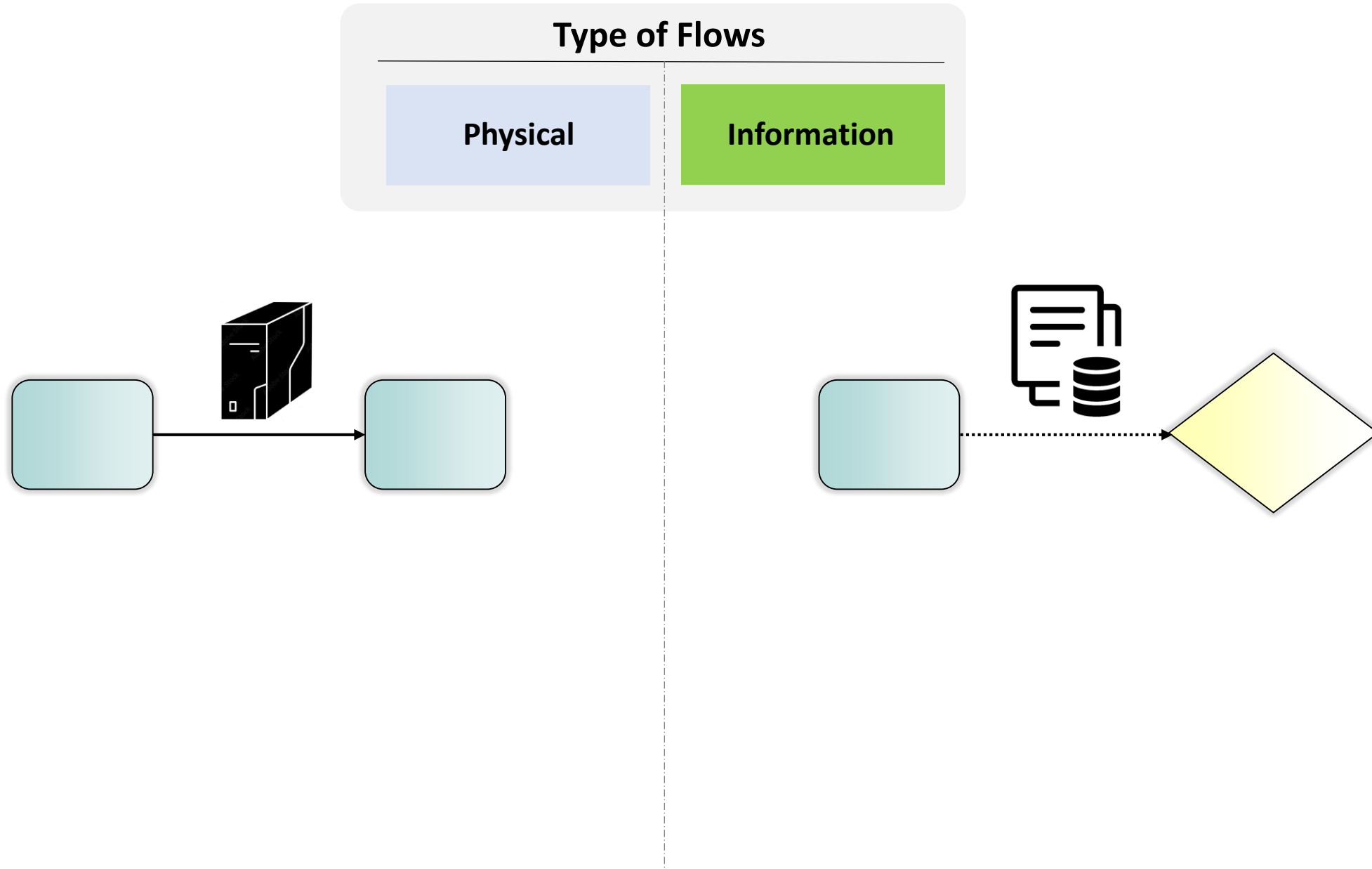
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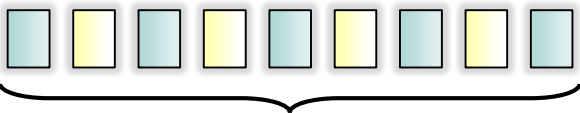
# Basics of the decision tree

## Modeling Languages

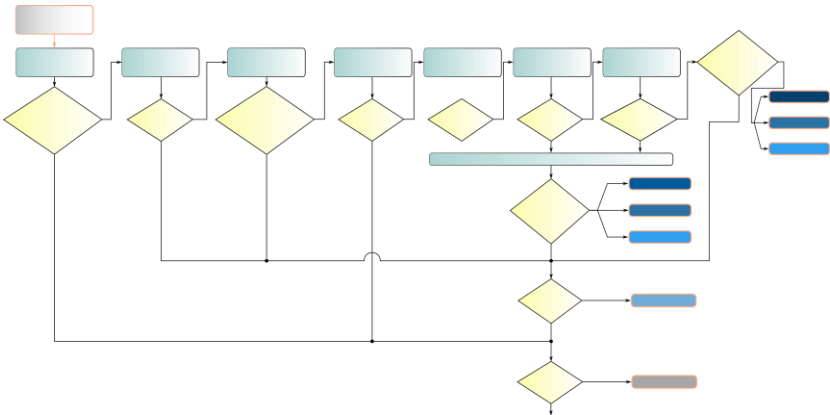
Flowchart

IDEF0

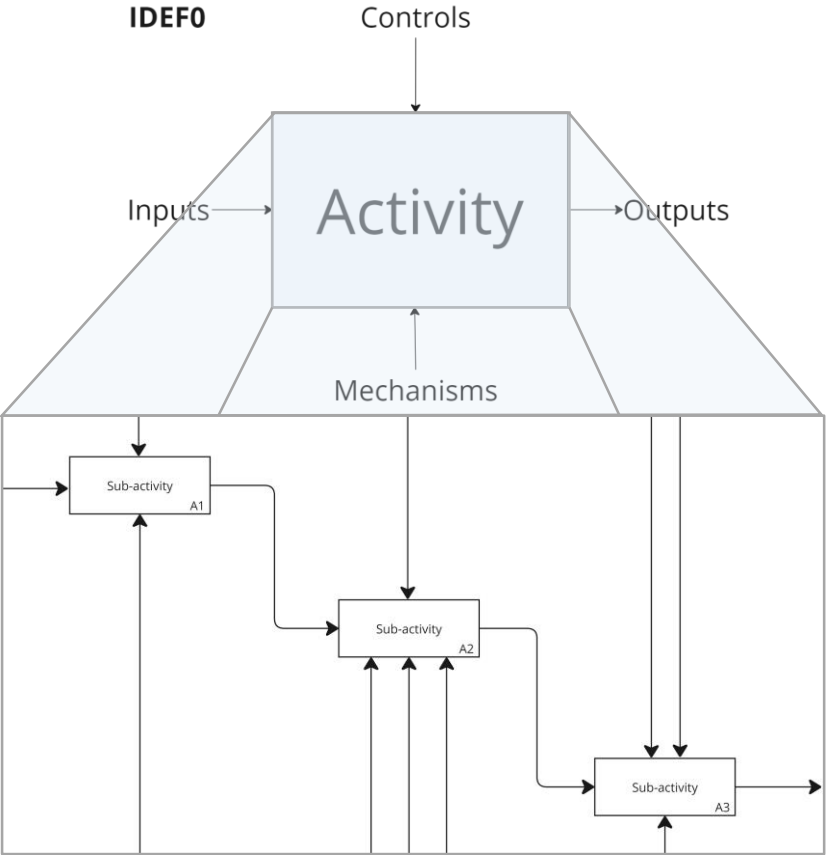
GRAI Net



smaller and manageable activities



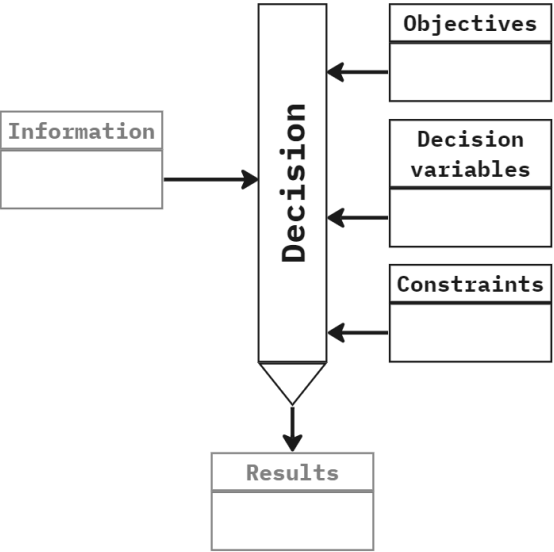
Conceptual level



Operational activity

Implementation level

## GRAI Model



Decision making activity

Implementation level

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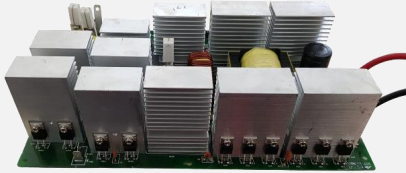
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## Received



**What to do**  
with these  
PE products



## R-Strategies

Direct reuse

Repair

Refurbish

Remanufacture

Repurpose

Reuse comp.

Recycling



# Decision Tree

Reception of  
collected EoU  
PE products



Reuse

Refurbish

Remanufacture

Repair

Refurbish

Remanufacture

Repurpose

Reuse comp.

Legend

Entry and  
exit point

Consider recycling  
option for  
material recovery

# Decision Tree

Reception of  
collected EoU  
PE products

Entry point

Exit points

Reuse

Refurbish

Remanufacture

Repair

Refurbish

Remanufacture

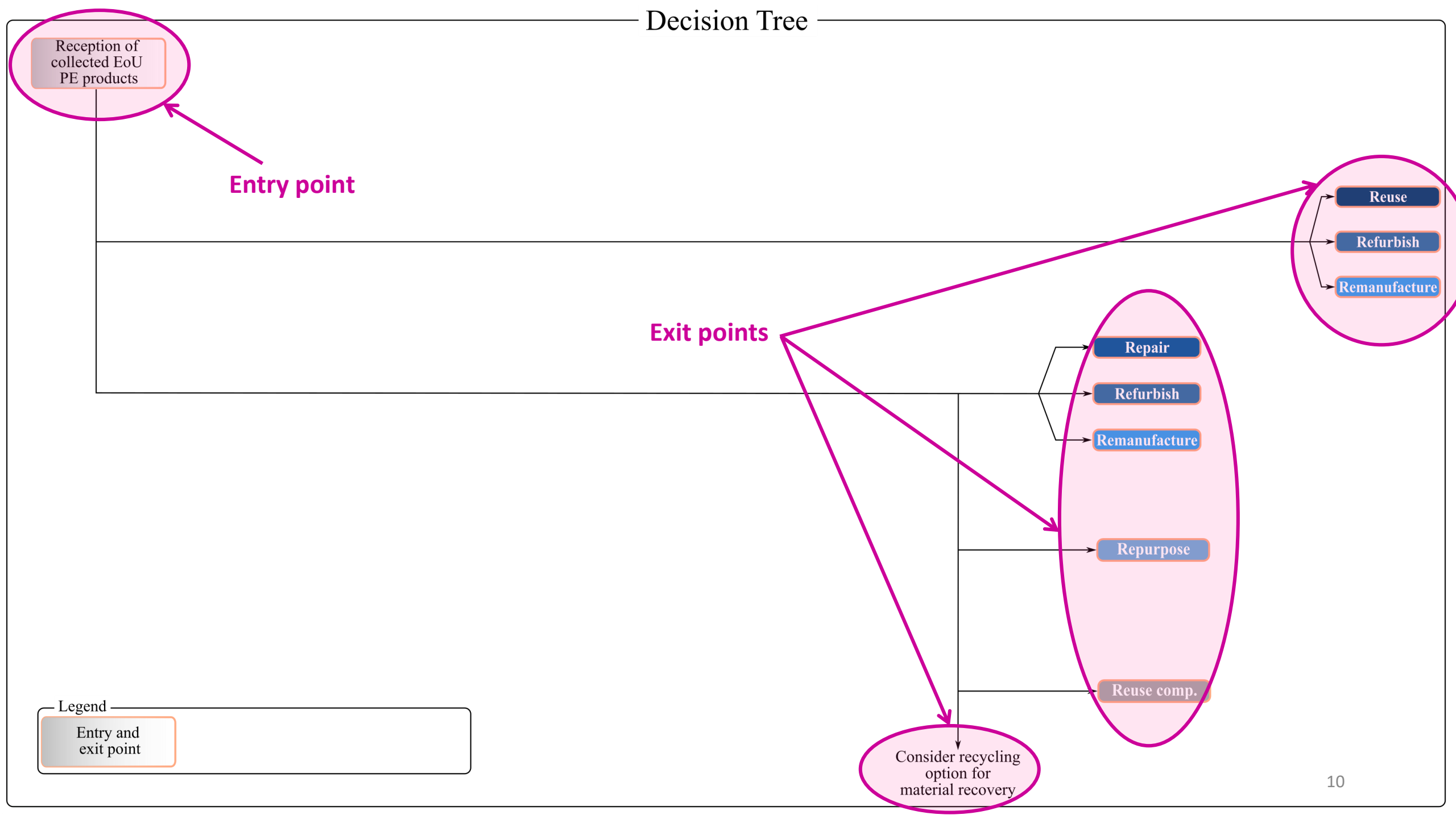
Repurpose

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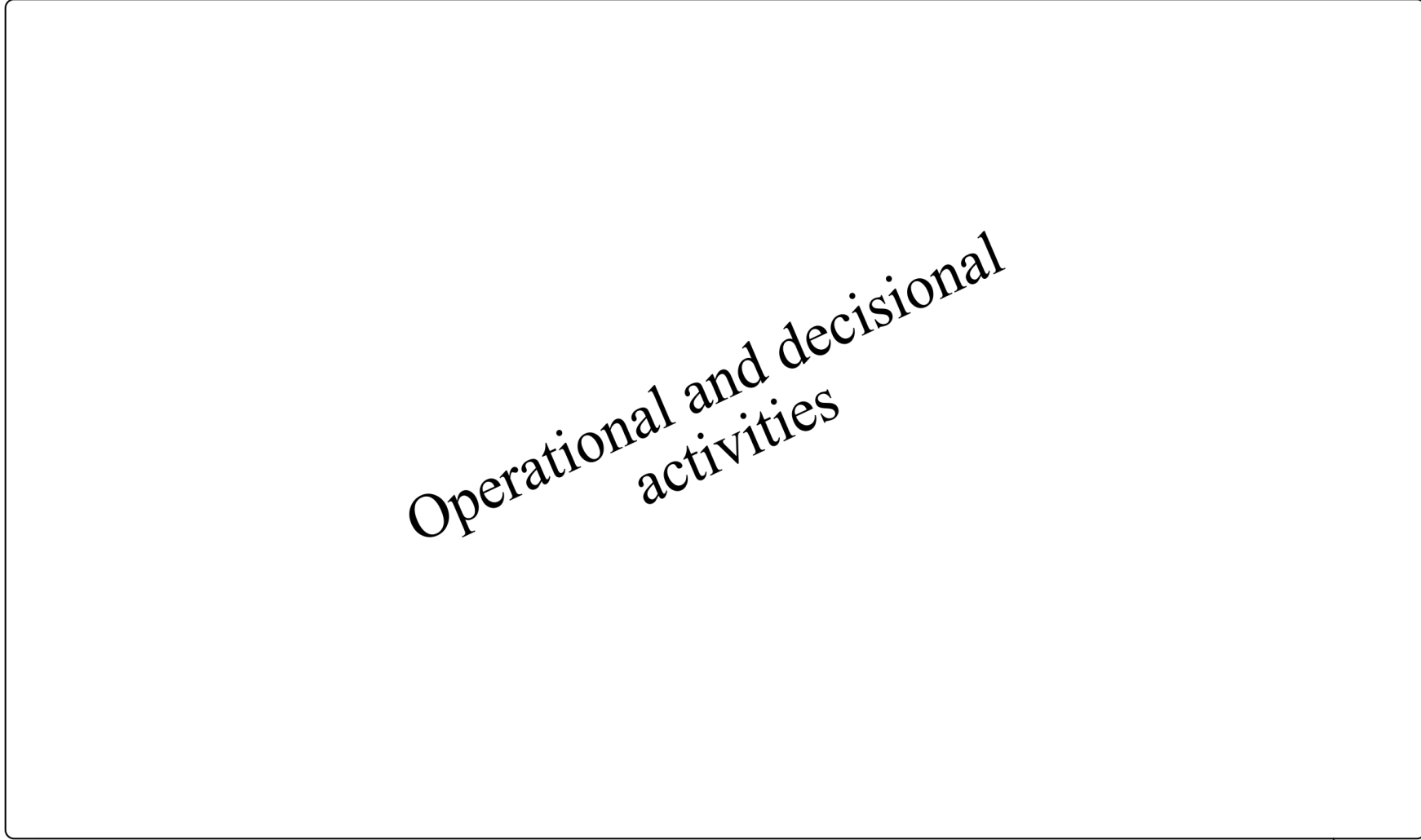
Legend

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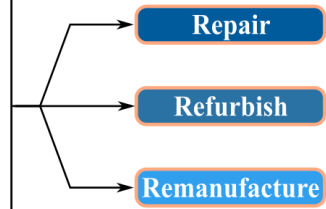
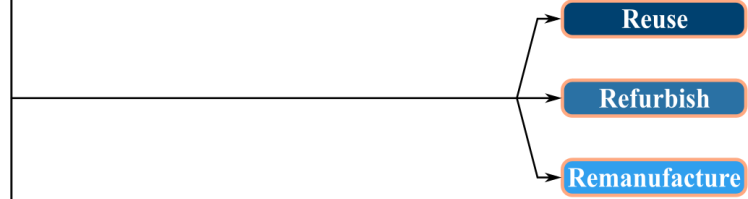
Reception of  
collected EoU  
PE products



Operational and decisional  
activities

## Legend

Entry and  
exit point



Repurpose

Reuse comp.

