

Reliability and Cost Modeling of Reusable Launch Vehicles

Predicting, Preventing and Mitigating the Cost of Failure

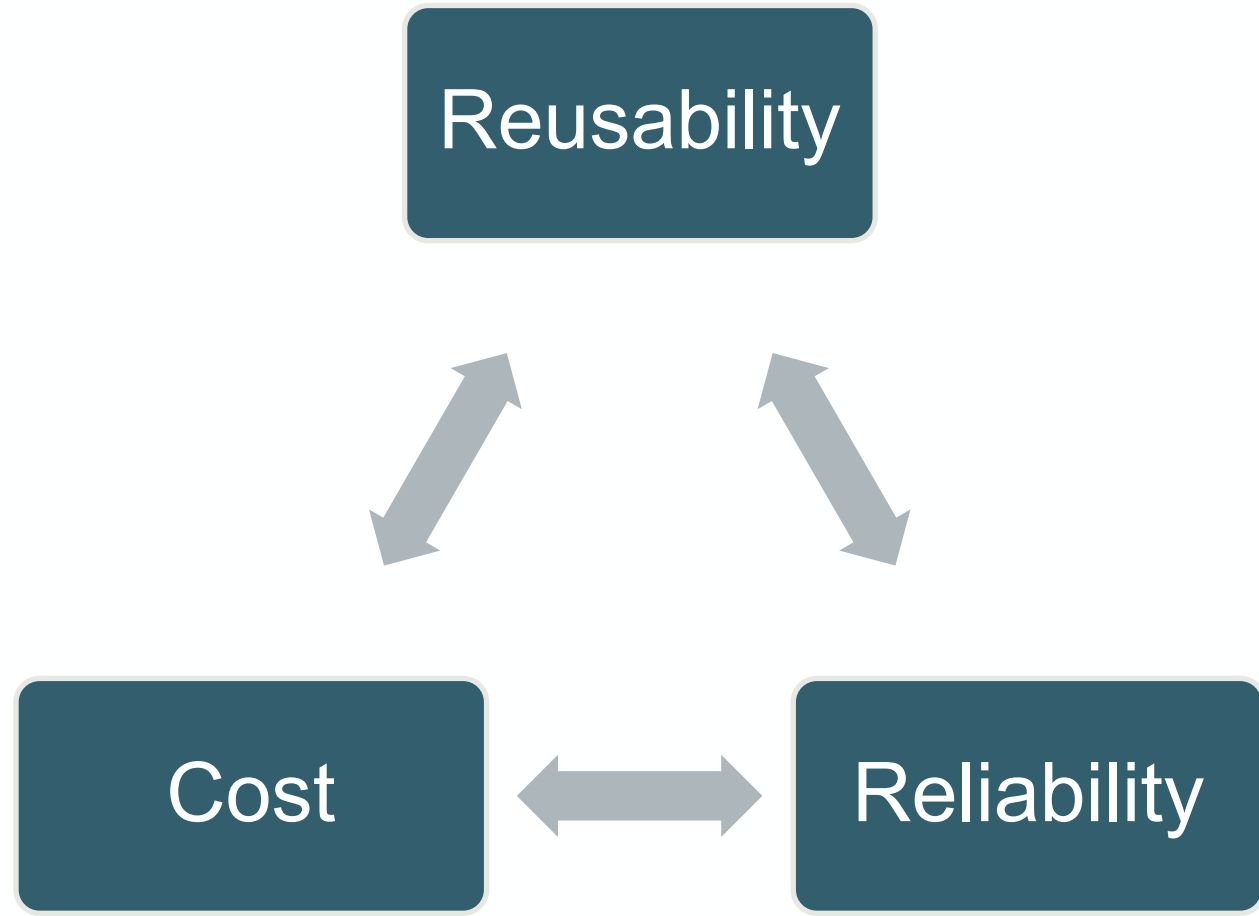
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ESA-CNES Space Cost Engineering SCE2022
ESA/ESTEC
The Netherlands
15th and 16th September 2022

- Introduction
- Reliability Model
- Cost Model
- Combined Model
- Results & Discussion
- Alternative Use-Case
- Conclusion