Consider recycling  
option for  
material recovery

# Decision Tree

Reception of  
collected EoU  
PE products

## Main activities identified:

**Identifying the  
product addressed**

**Residual value  
assessment**

- Reasons of EoU
- Market value
- Remaining useful  
lifetime
- Recall list
- Market entry  
requirements

**In-coming diagnosis  
to assess  
functionality**

- Visual inspection
- Power-on test
- Safety test
- Functional test
- Diagnosis

**Viability of  
R-strategy  
implementations**

Reuse

Refurbish

Remanufacture

Repair

Refurbish

Remanufacture

Repurpose

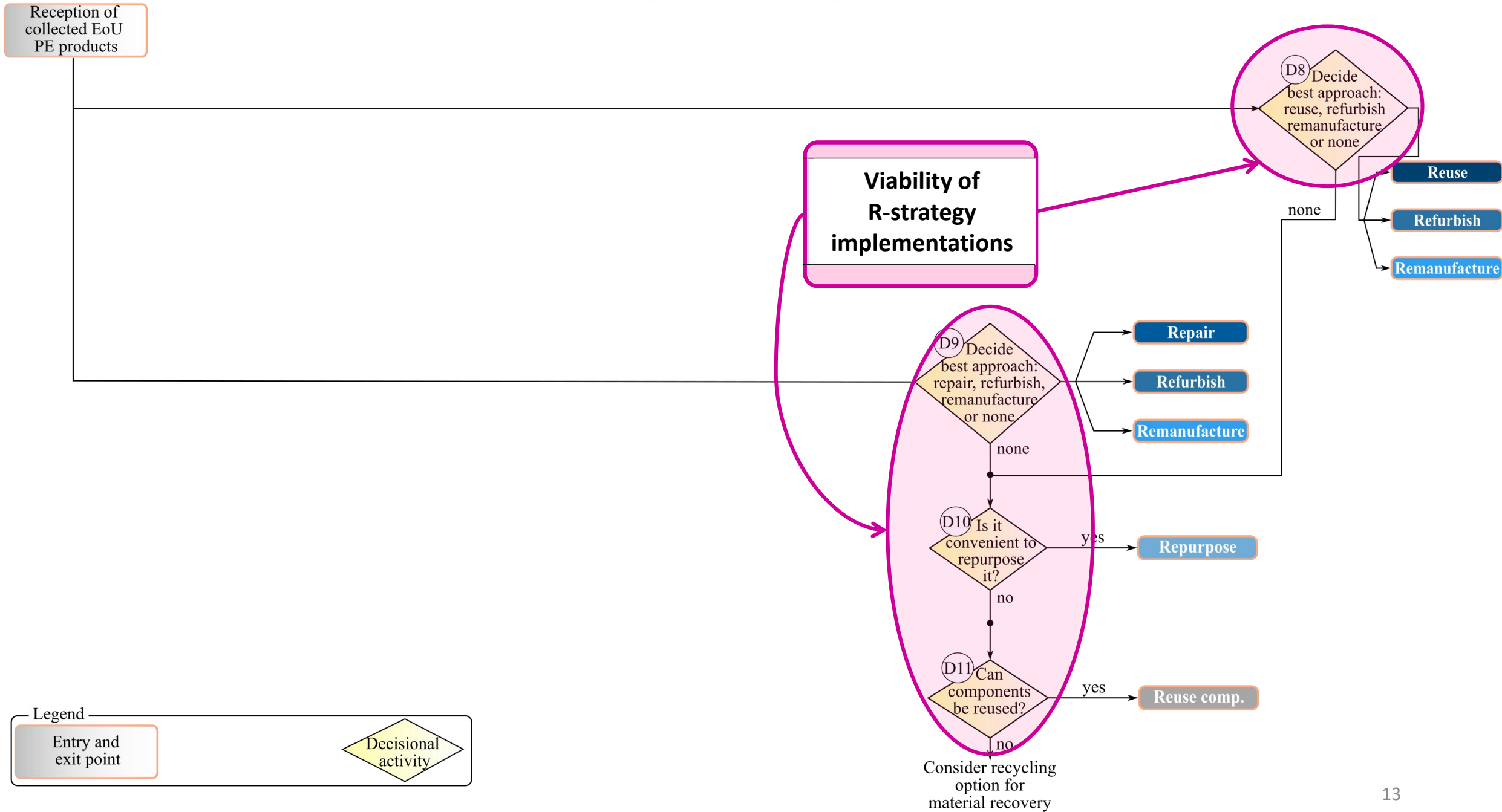
Reuse comp.

## Legend

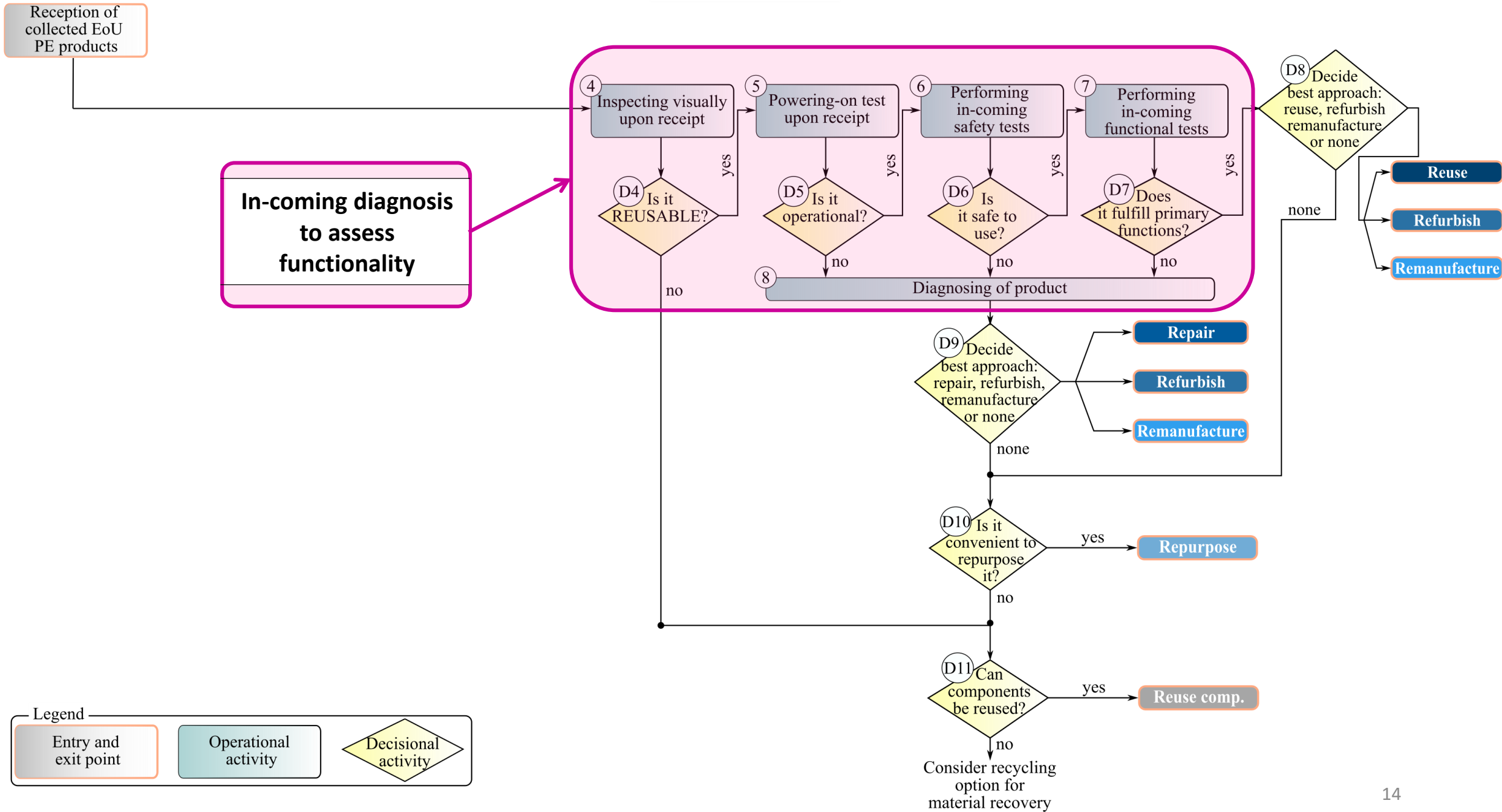
Entry and  
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Consider recycling  
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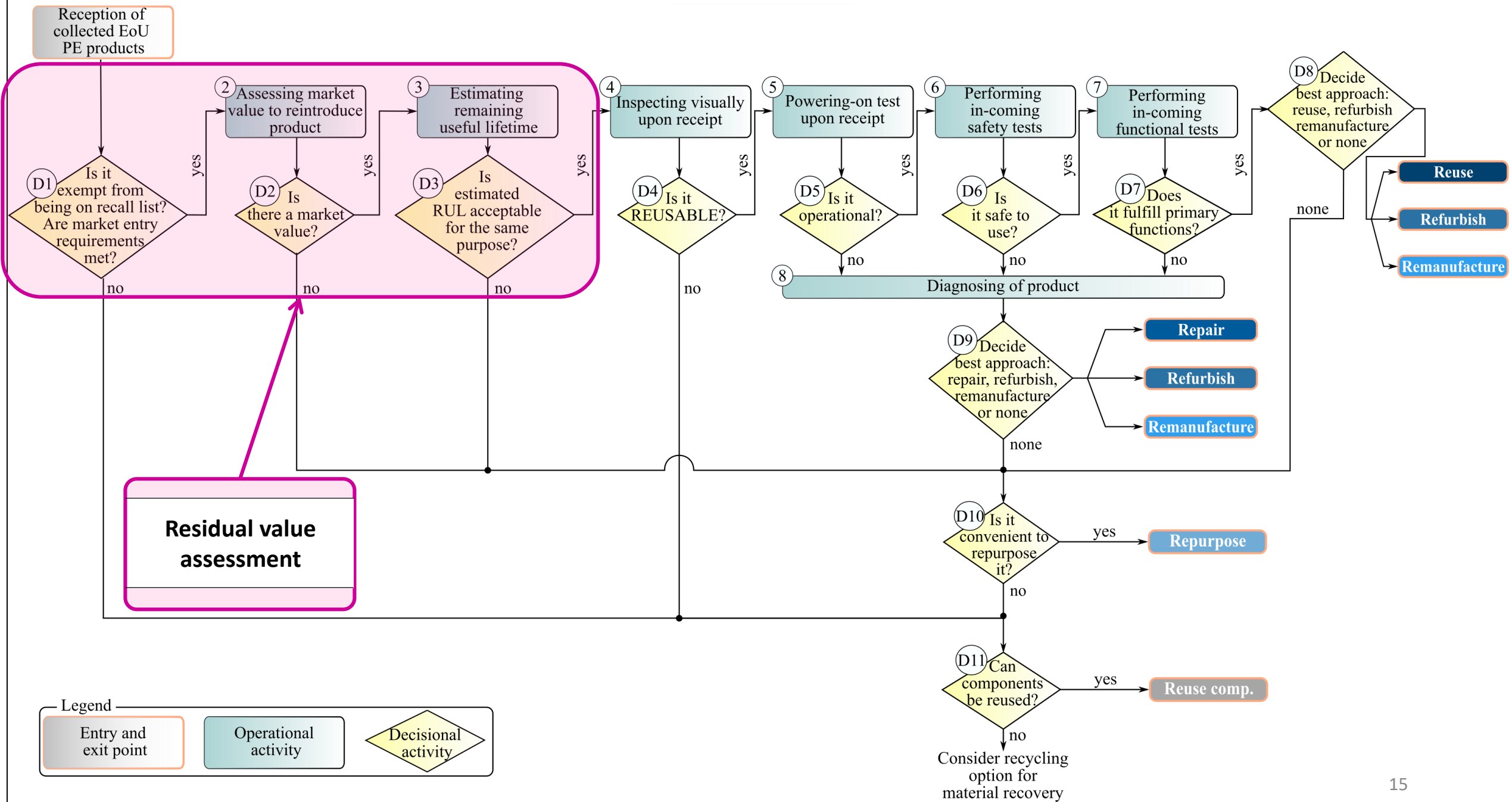


# Decision Tree





# Decision Tree



# Decision Tree

## Identifying the product addressed

Reception of collected EoU PE products

1 Identifying and collecting data

2 Assessing market value to reintroduce product

3 Estimating remaining useful lifetime

4 Inspecting visually upon receipt

5 Powering-on test upon receipt

6 Performing in-coming safety tests

7 Performing in-coming functional tests

D8 Decide best approach: reuse, refurbish or none

Reuse

Refurbish

Remanufacture

D1 Is it exempt from being on recall list? Are market entry requirements met?

D2 Is there a market value?

D3 Is estimated RUL acceptable for the same purpose?

D4 Is it REUSABLE?

D5 Is it operational?

D6 Is it safe to use?

D7 Does it fulfill primary functions?

8 Diagnosing of product

D9 Decide best approach: repair, refurbish, remanufacture or none

Repair

Refurbish

Remanufacture

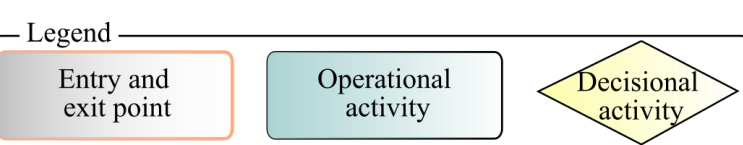
D10 Is it convenient to repurpose it?

Repurpose

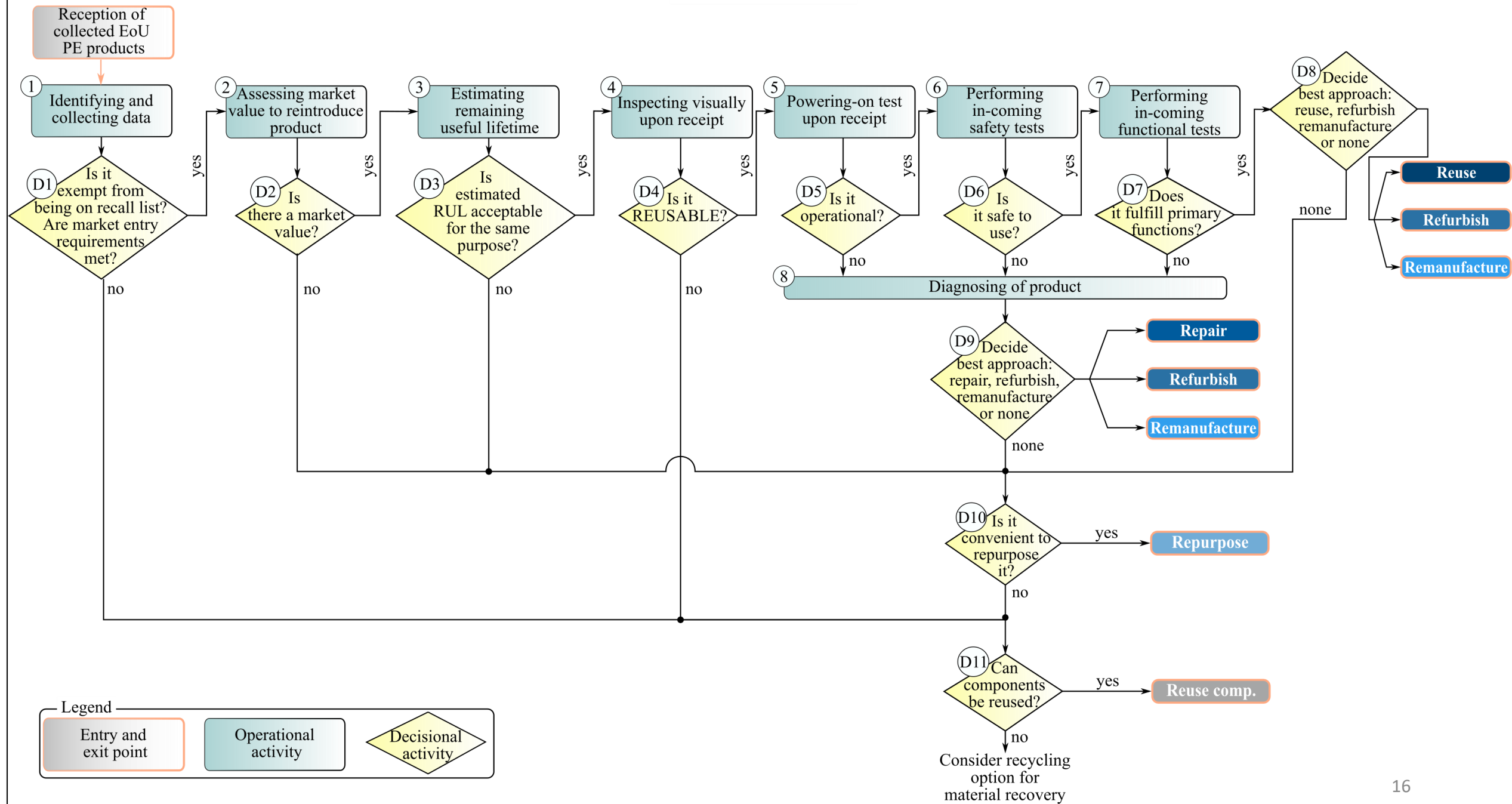
D11 Can components be reused?

Reuse comp.

Consider recycling option for material recovery



# Decision Tree



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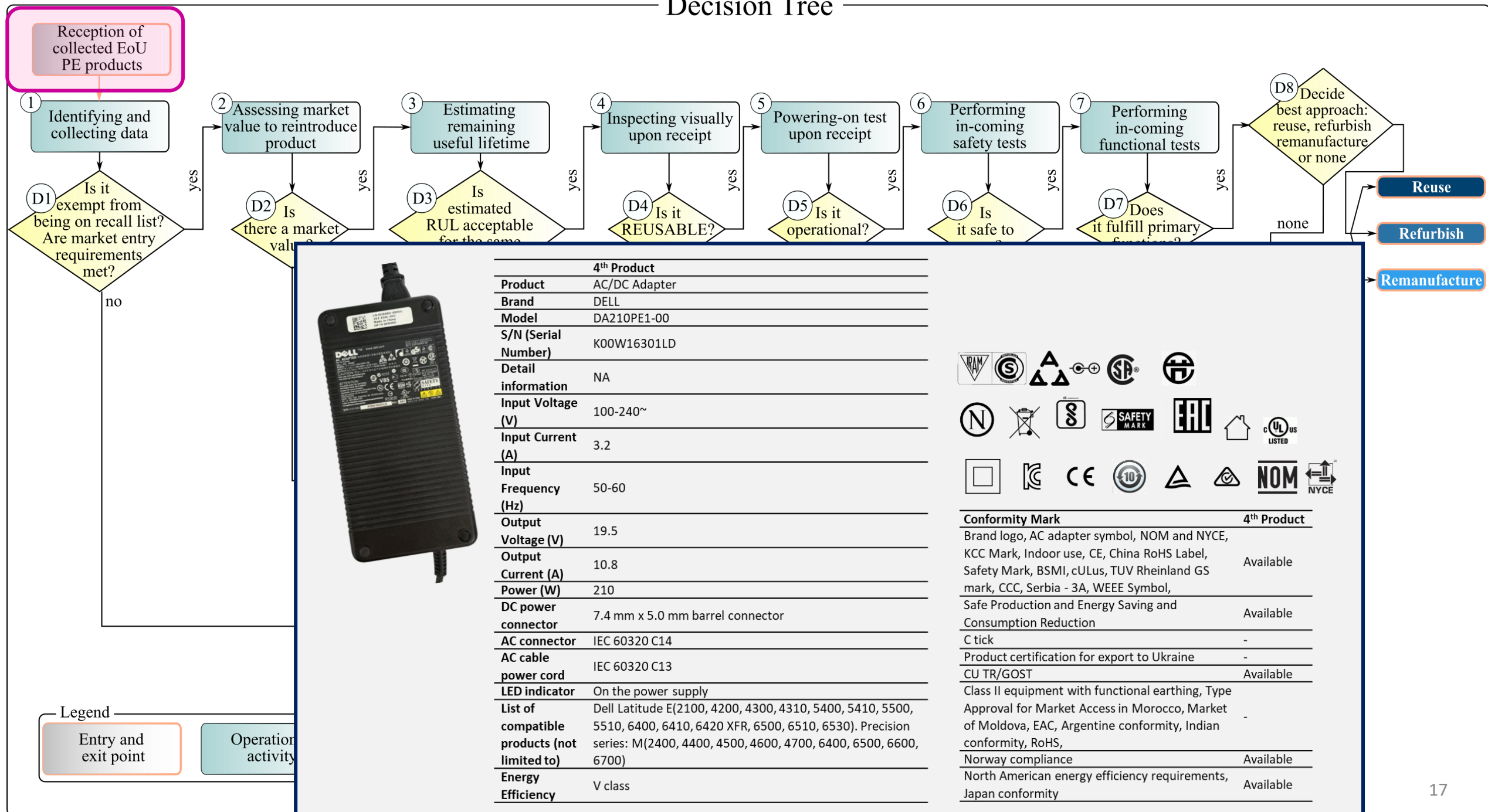
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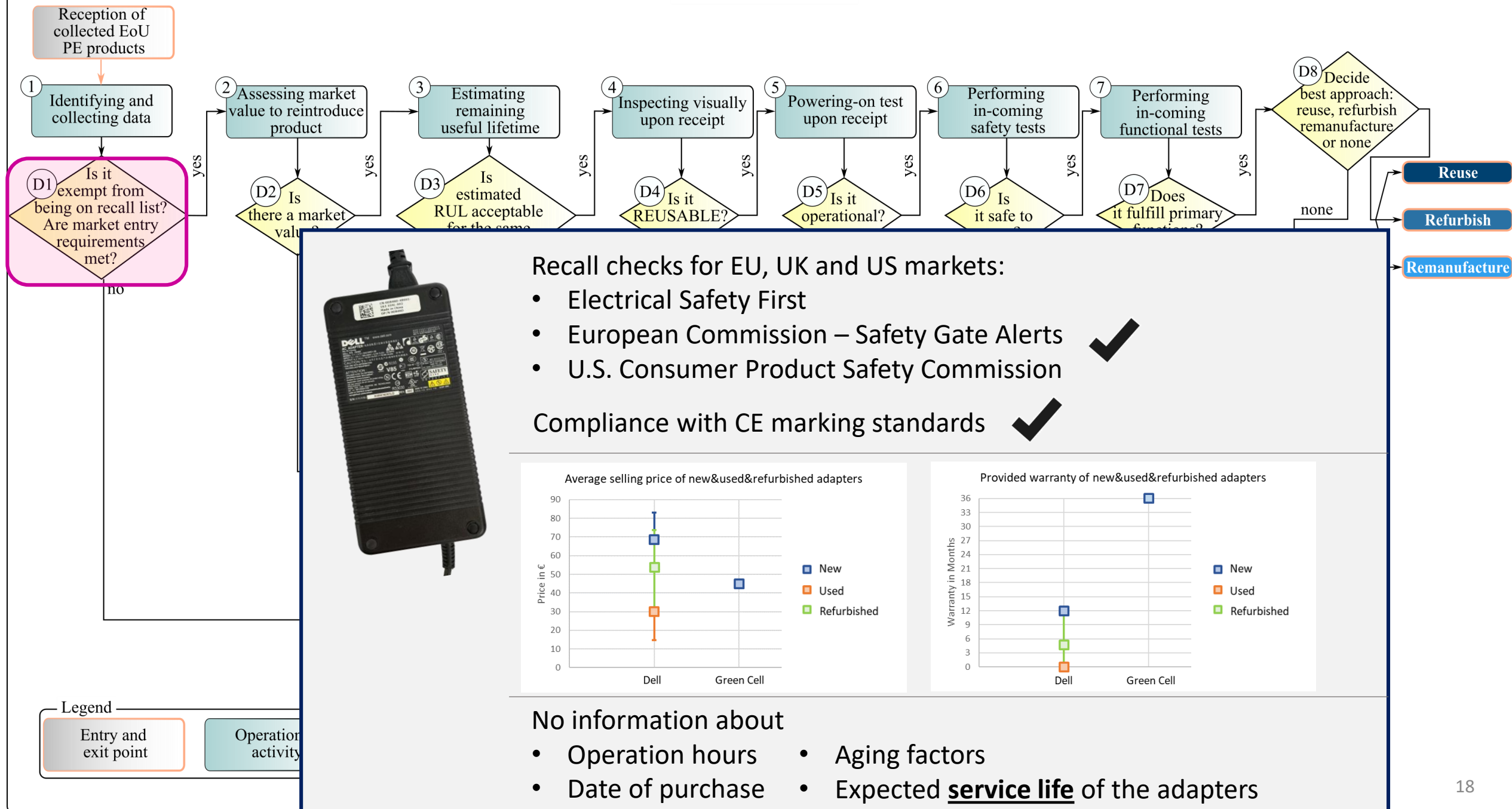
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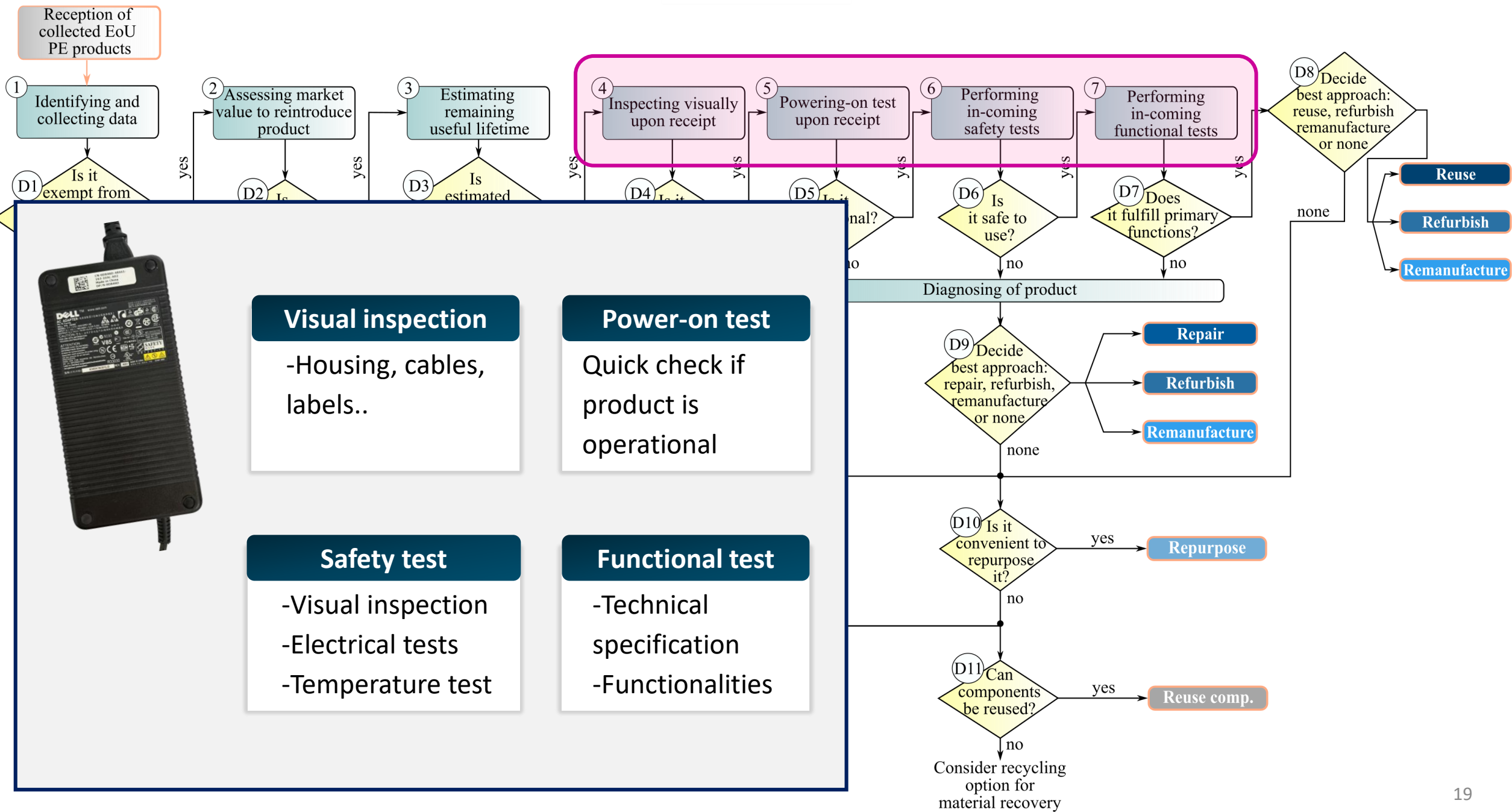


# Decision Tree





# Decision Tree





### Visual inspection

-Housing, cables, labels..