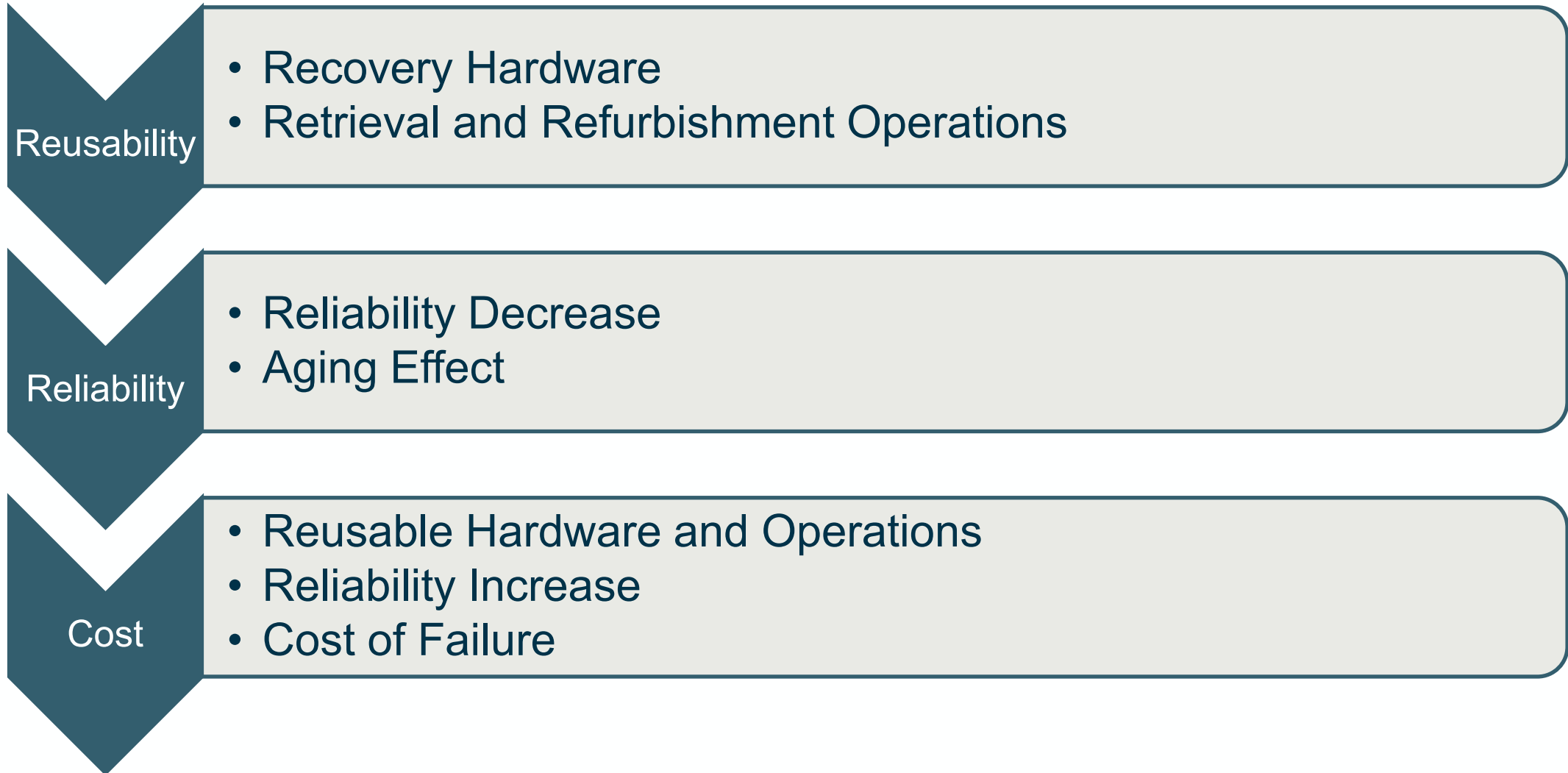


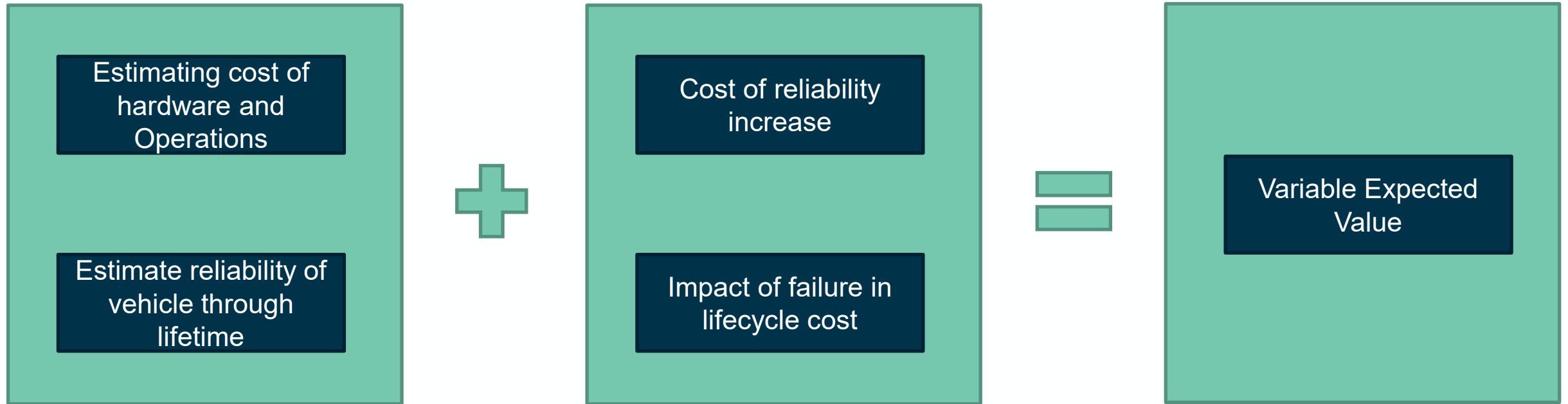
INTRODUCTION – State of the Space Launch Industry





INTRODUCTION – Main Challenges





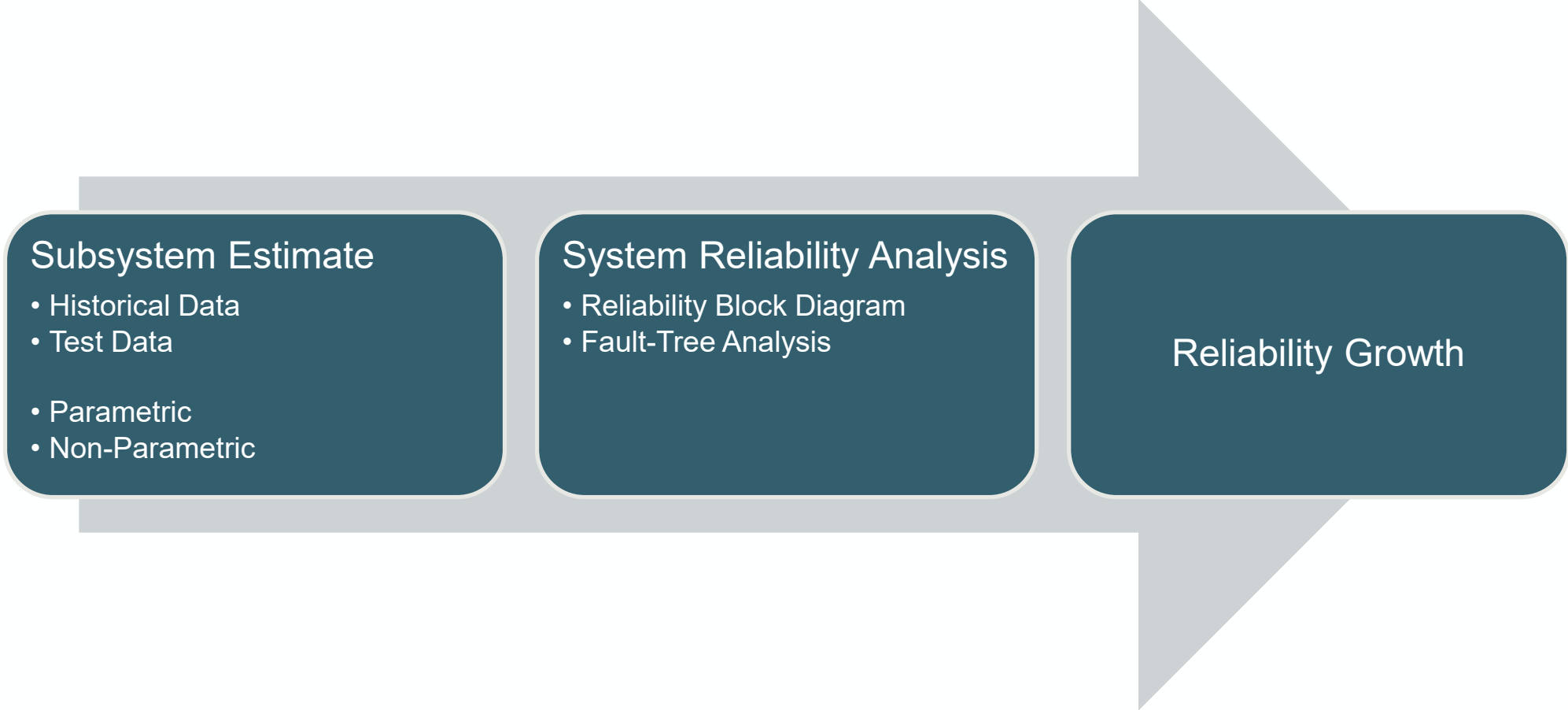
Classic modeling

- Cost model
- Reliability model

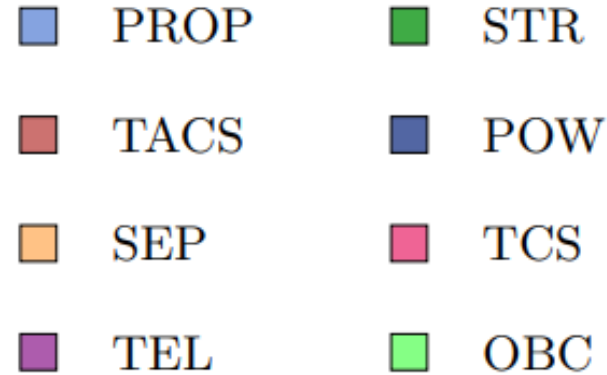
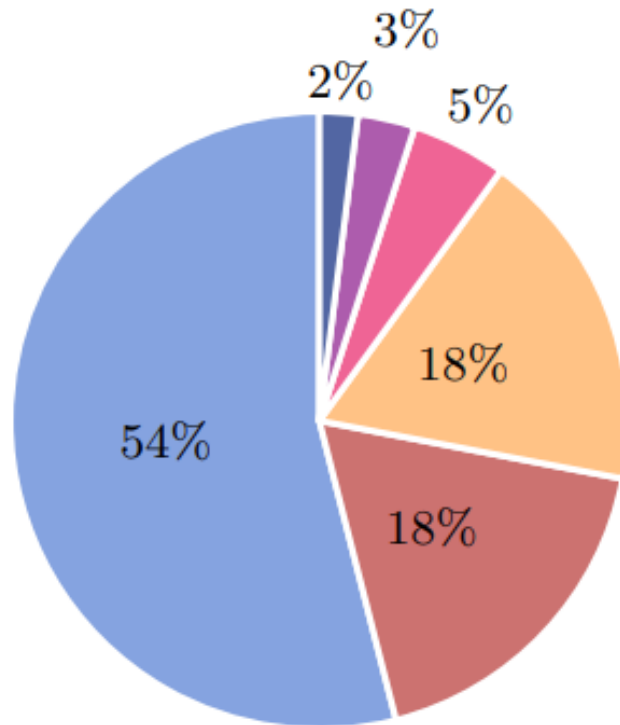
Intersection of cost and reliability