### Power-on test

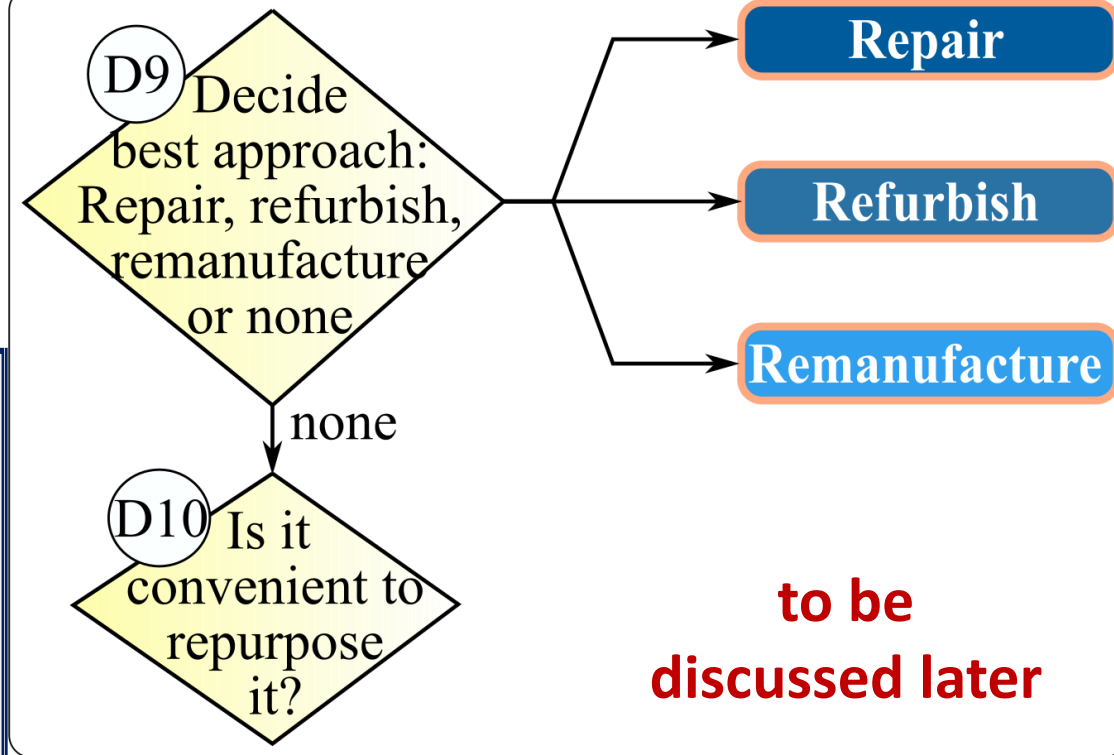
Quick check if product is operational

### Safety test

-Visual inspection  
-Electrical tests  
-Temperature test

### Functional test

-Technical specification  
-Functionalities





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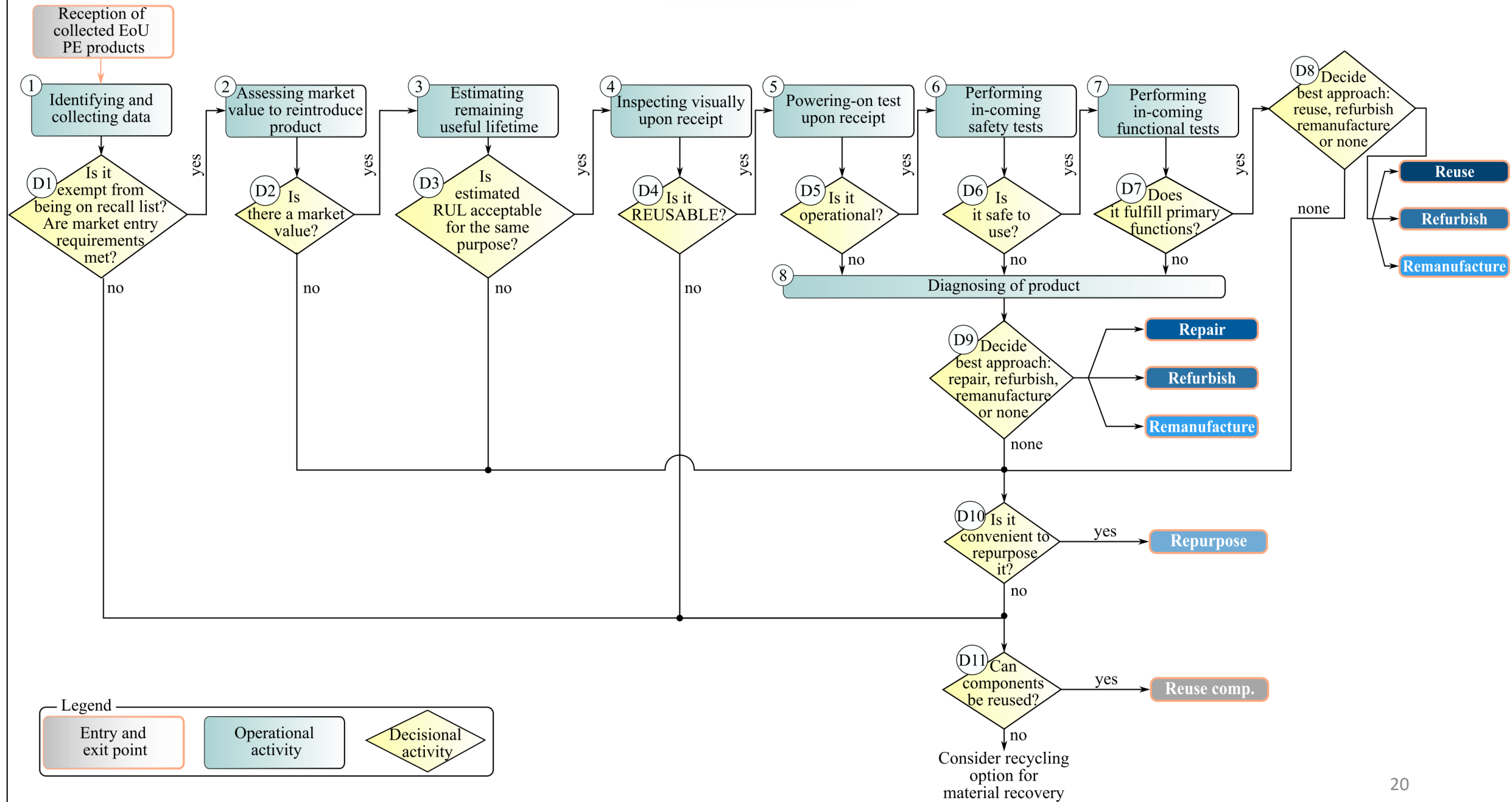
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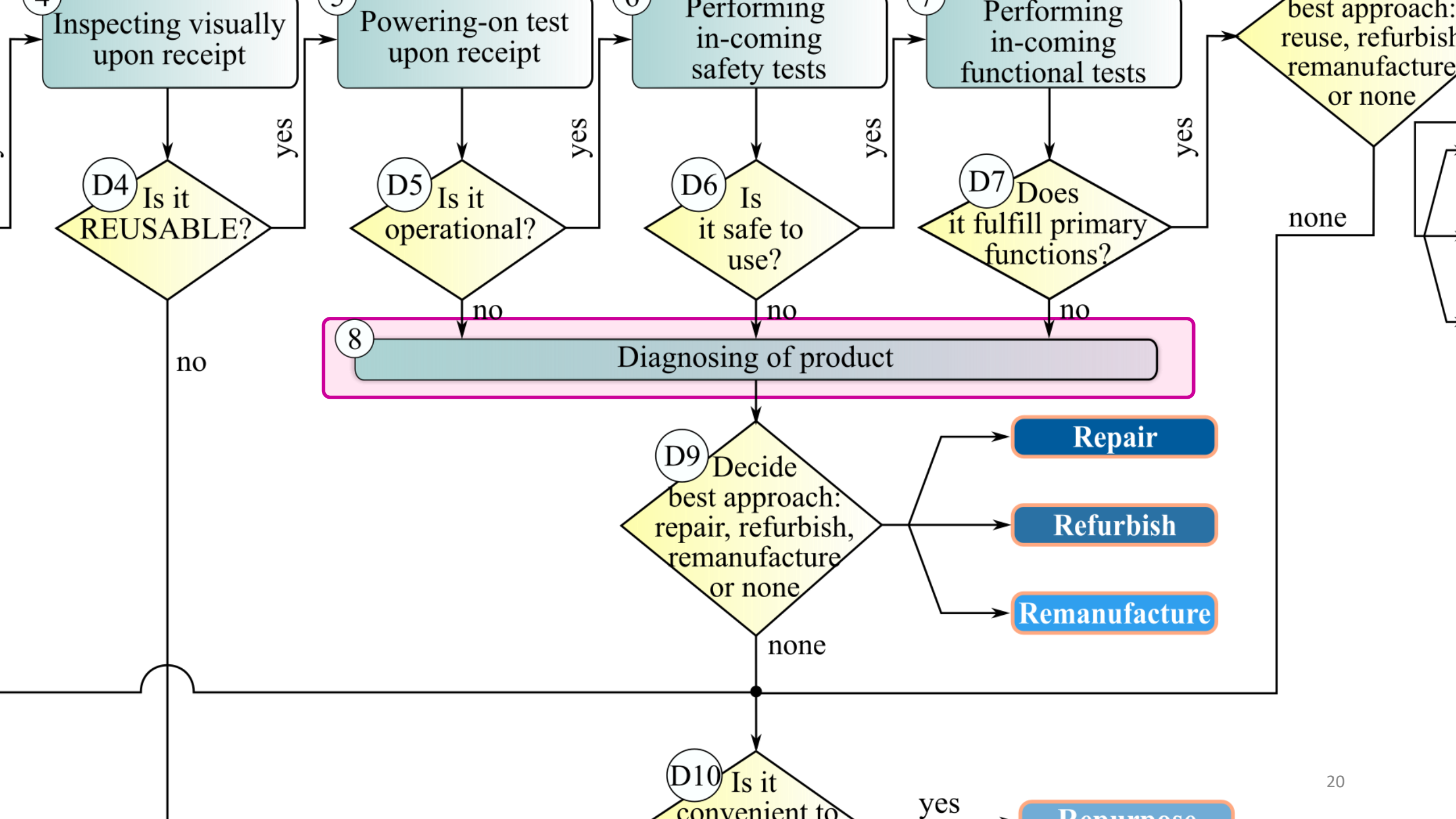
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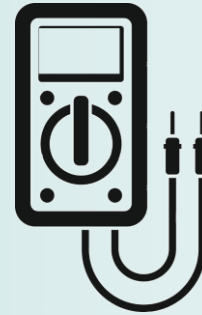
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# Decision Tree