- New CERs
- Failure cost model

Product of linked model

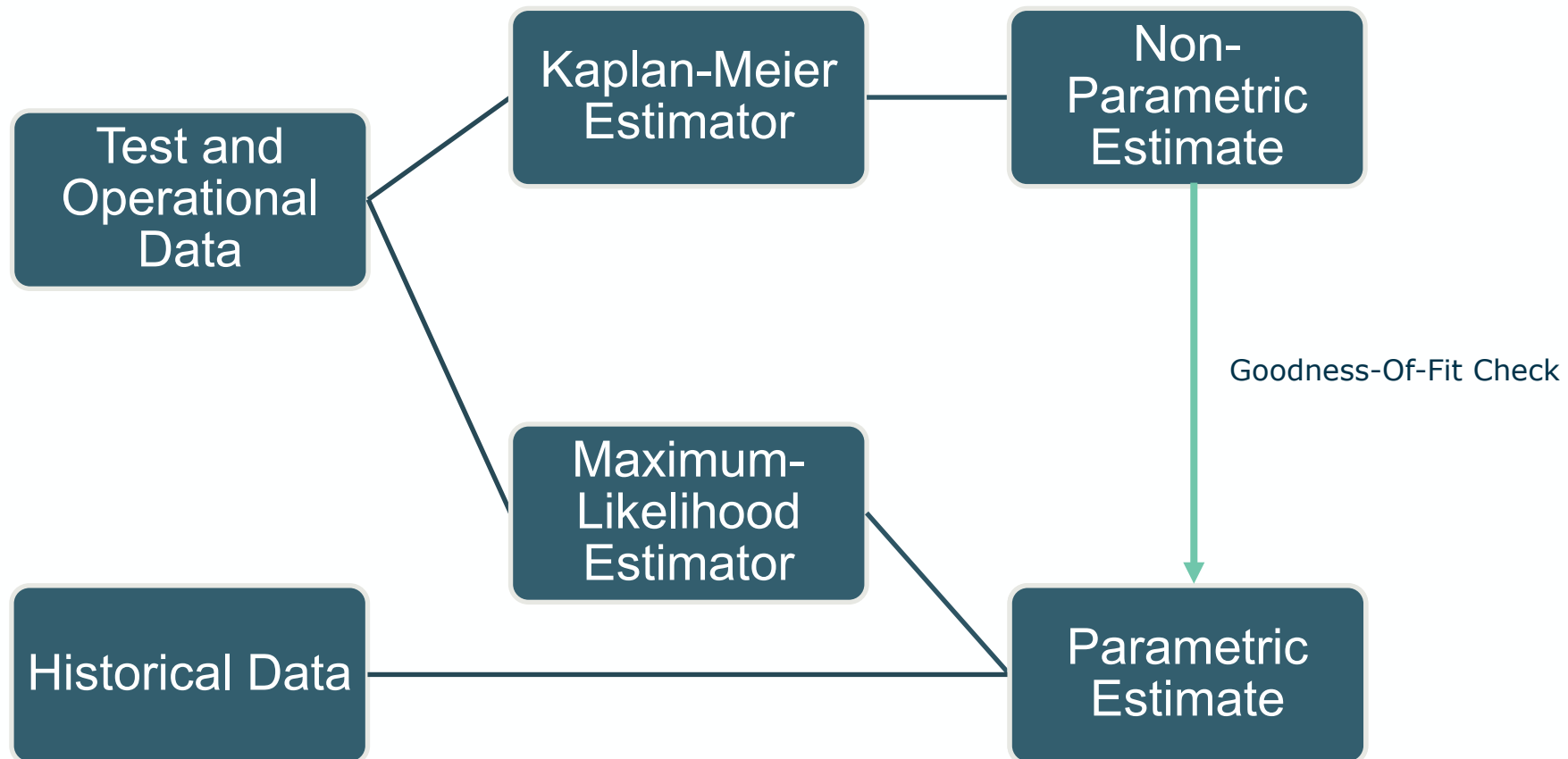


RELIABILITY MODEL – Propulsion System modeling requires further detail



- Propulsion System (PROP).
- Trajectory and Attitude Control System (TACS).
- Power Storage and Distribution System (POW).
- Telemetry (TEL).
- On-Board Computer (OBC).
- Thermal Control System (TCS).
- Structures (STR).
- Separation Systems (SEP).

Fig. 1 - Launch failures in the past 15 years classified by subsystem [1].



RELIABILITY MODEL – Subsystem Estimate

Merlin Engine Example

Flight Number	Number of Failures
1	3
5	1
6	1

Flight Number	Number of Right-Censored Elements
1	154
2	160
3	20
4	40
5	19
6	19
7	10
10	10
11	20
12	10

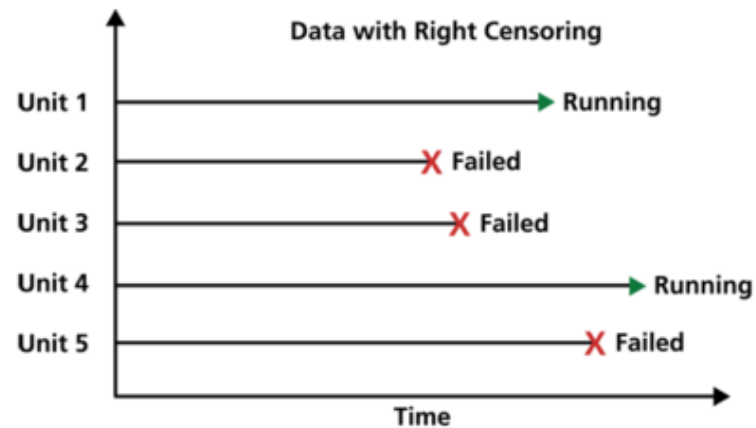


Fig. 1 – Representation of a right-censored data set [2].

RELIABILITY MODEL – Subsystem Estimate

Merlin Engine Example

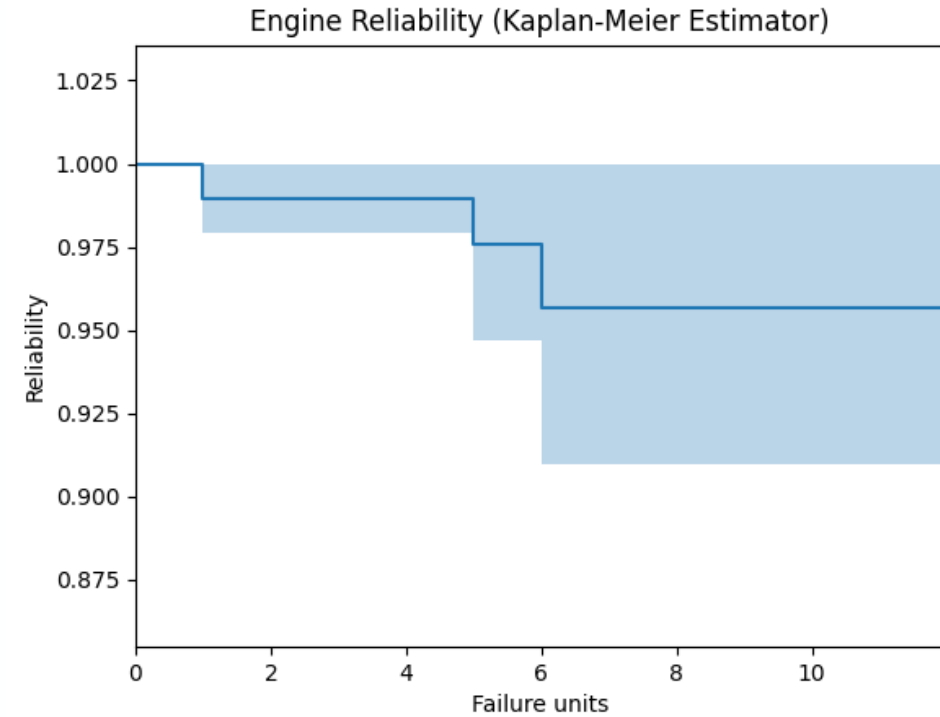
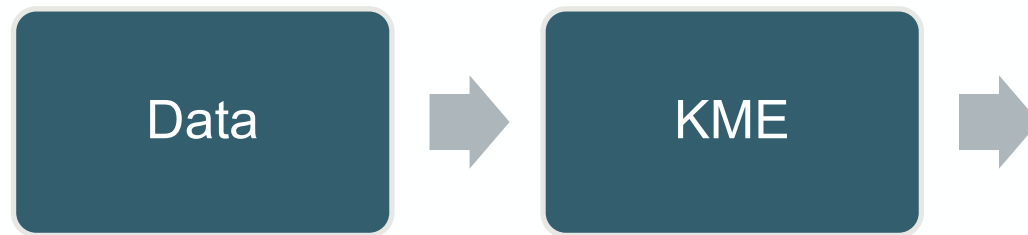


Fig. 3 – KME applied to Merlin Engine data.

RELIABILITY MODEL – Subsystem Estimate

Merlin Engine Example

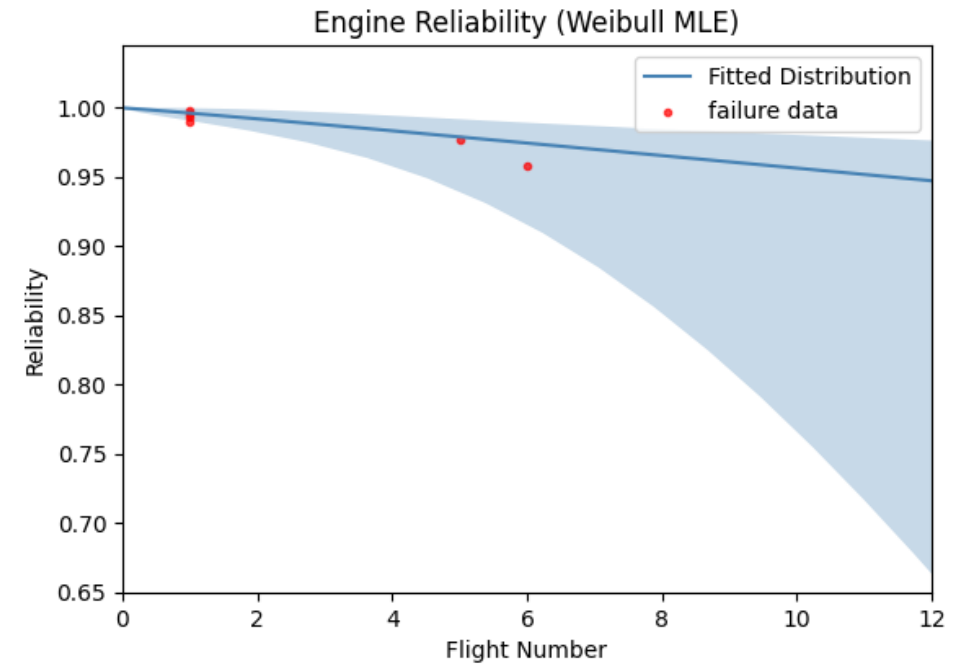
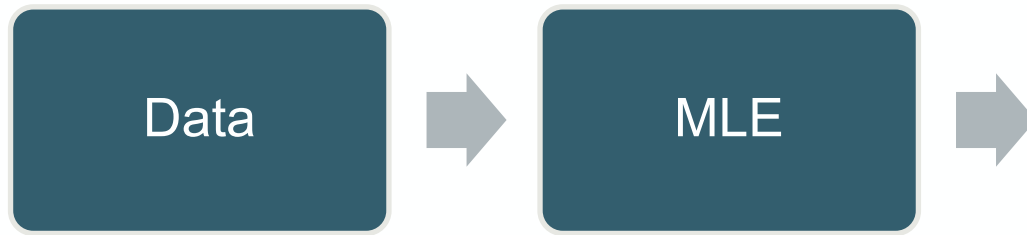


Fig. 4 – MLE applied to Merlin Engine data assuming Weibull distribution.