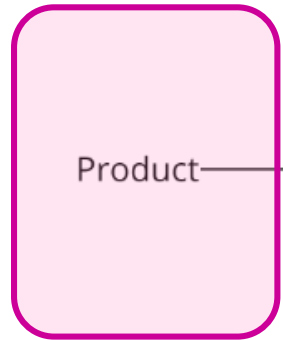


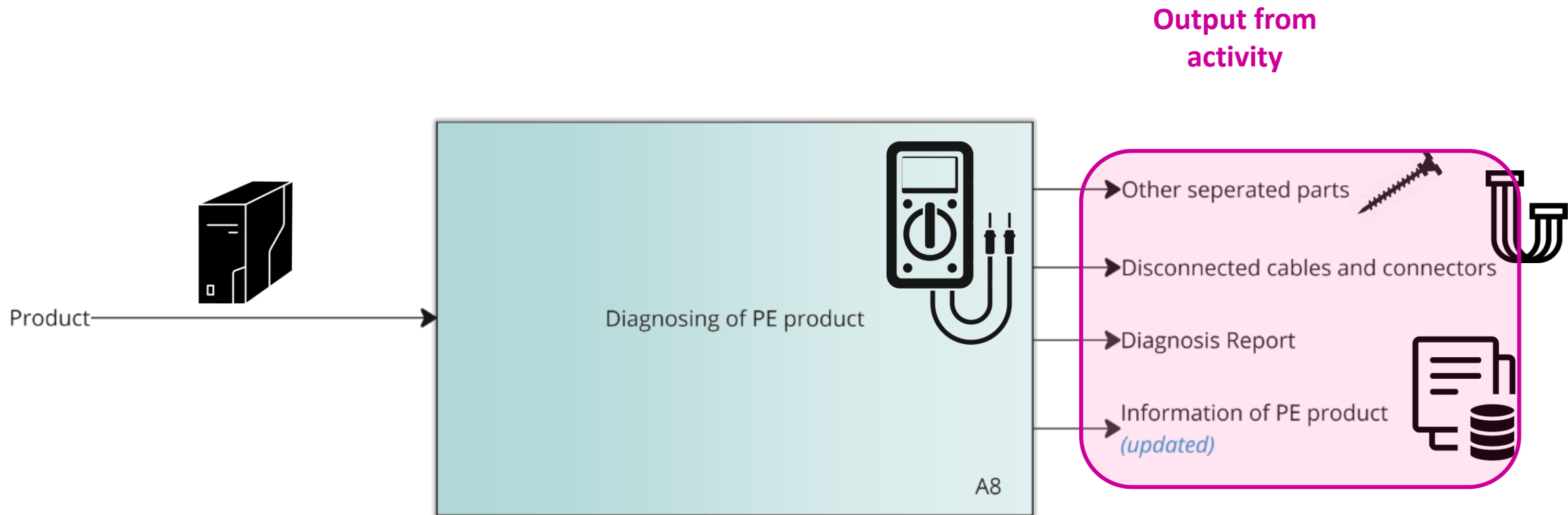
Diagnosing of PE product

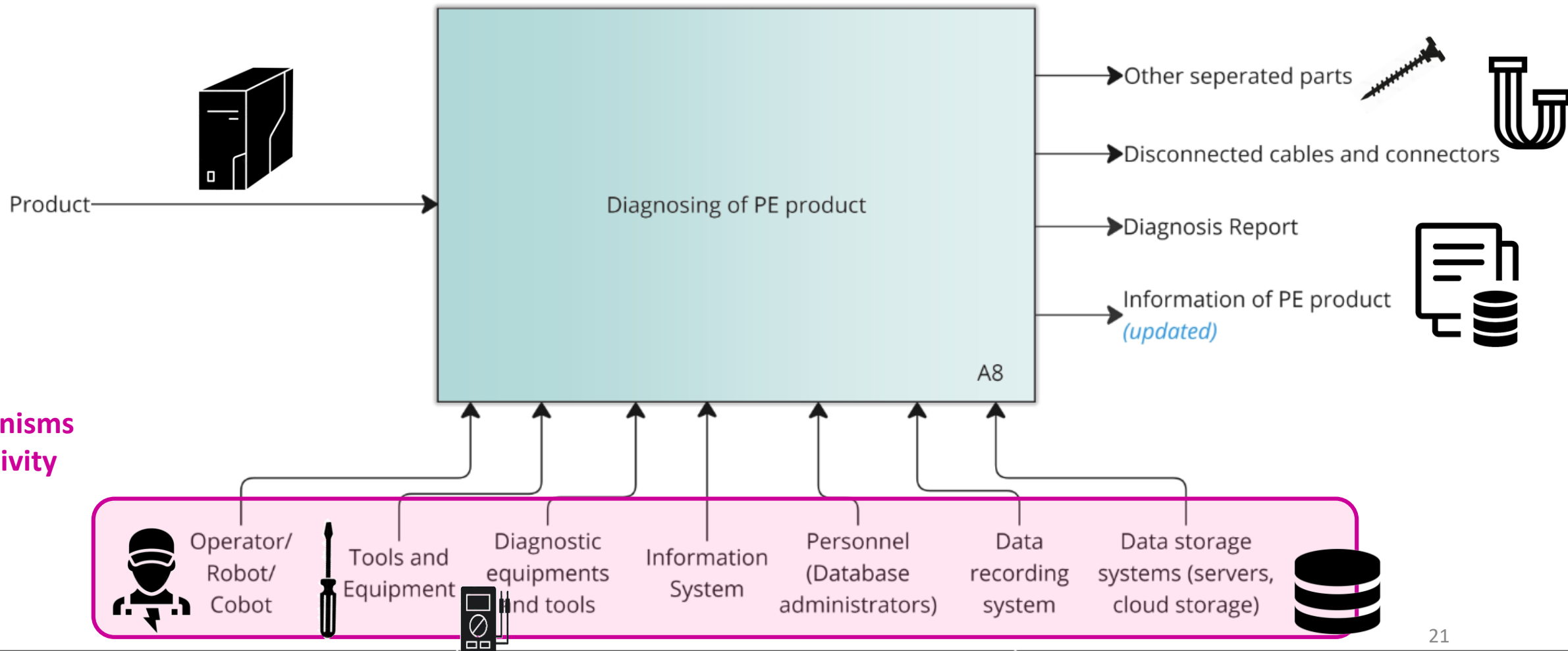


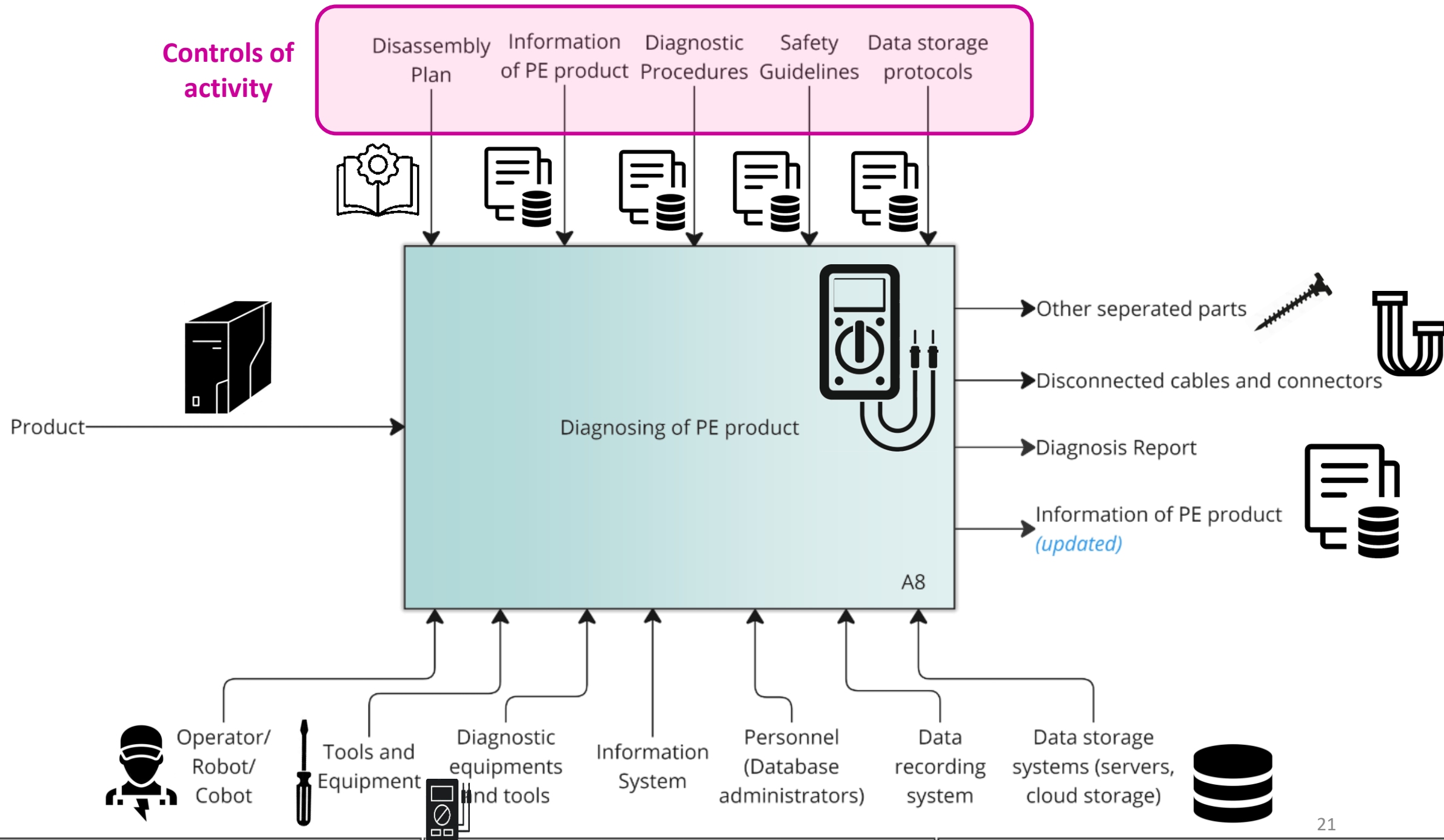
A8

Inputs to  
activity

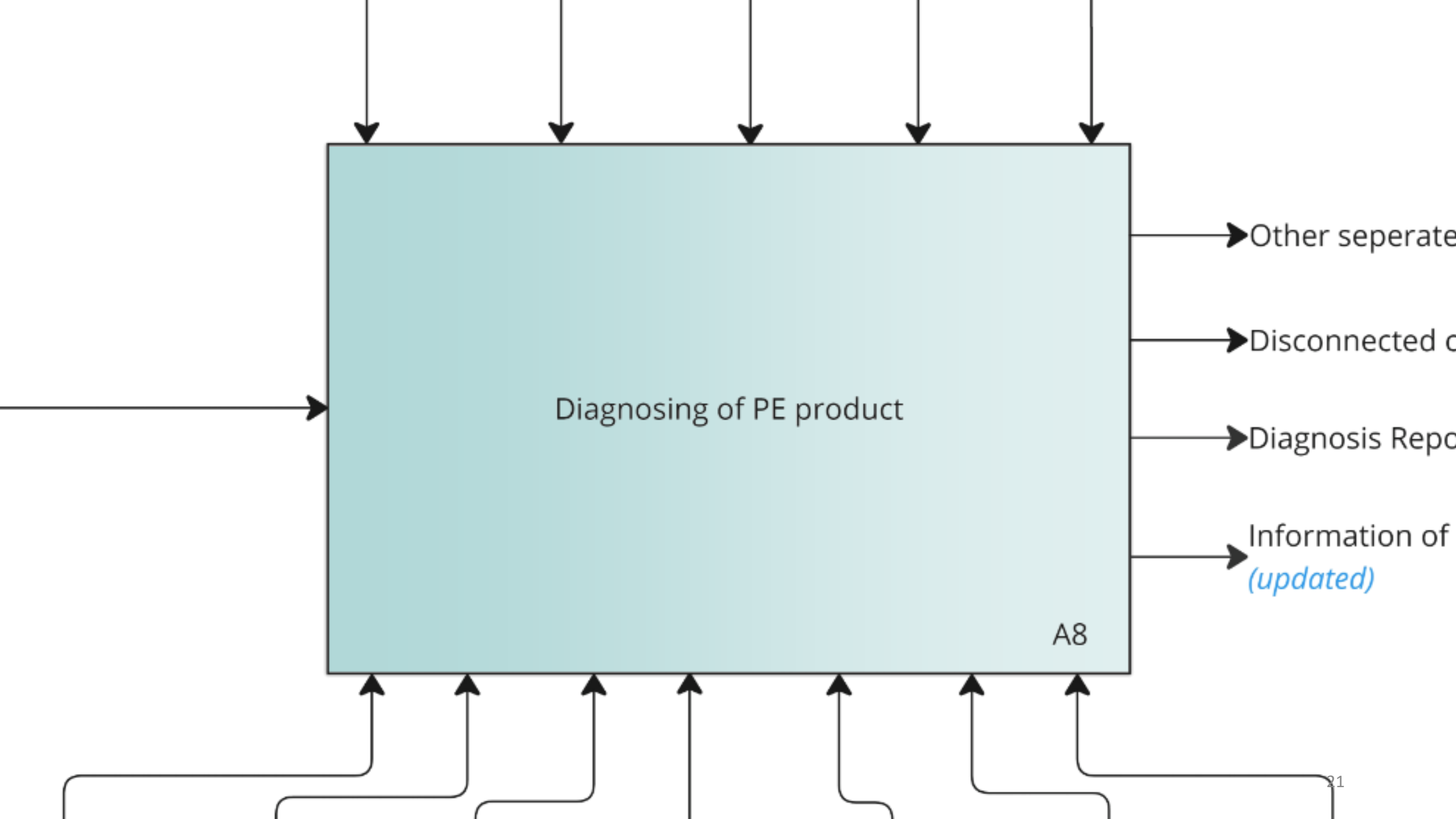


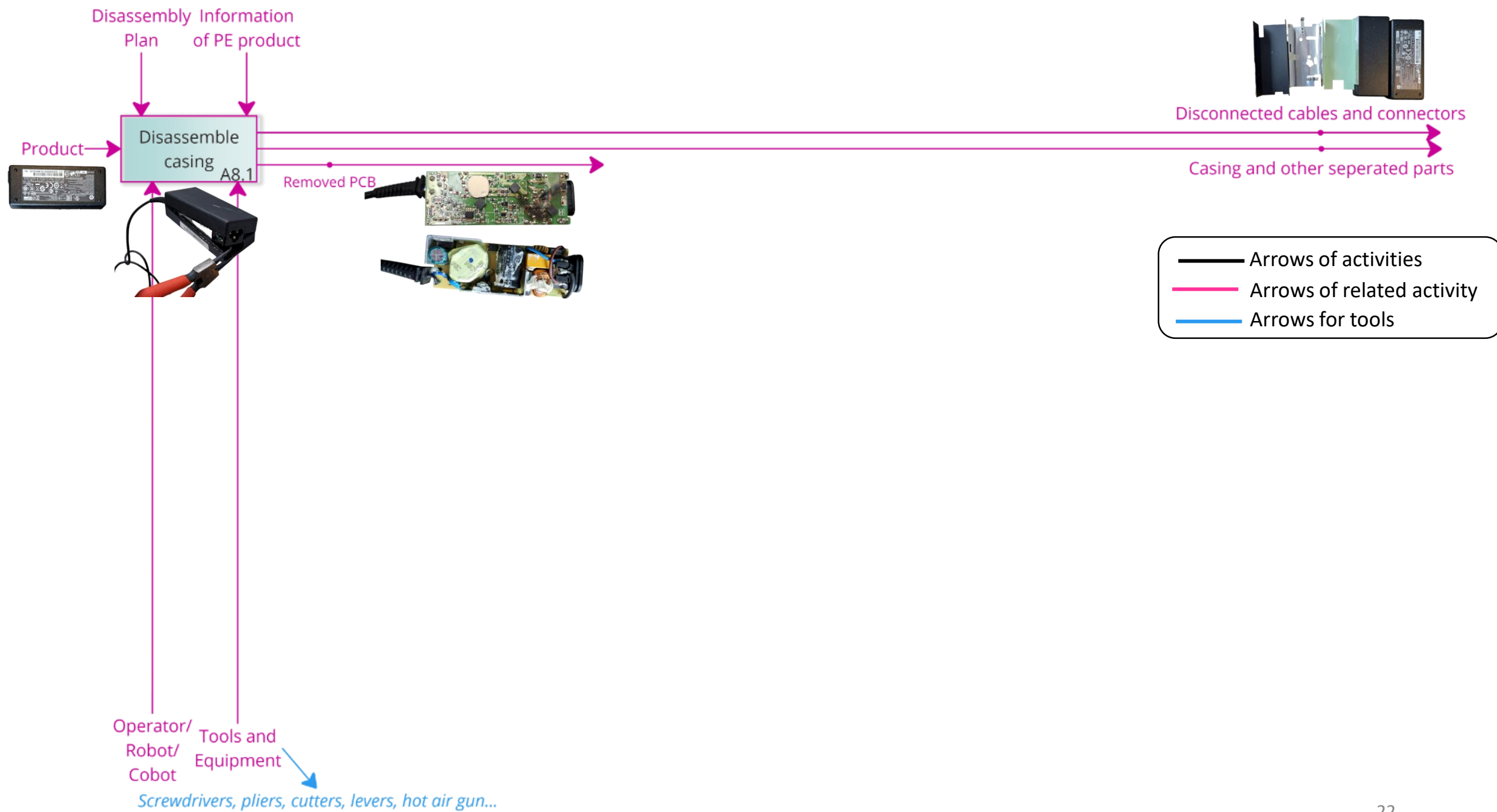


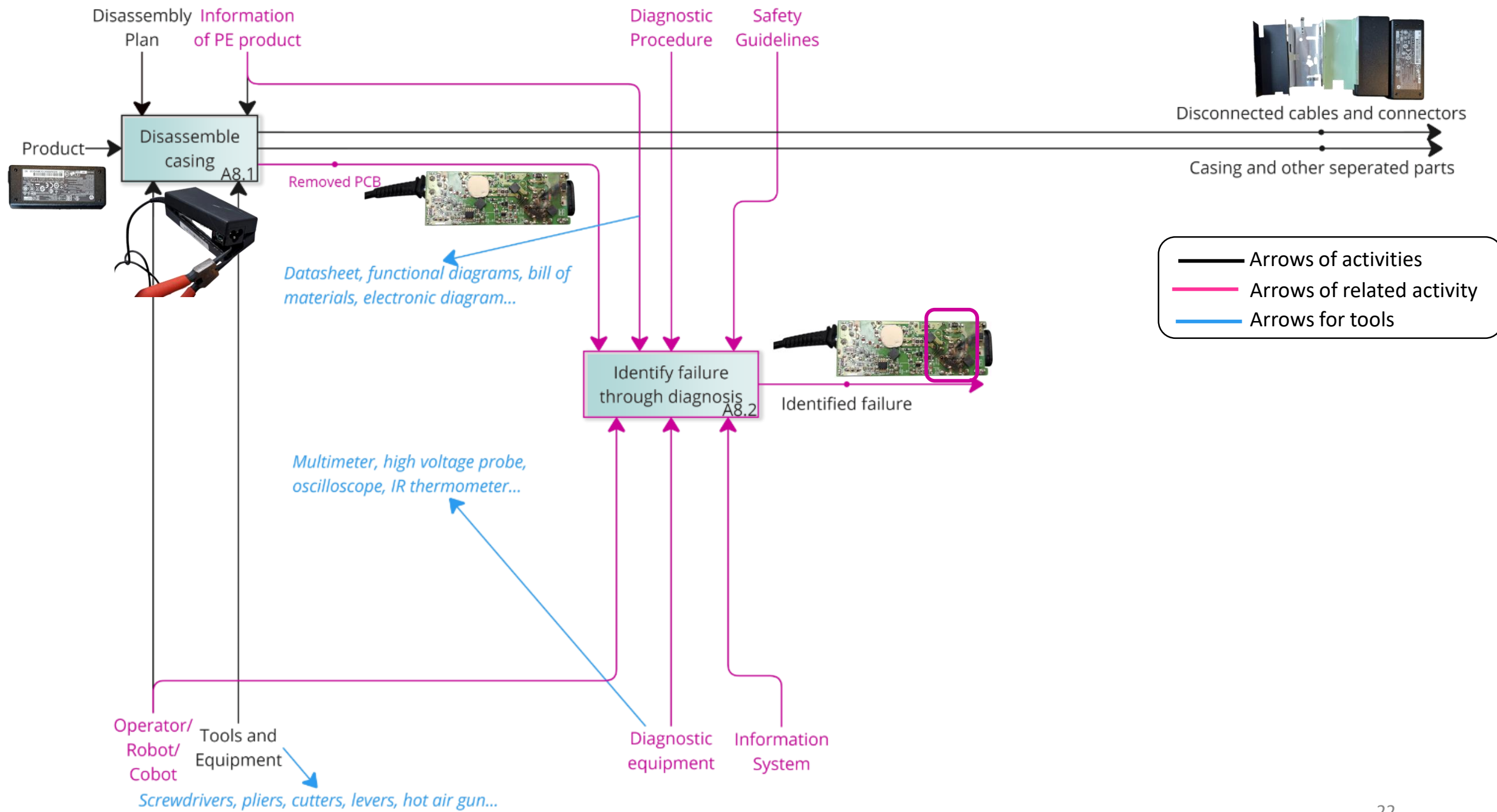


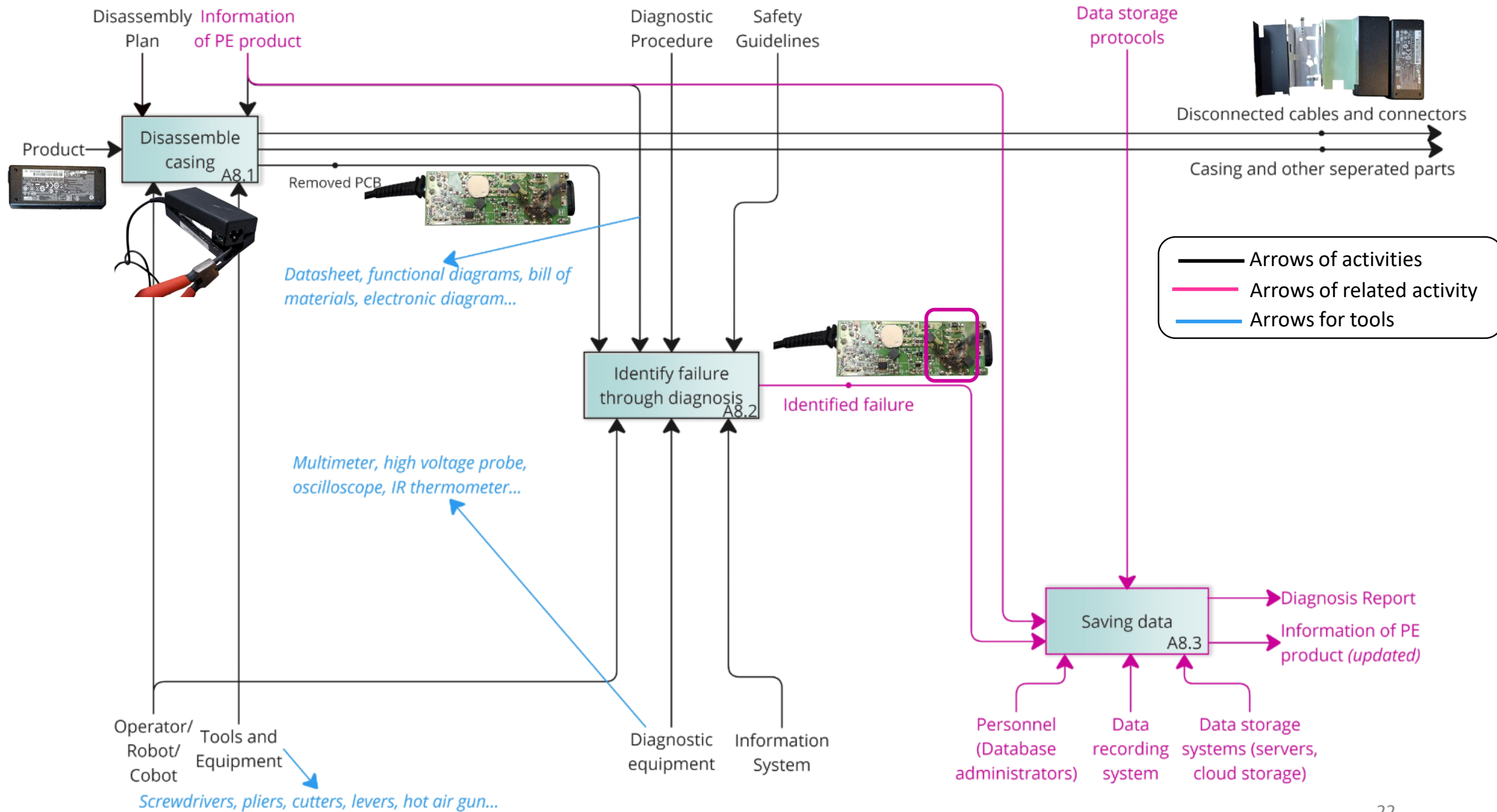




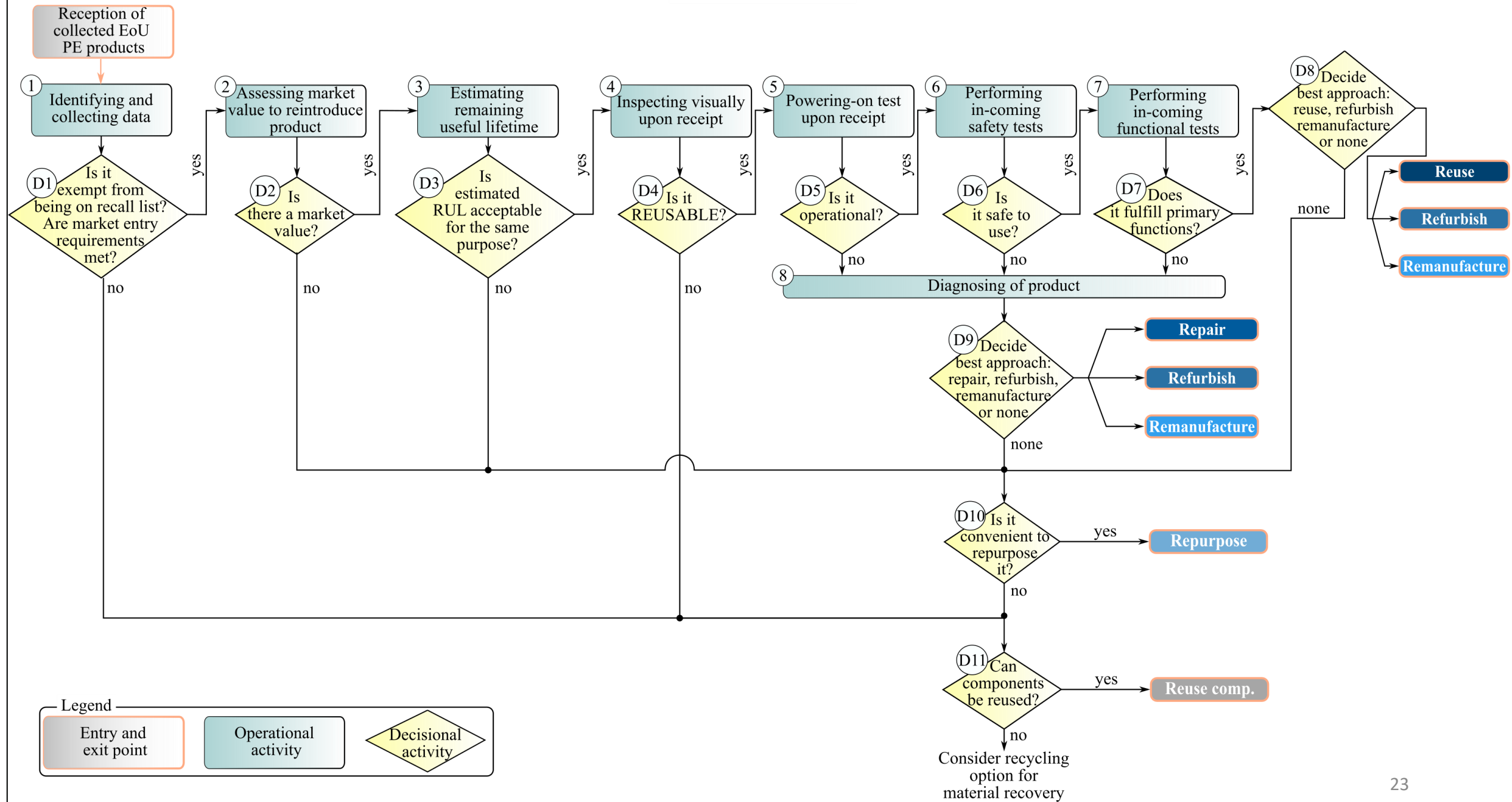