RELIABILITY MODEL – Subsystem Estimate

Merlin Engine Example

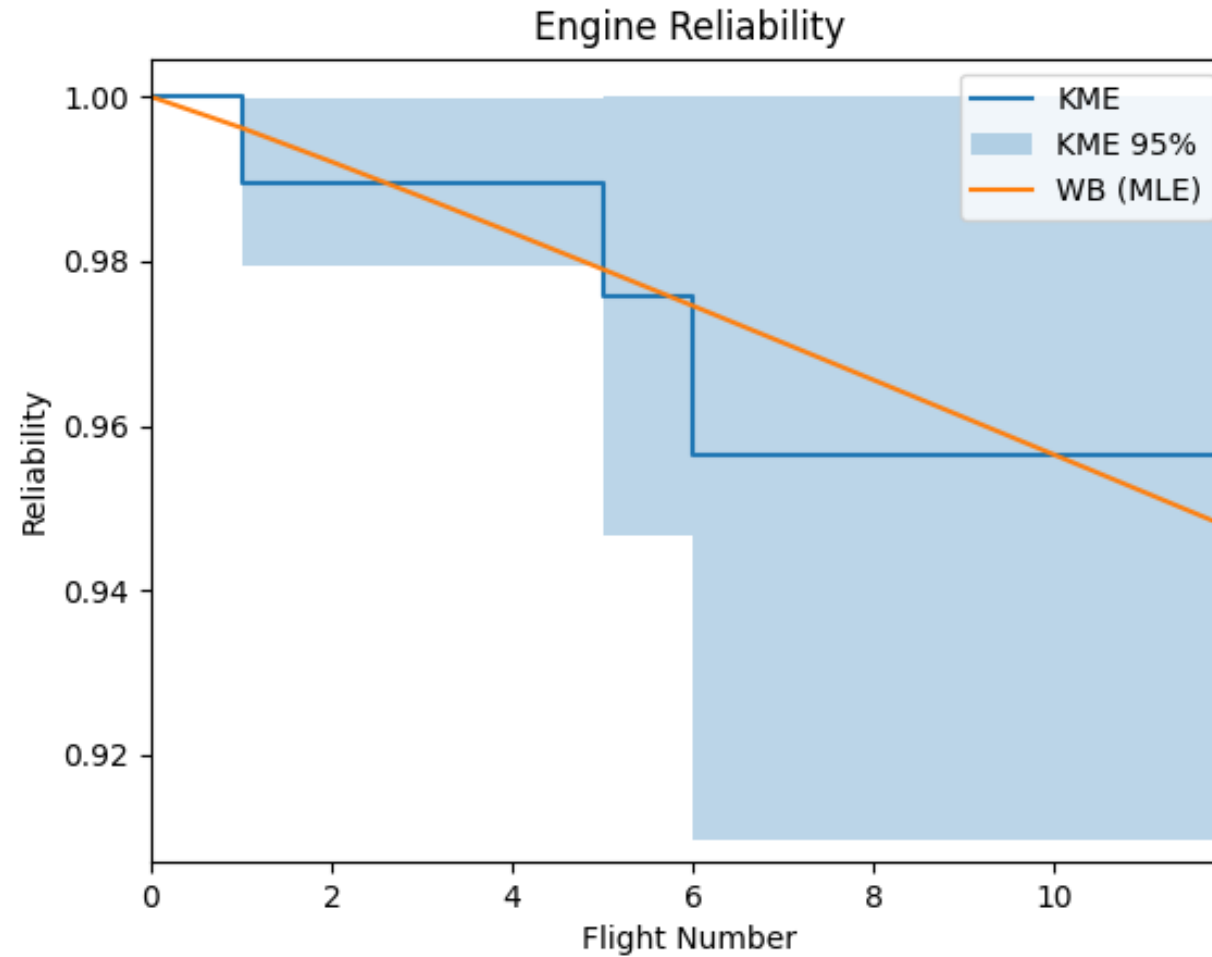
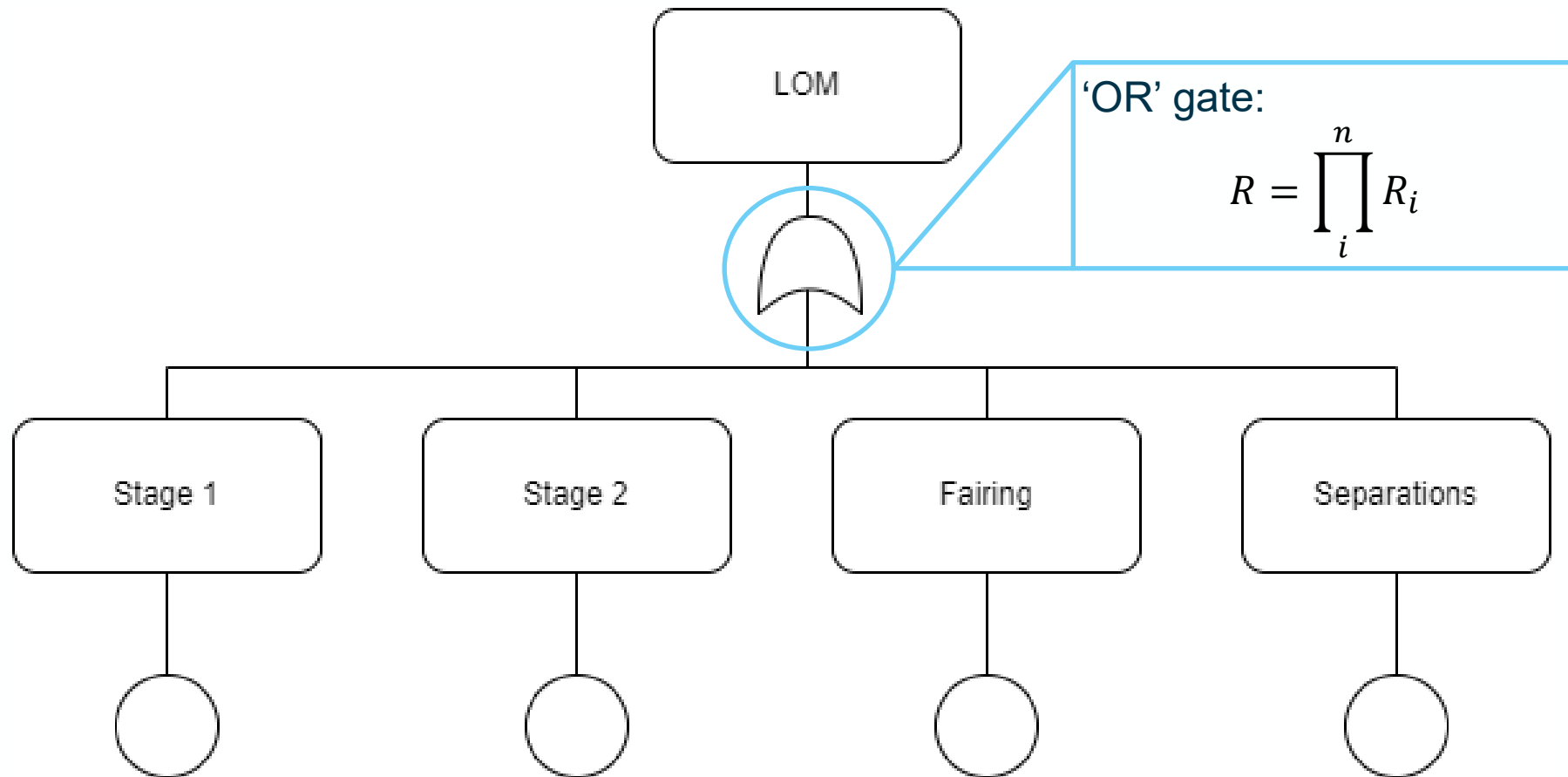


Fig. 5 – Goodness-of-fit verification of MLE Weibull with KME.

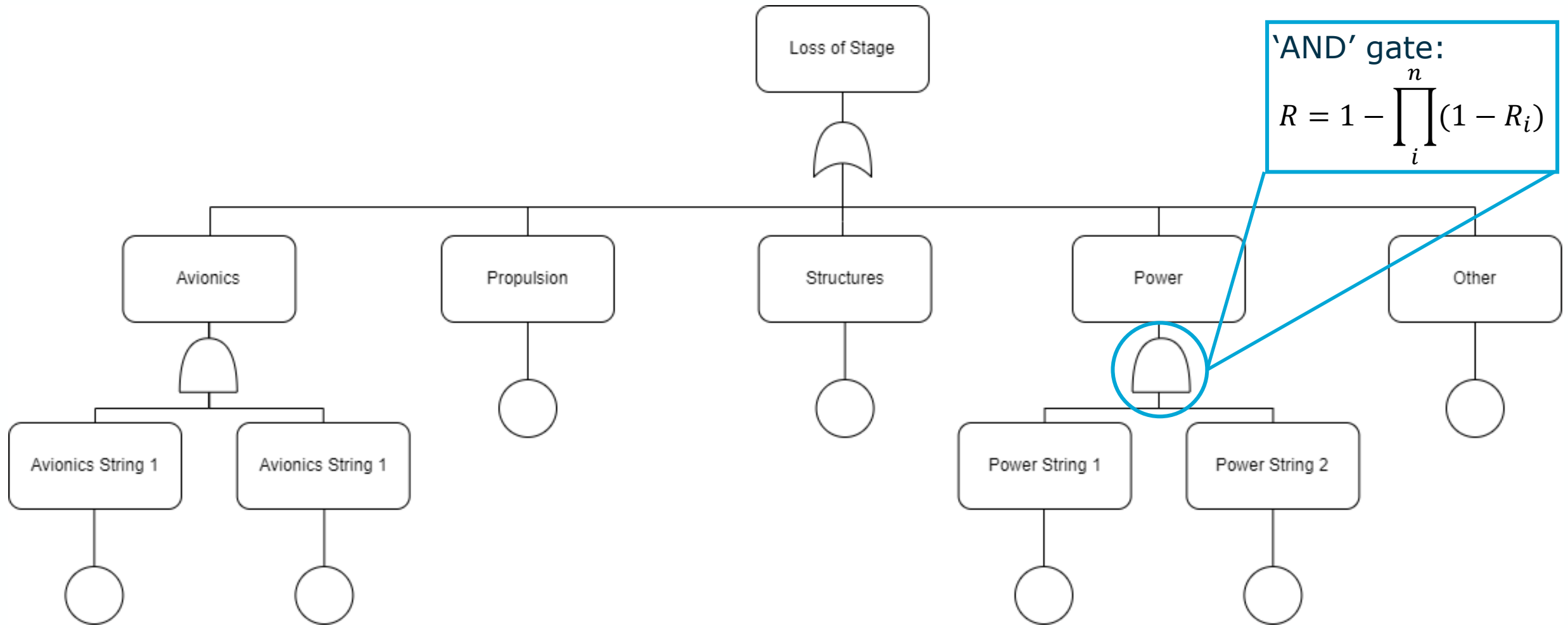
RELIABILITY MODEL – System Estimate

Fault Tree Analysis Top Level



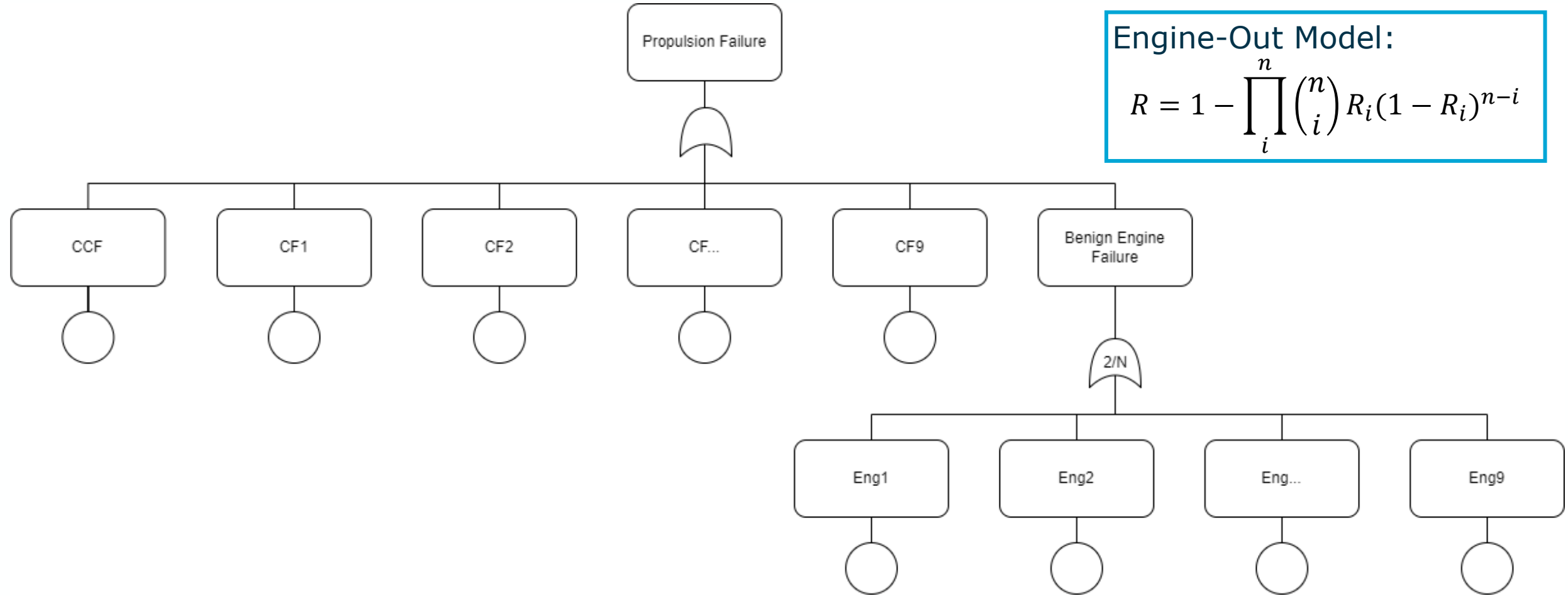
RELIABILITY MODEL – System Estimate

Fault Tree Analysis Subsystem Level



RELIABILITY MODEL – System Estimate

FTA Propulsion System



Engine-Out Model:

$$R = 1 - \prod_i^n \binom{n}{i} R_i (1 - R_i)^{n-i}$$

Increased Testing

- Crow-AMSAA Reliability Growth Model;
- Counting Method;

Redundancy

- Simple Redundancy;
- Engine-Out Capability;

Derating

- Operating an item at a stress lower than its rated design value;

Quality Increase

- Use of components with higher reliability.