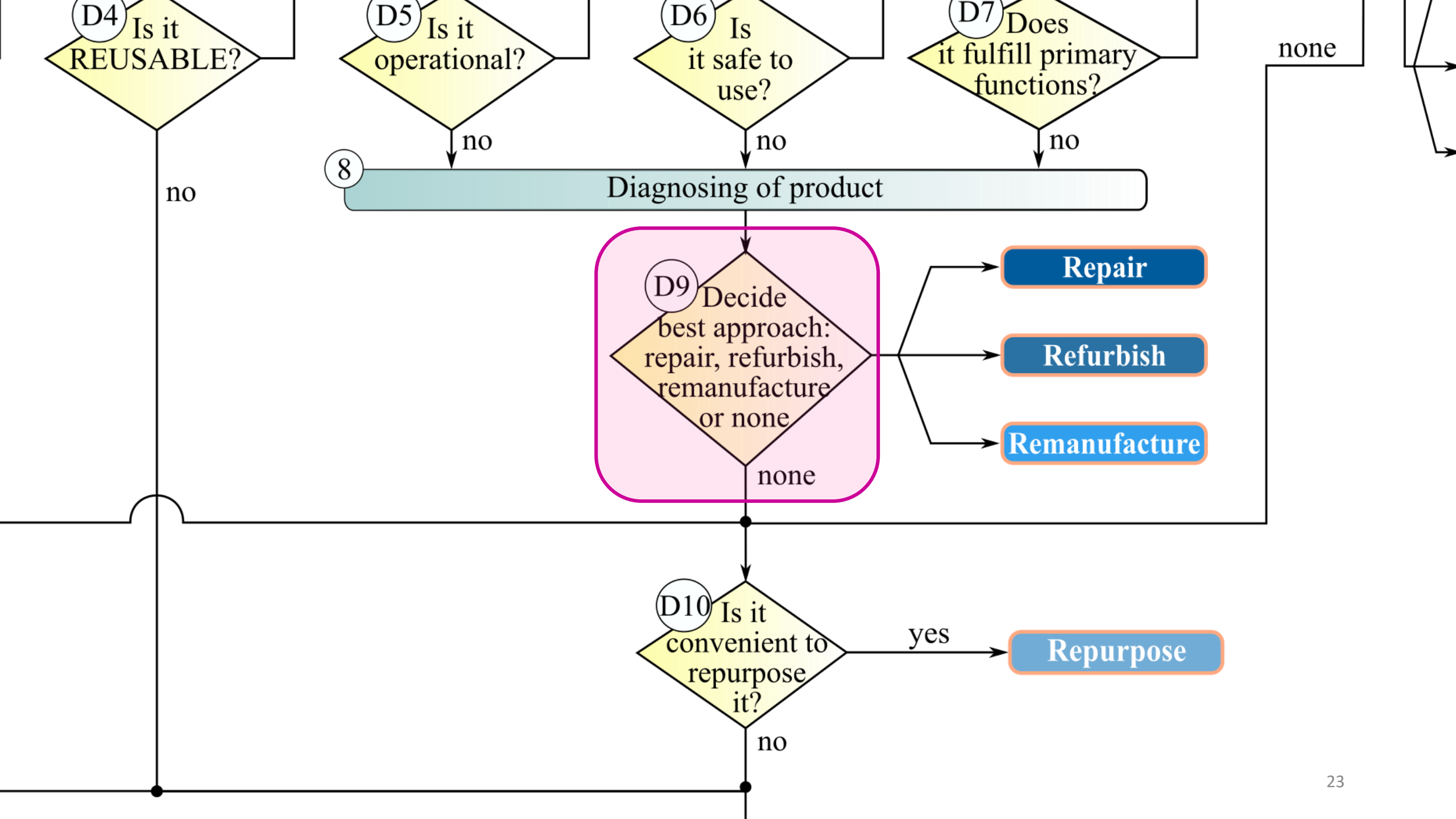


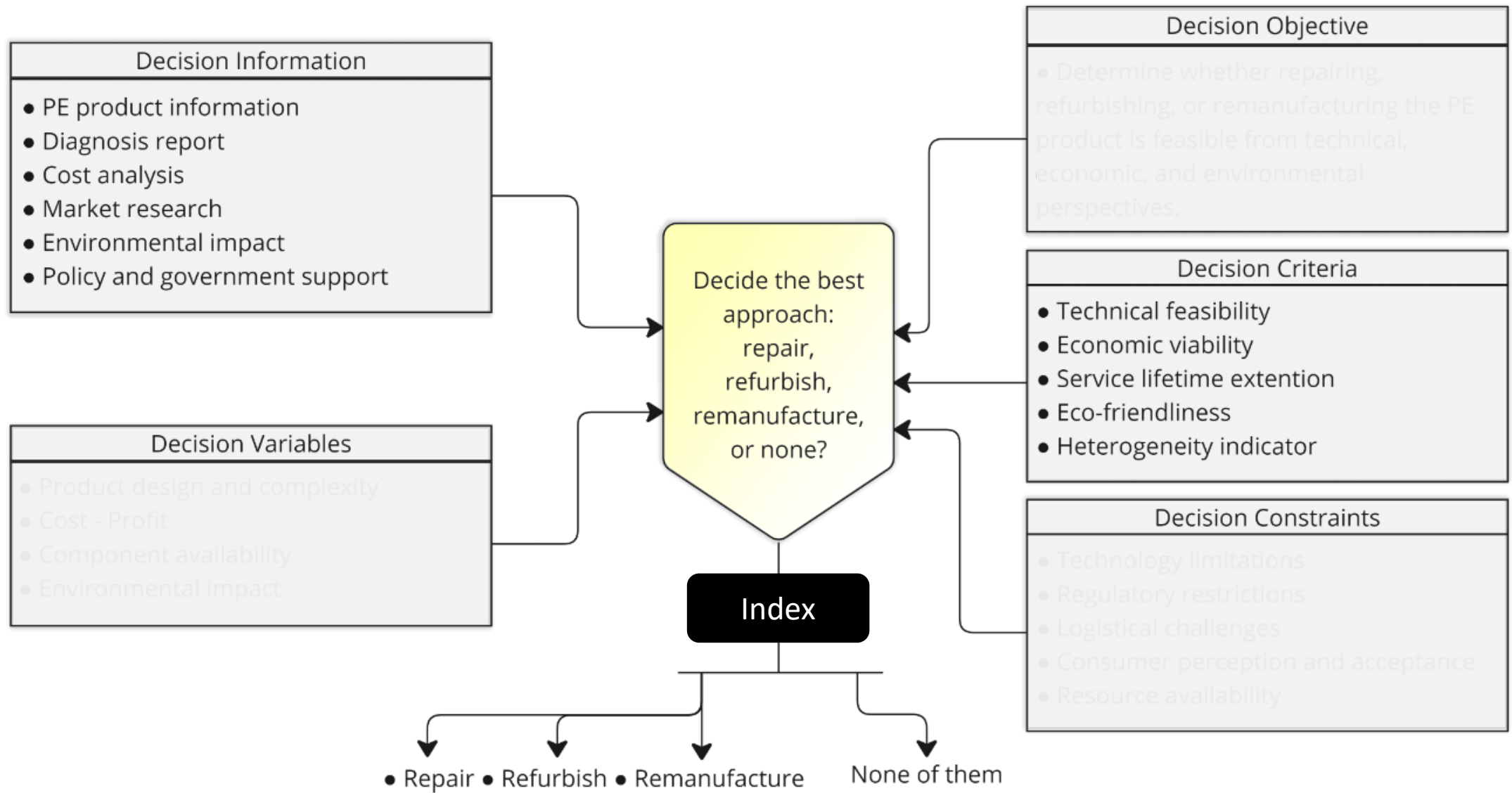


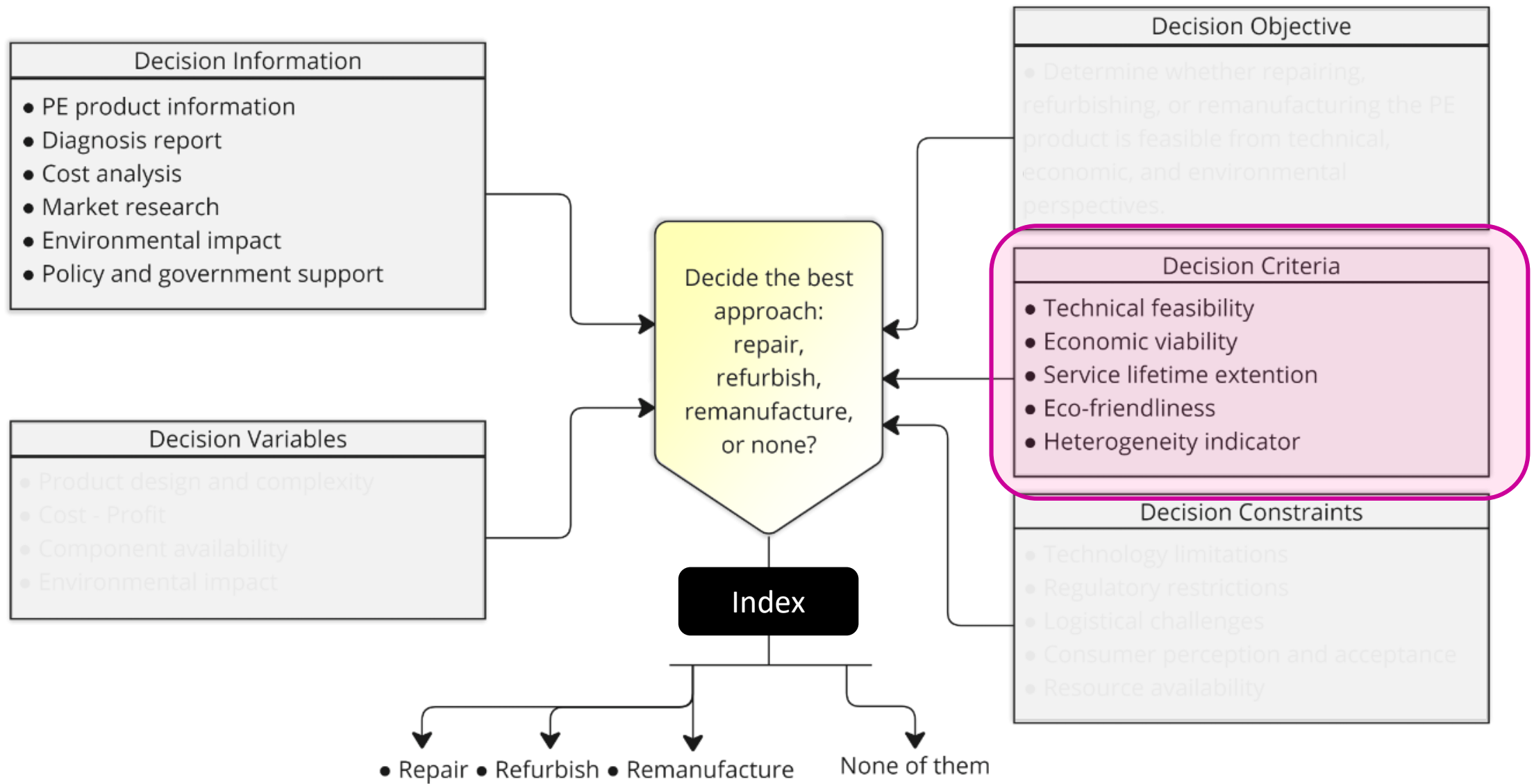


# Decision Tree











# Multifaced decision

Decision Criteria
<ul style="list-style-type: none"><li>• Technical feasibility</li><li>• Economic viability</li><li>• Service lifetime extension</li><li>• Eco-friendliness</li><li>• Heterogeneity indicator</li></ul>