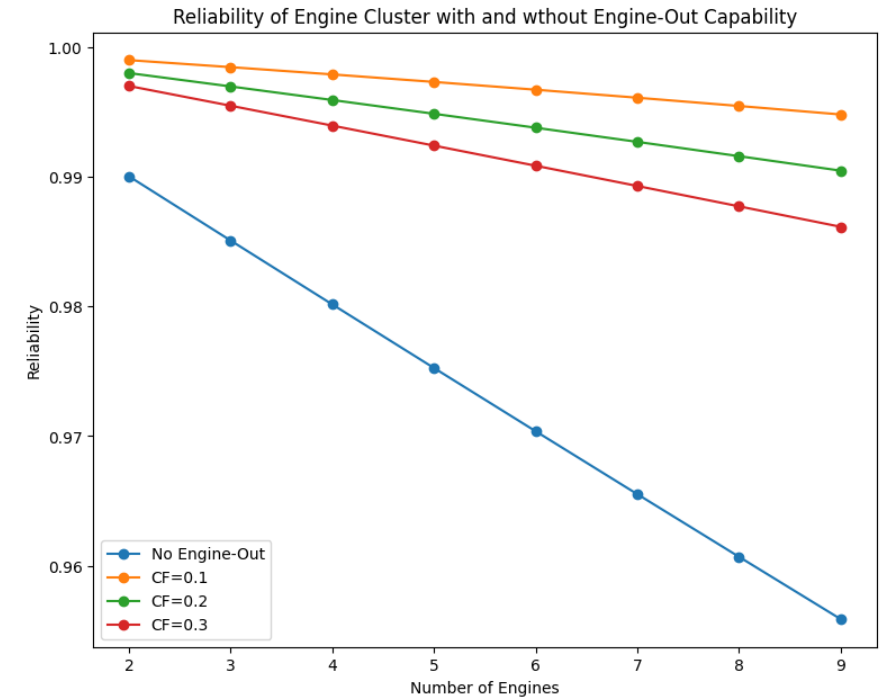
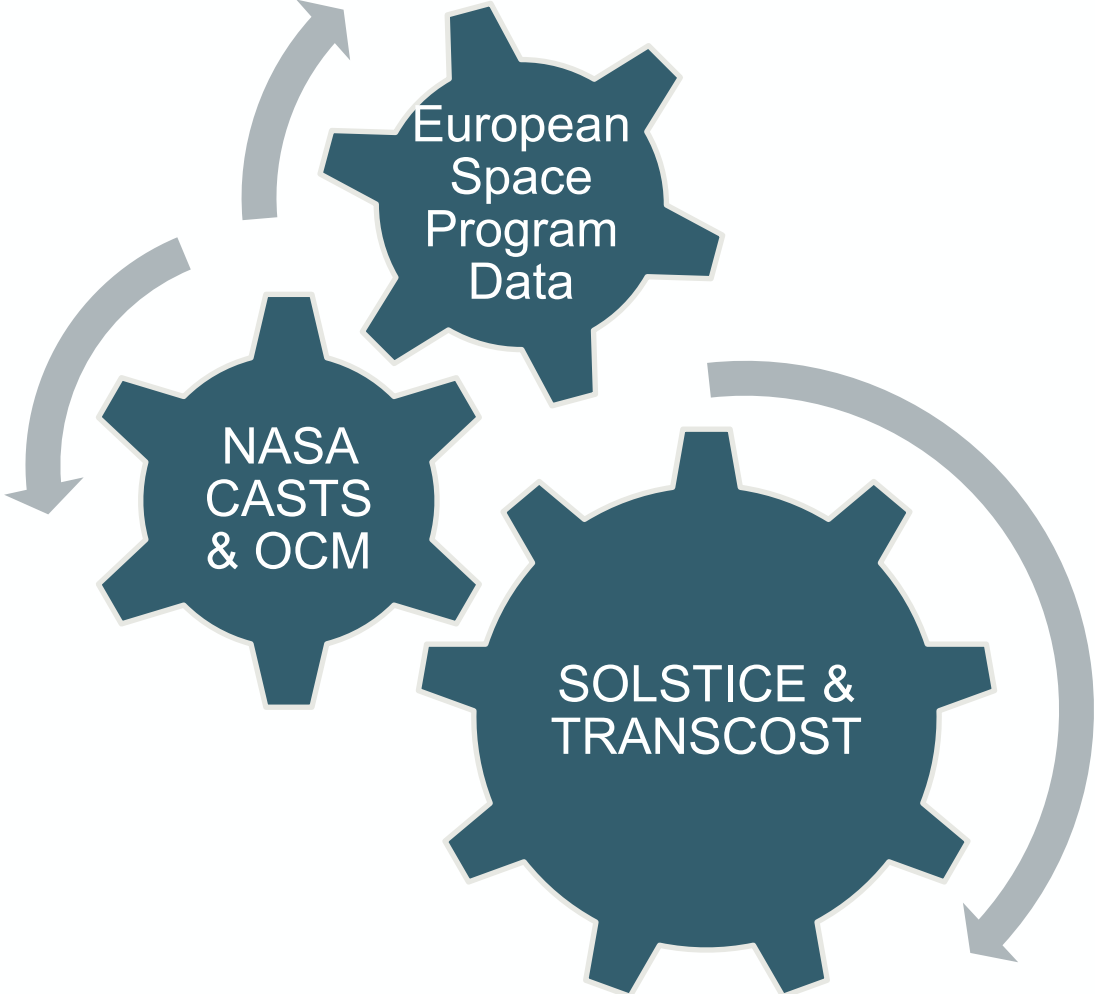
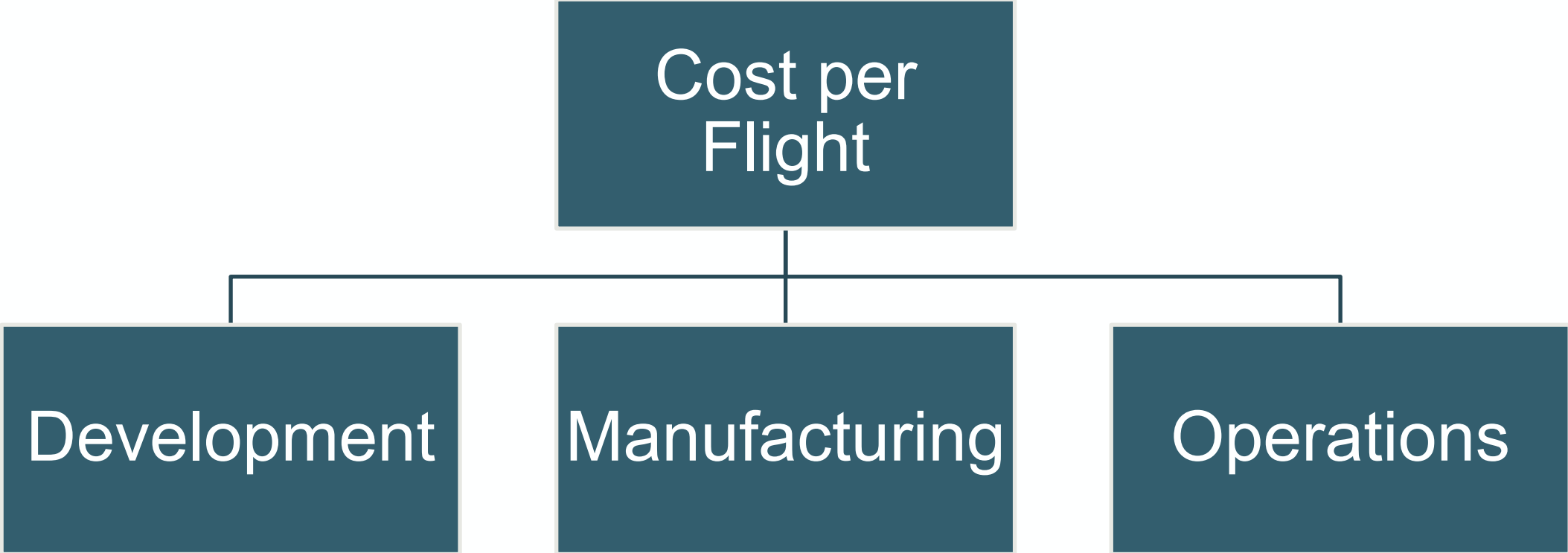
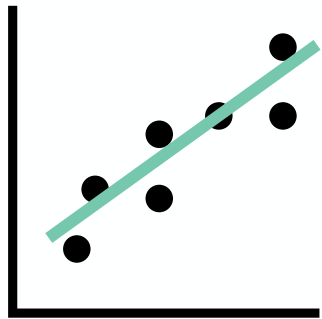


Fig. 6 – Reliability increase due to engine-out capability.

COST MODEL – Cost Estimating Tools







$$C = a \cdot M^b$$

$$\log(C) = \log(a) + b \cdot \log(M)$$

C-Cost

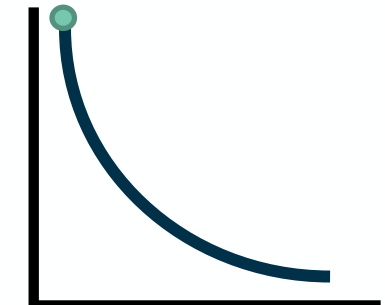
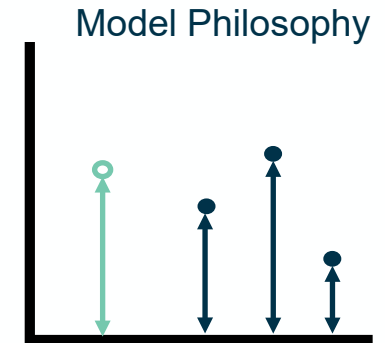
M-Mass