## Technical Feasibility

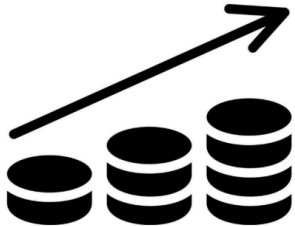
- Can be measured the active **effort** we put on the product

$$\text{Technical Feasibility} = \text{Min} (\text{Effort}_{\text{repair}}, \text{Effort}_{\text{refurbish}}, \text{Effort}_{\text{remanufacture}}, \text{Effort}_{\text{New}})$$

## Economic Viability

- Comparison based on the **revenue** expected

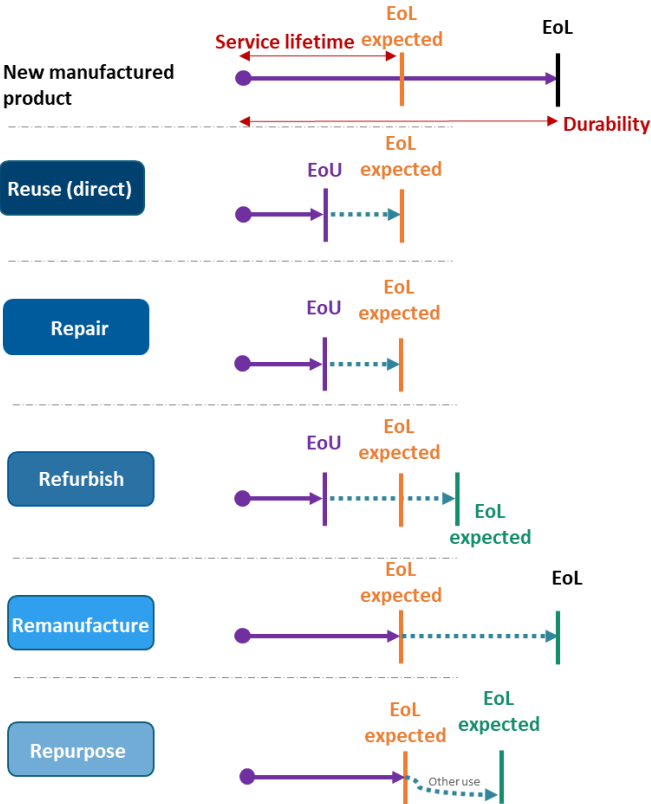
$$\text{Economic Viability} = \text{Max} (R_{\text{Repair}}, R_{\text{Refurbish}}, R_{\text{Remanufacture}}, R_{\text{New}})$$



## Service Lifetime Extension

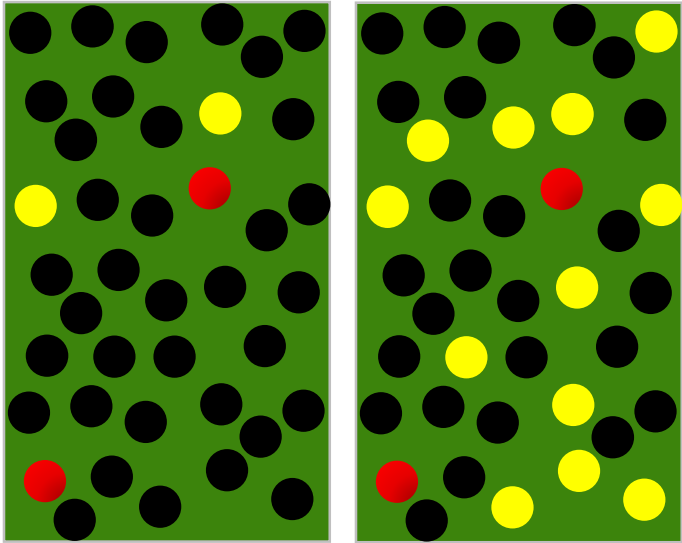
- Comparison among the **service lifetime** obtained after R-strategy

$$\text{Service Lifetime Extension} = f (RUL_{\text{repair}}, RUL_{\text{refurbish}}, RUL_{\text{remanufacture}}, RUL_{\text{new}})$$



# Multifaced decision

Decision Criteria
<ul style="list-style-type: none"><li>• Technical feasibility</li><li>• Economic viability</li><li>• Service lifetime extention</li><li>• Eco-friendliness</li><li>• Heterogeneity indicator</li></ul>



- Components with high-lifetime
- Components with moderate high-lifetime
- Components with moderate low-lifetime

## Eco-friendliness

- Seeking the solution which is more eco-friendly.

$$\text{Eco-friendliness} = \text{Max} (E_{\text{repair}}, E_{\text{refurbish}}, E_{\text{remanufacture}}, E_{\text{New}})$$

## Heterogeneity Indicator

- Heterogeneity refers to **lifespan** of the components in this criteria

$$\text{Technical Feasibility} = \text{Min} (\text{Effort}_{\text{repair}}, \text{Effort}_{\text{refurbish}}, \text{Effort}_{\text{remanufacture}}, \text{Effort}_{\text{New}})$$

$$\text{Economic Viability} = \text{Max} (R_{\text{Repair}}, R_{\text{Refurbish}}, R_{\text{Remanufacture}}, R_{\text{New}})$$

$$\text{Service Lifetime Extension} = f (RUL_{\text{repair}}, RUL_{\text{refurbish}}, RUL_{\text{remanufacture}}, RUL_{\text{new}})$$

$$\text{Eco-friendliness} = \text{Max} (E_{\text{repair}}, E_{\text{refurbish}}, E_{\text{remanufacture}}, E_{\text{New}})$$

Impact of Heterogeneity Indicator

## Need for an index

Decision depends on different parameters

# Agenda

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## Motivation

- *Power electronics*
- *E-waste*
- *Circular economy*
- *Scope of the study*
- *Research activity*

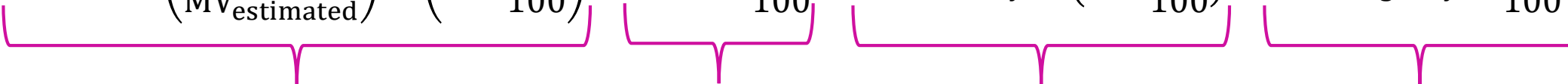
## Decision Tree

- *Basics of the decision tree*
- *Conceptual level*
  - *Case study at conceptual level*
- *Implementation level*

## Index

- ○ *Equation*
- *Benchmark*
- ○ *Results*
- ○ **Conclusion & Perspectives**

# Equation

$$CVI = K_{\text{effort}} \times \left( \frac{MV_{\text{threshold}}}{MV_{\text{estimated}}} \right) \times \left( 1 - \frac{\beta}{100} \right) \oplus K_{\text{RUL}} \times \frac{\gamma}{100} \oplus K_{\text{ecofriendly}} \times \left( 1 - \frac{\varphi}{100} \right) \oplus K_{\text{heterogeneity}} \times \frac{\xi}{100}$$


4 main components

Indexes simplify complex data into a single variable for decision-making. **While various aggregation methods exist, additive aggregation is the most common, used in 86.5% of cases as reported by Martínez Leal et al. (2020).** This method involves summing normalized indicator values, often using the weighted arithmetic mean.

*(J. Martínez Leal et al., Sustainability, 2020)*

# Equation

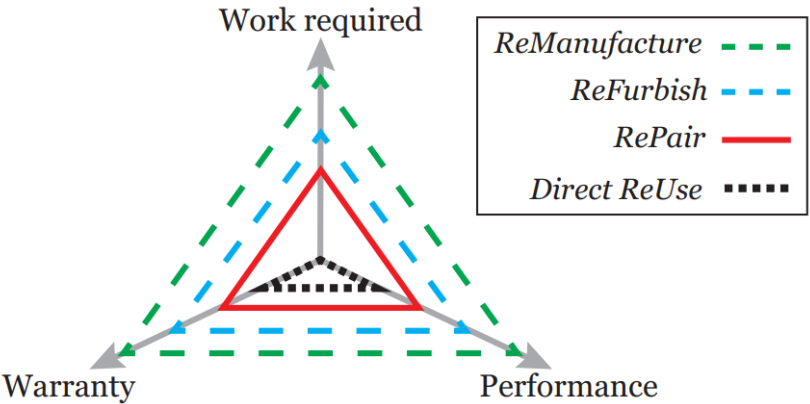
$$CVI = K_{\text{effort}} \times \left( \frac{MV_{\text{threshold}}}{MV_{\text{estimated}}} \right) \times \left( 1 - \frac{\beta}{100} \right) + K_{\text{RUL}} \times \frac{\gamma}{100} + K_{\text{ecofriendly}} \times \left( 1 - \frac{\phi}{100} \right) + K_{\text{heterogeneity}} \times \frac{\xi}{100}$$

Where:

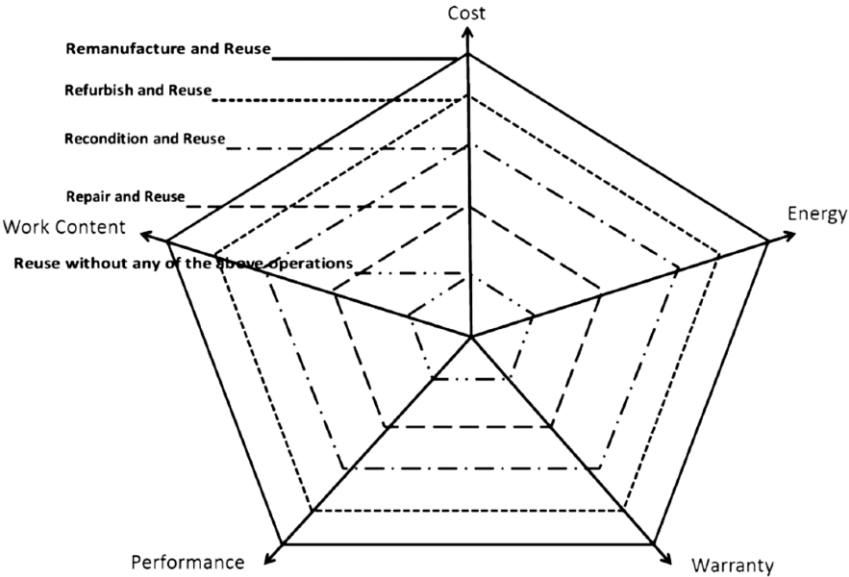
- $K_{\text{effort}}$  : Coefficient for effort
- $MV_{\text{threshold}}$  : Minimum acceptable market value that justifies the R-strategy economically
- $MV_{\text{estimated}}$  : Estimated market value of the product based on current market data
- $\beta$  : Effort required to implement the R-strategy in % with respect to new product
- $K_{\text{RUL}}$  : Coefficient for remaining useful life
- $\gamma$  : Obtained service lifetime after R-strategy in % with respect to new product
- $K_{\text{ecofriendly}}$  : Coefficient for eco-friendliness
- $\phi$  : Environmental impact in % with respect to new product
- $K_{\text{heterogeneity}}$  : Coefficient for heterogeneity
- $\xi$  : Impact of heterogeneity indicator in % with respect to new product

# Benchmark

Product Cycle	MV <sub>estimated</sub>	Required effort $\beta$	Service Lifetime $\gamma$	Environ. Impact $\phi$	Low Het. (1 <sup>st</sup> assumption)	Moderate Het. (2 <sup>nd</sup> assumption)
New	100%	Very high	New	Very high	Highly suitable	Less suitable
Remanuf.	80%	High	As-new	High	Not suitable	Suitable
Refur.	70%	Moderate	High	Moderate	Not suitable	Highly suitable
Repaired	50%	Low	RUL	Low	Suitable	Suitable
Reused	50%	Very low	RUL	Very low	Suitable	Suitable



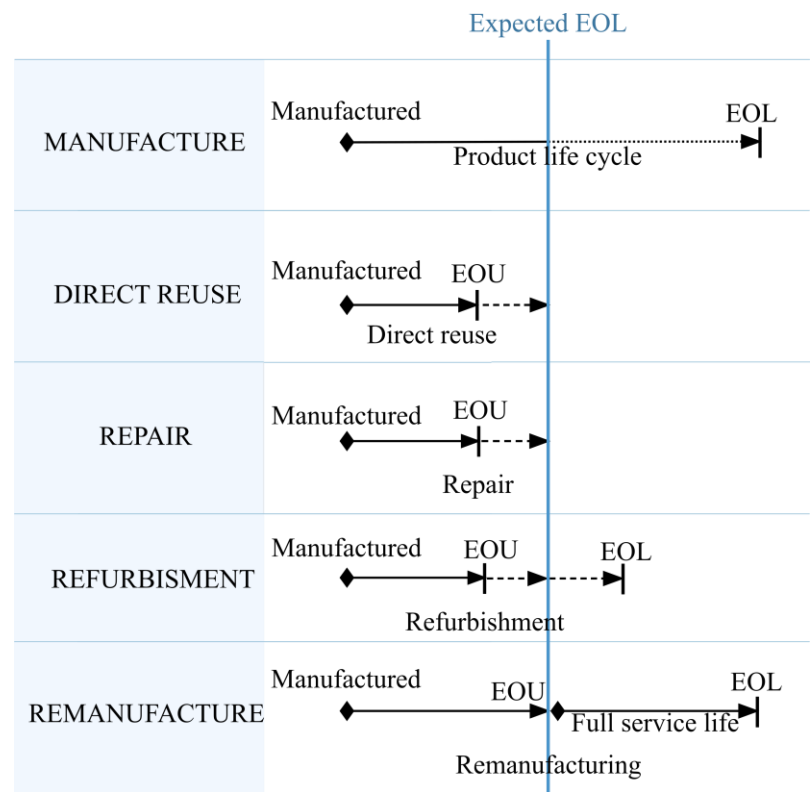
(A. M. King et al., Sustainable development, 2006)



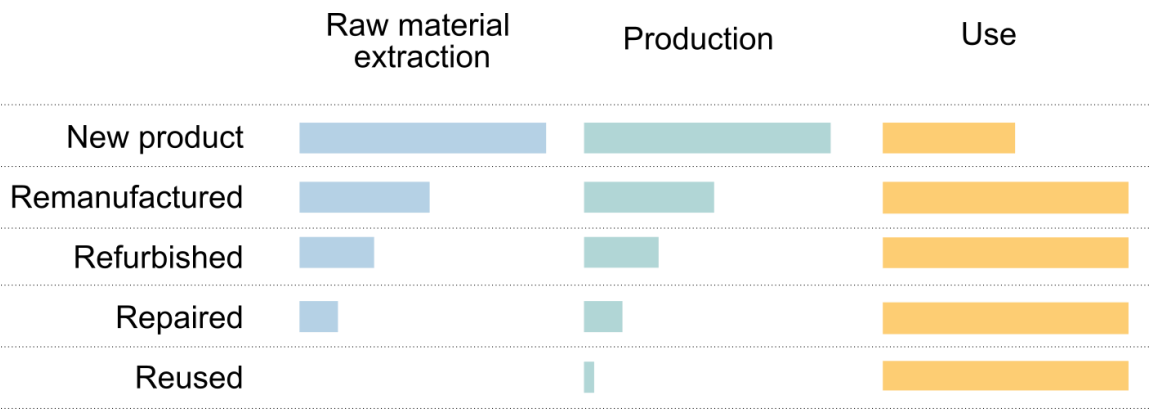
(Gharfalkar, M. et al. Waste Management & Research, 2016)

# Benchmark

Product Cycle	MV <sub>estimated</sub>	Required effort $\beta$	Service Lifetime $\gamma$	Environ. Impact $\phi$	Low Het. (1 <sup>st</sup> assumption)	Moderate Het. (2 <sup>nd</sup> assumption)
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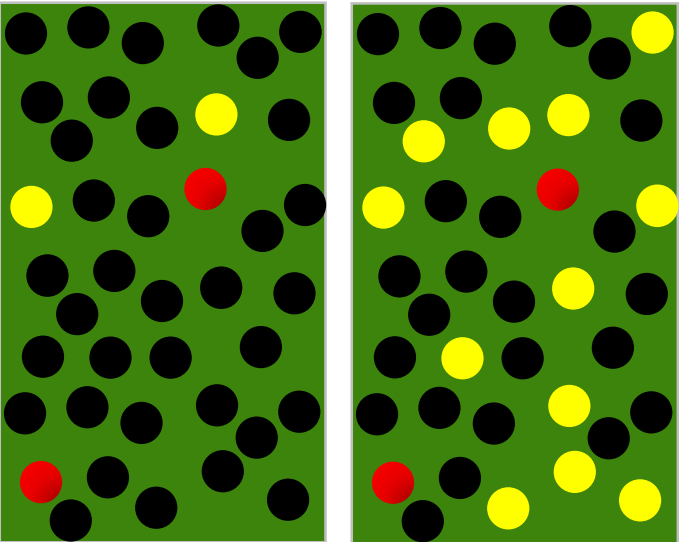


Russell, J. D., & Nasr, N. Z. (2023).



# Benchmark

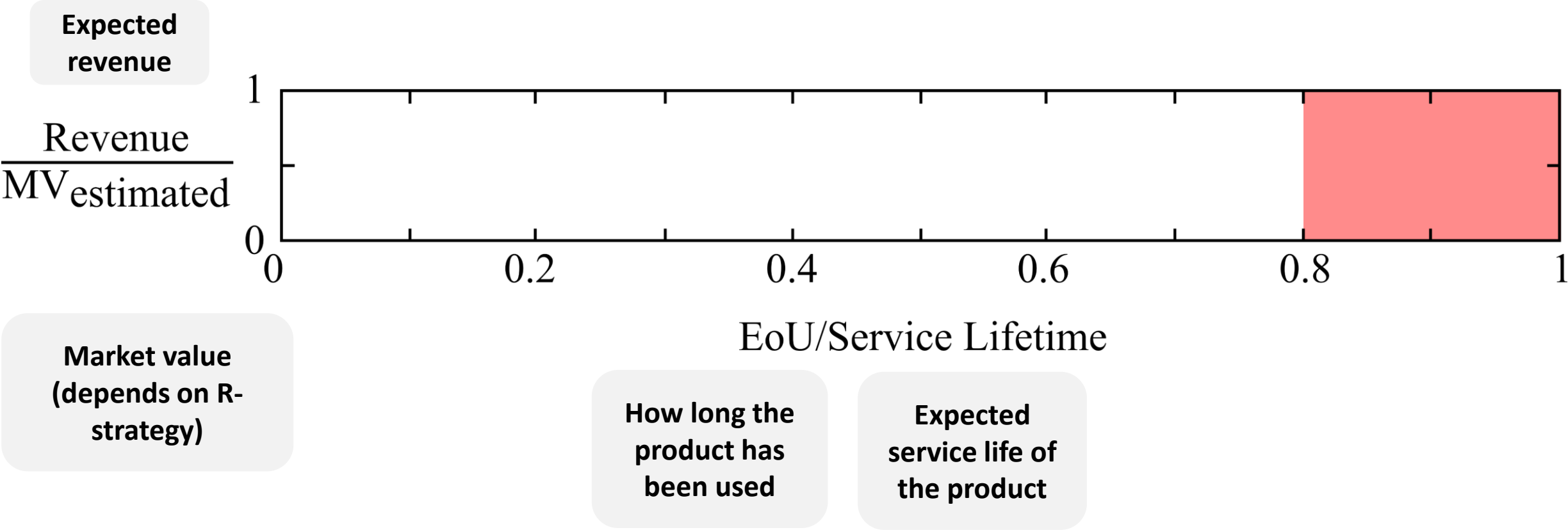
Product Cycle	MV <sub>estimated</sub>	Required effort $\beta$	Service Lifetime $\gamma$	Environ. Impact $\phi$	Low Het. (1 <sup>st</sup> assumption)	Moderate Het. (2 <sup>nd</sup> assumption)
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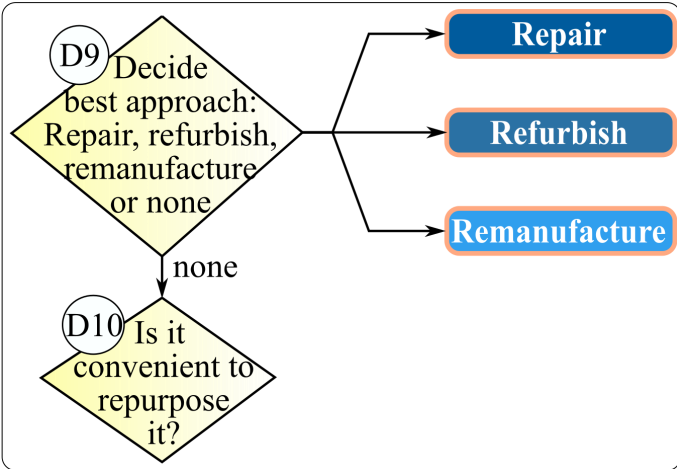
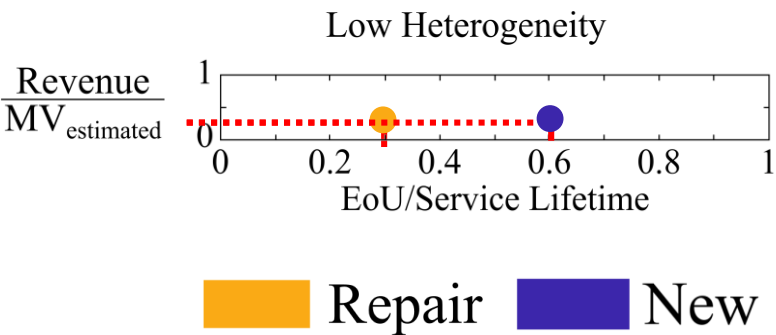
- Lifetime-High
- Lifetime-Moderate
- Lifetime-Low



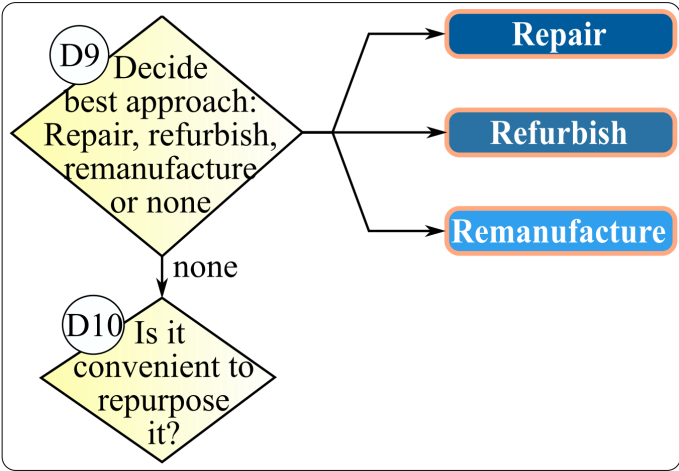
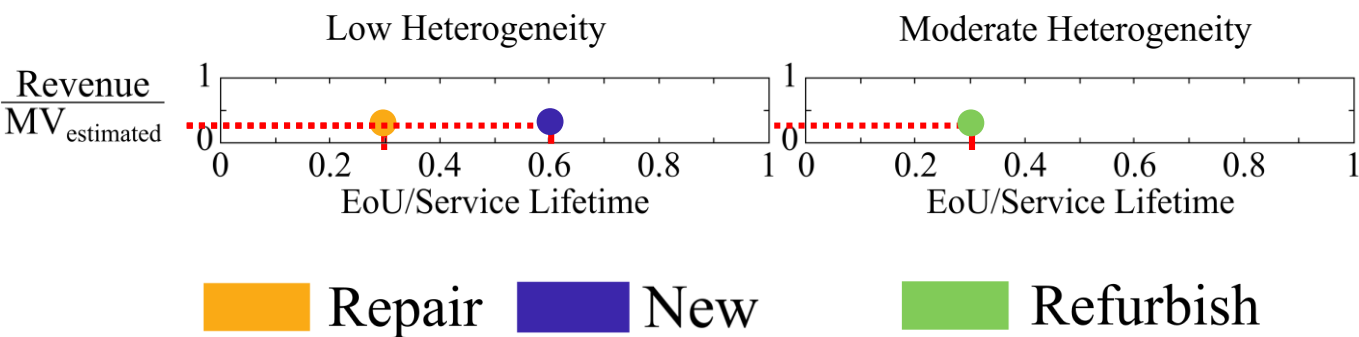
# Plotting the index



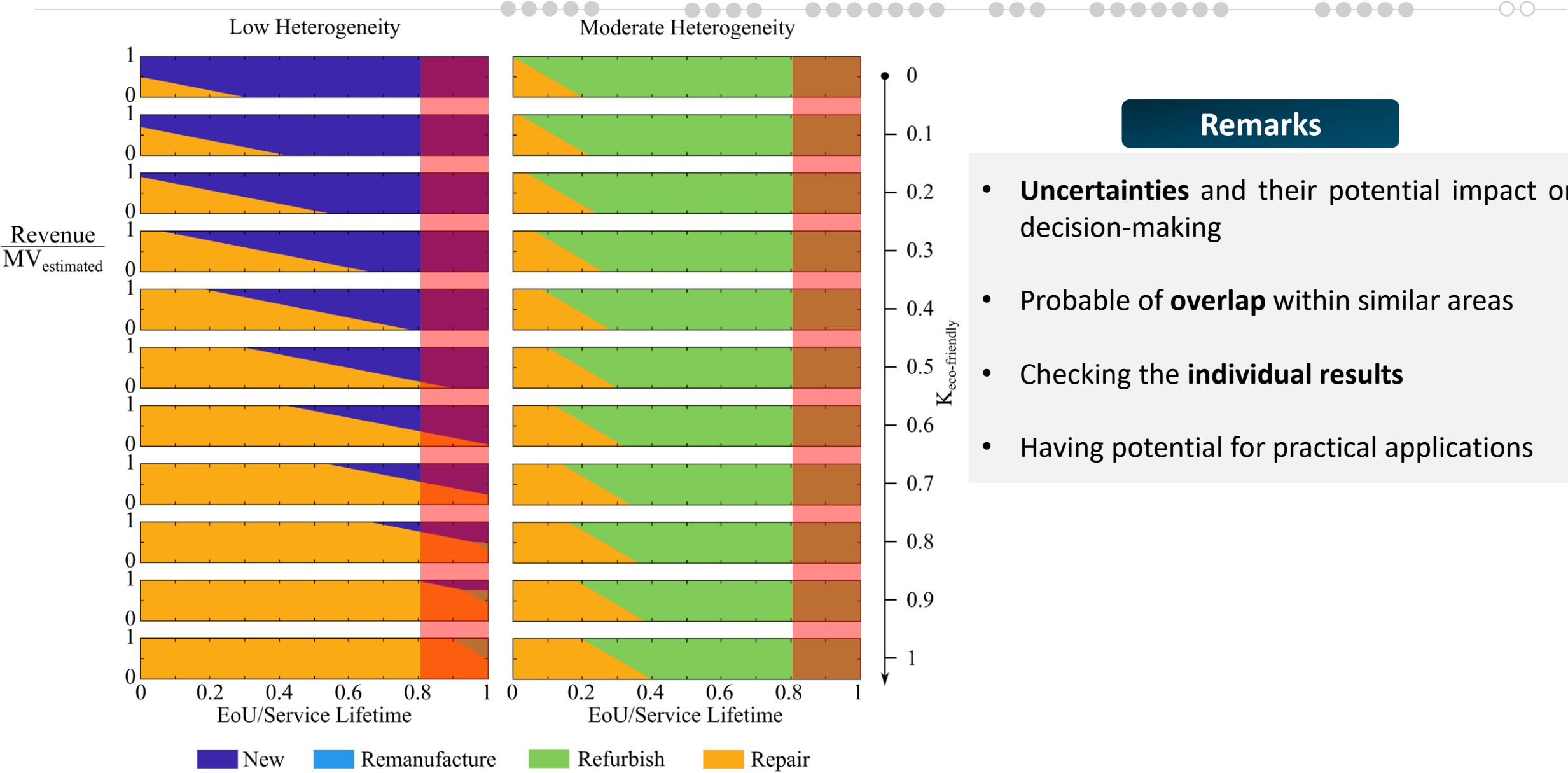
# Interpreting the index results



# Interpreting the index results



# Results



# Agenda

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## Motivation

- *Power electronics*
- *E-waste*
- *Circular economy*
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## Decision Tree

- *Basics of the decision tree*
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- *Benchmark*
- *Results*

## ○○ **Conclusion & Perspectives**

# Conclusion

1

Addressed gaps in CE and PE by elaborating on technical, economic, and environmental factors

2

Provided a foundation for implementing the transition to CE in EoU PE

3

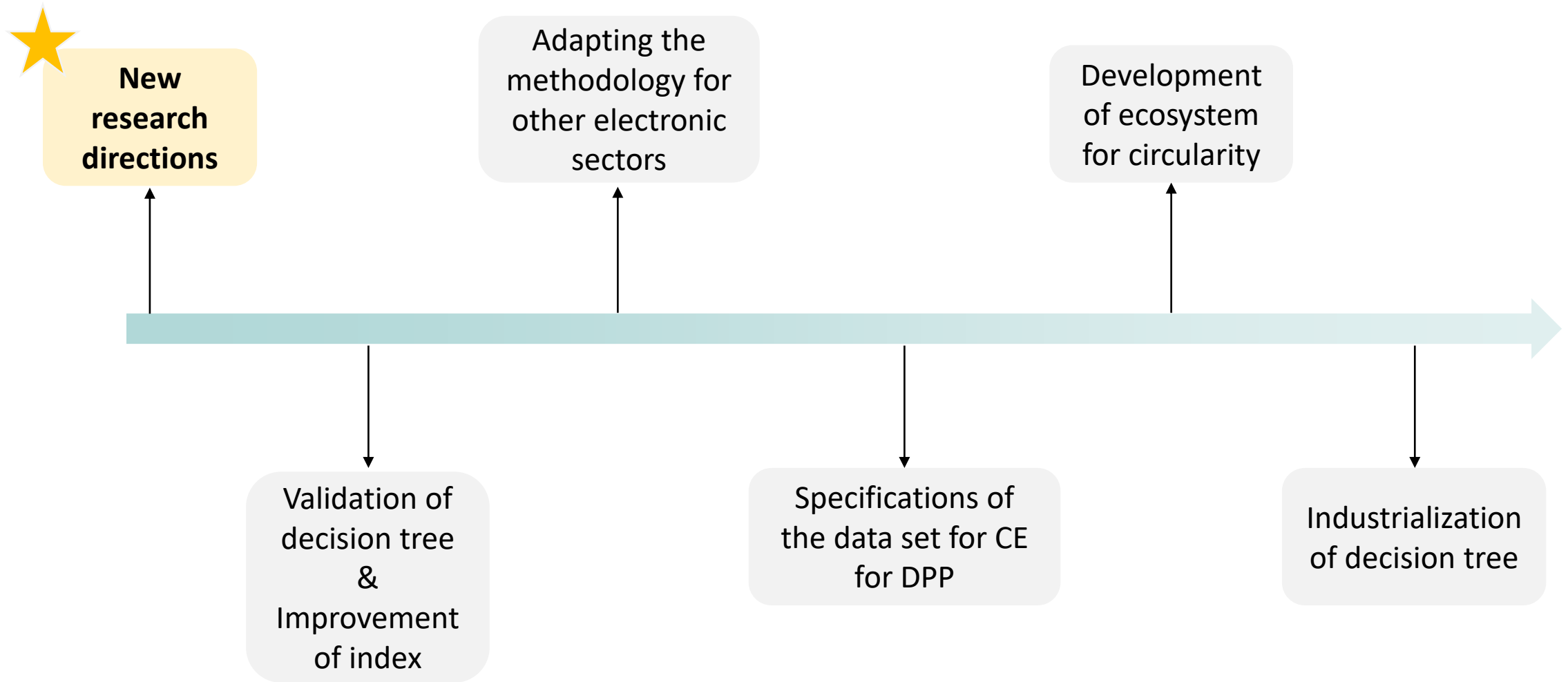
1. Short term: Decision tree rationalizes experience for CE applied to **EoU PEs**
2. Medium term: Thanks to it, we can tailor the design of **New PEs** for CE-strategies

4

CVI encodes such experience and can evolve upon it to drive the design of **New and Circular PEs**



Need data access for decision-making and strategies for future ecosystem developments



# Thank You For Your Attention

## Jury Members

*Reviewer* Paul Etienne VIDAL - Professeur des Universités, Toulouse INP

**Reviewer** Emmanuel CAILLAUD - Professeur des Universités, CNAM

*Examiner* Cyril BUTTAY - Directeur de Recherche, CNRS

*Examiner* Carole CHARBUILLET - Maîtresse de Conférences, Institut Arts et Métiers

*Thesis Director* Jean-Christophe CREBLIER - Directeur de Recherche, CNRS

*Co-encadrante* Thècle ALIX - Maîtresse de Conférences, ENSAM

*Invited* Julien MELOT - Ingénieur, Eaton Industries France