a, b-Regression Coefficients

First Unit Estimate

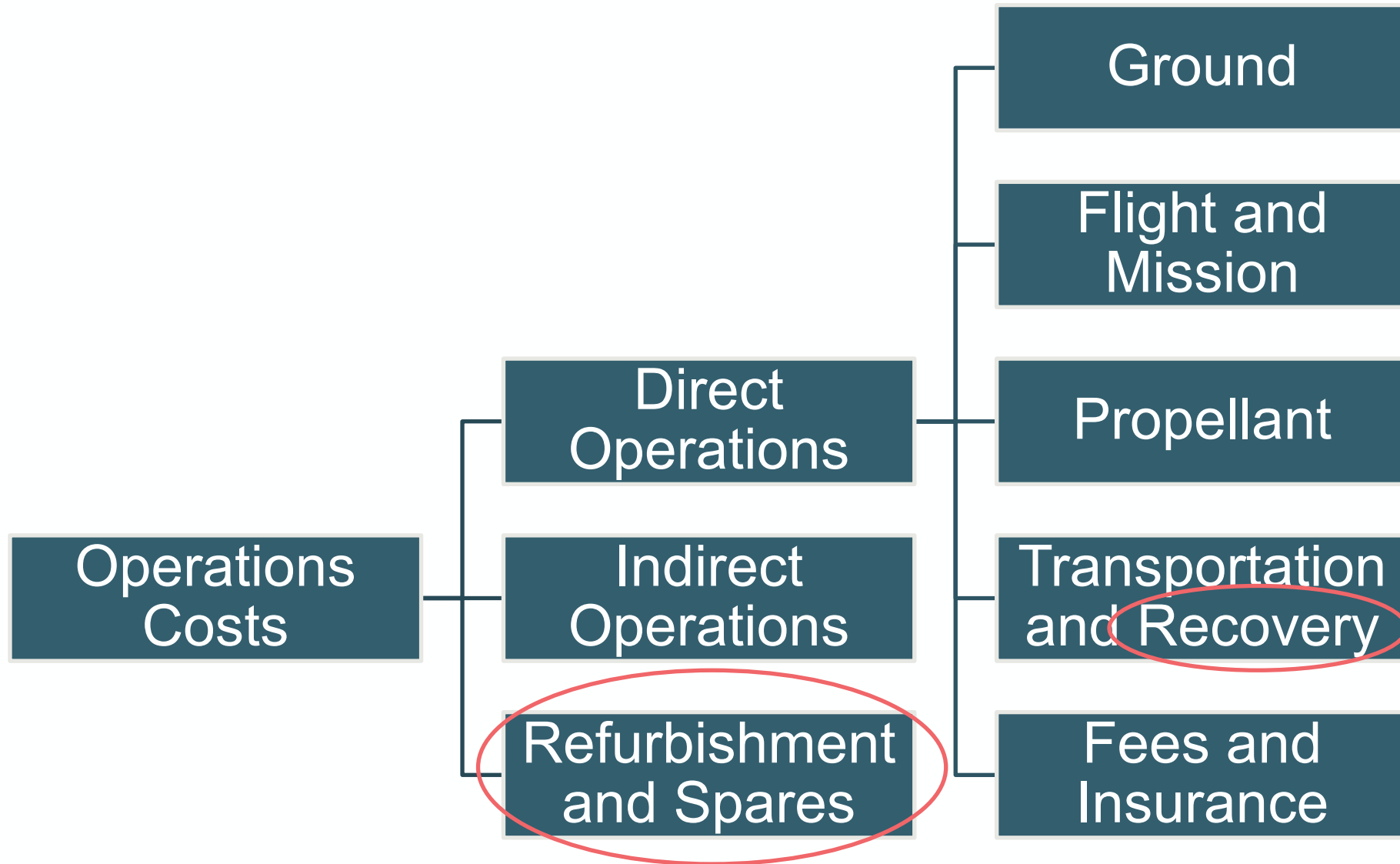
Development Costs

Manufacturing Costs

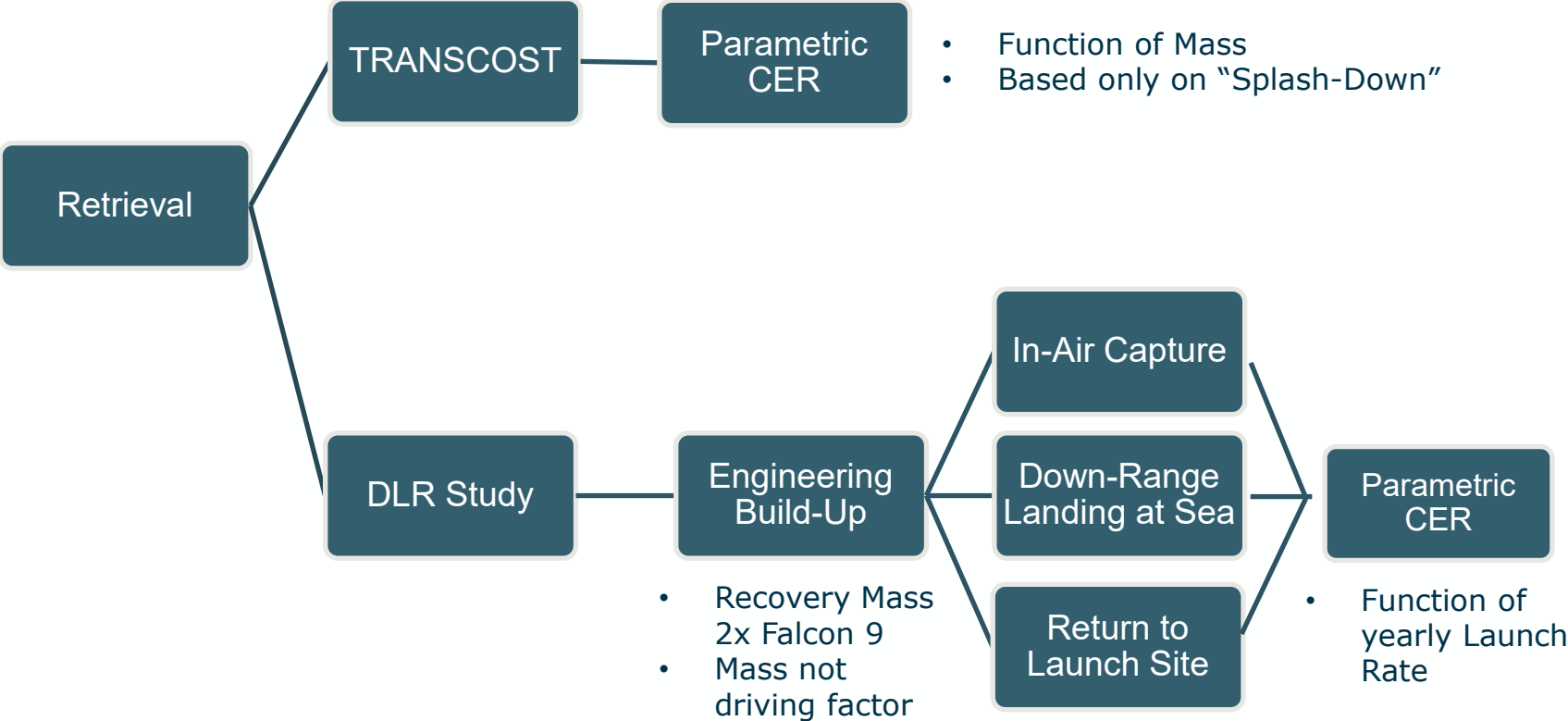


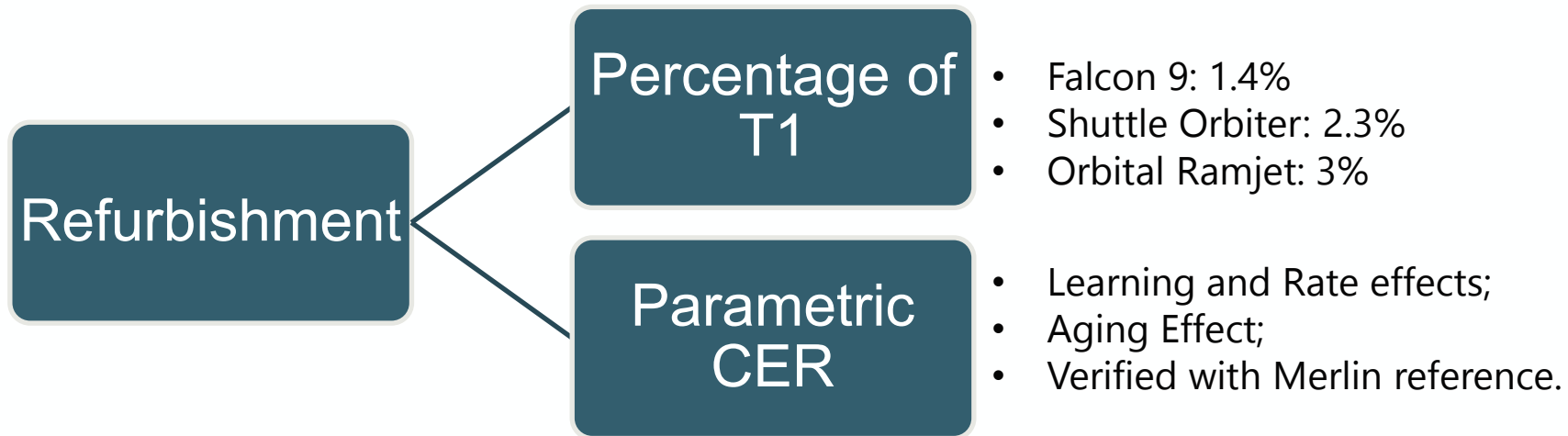
Crawford learning curve:
 $MAN_i = T_1 \cdot i^{\frac{\log(p)}{\log(2)}}$
 Integration and Testing Factor (I&T)

COST MODEL – Cost of Operations



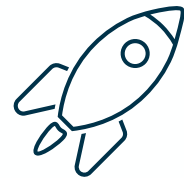
COST MODEL – Cost of Retrieval





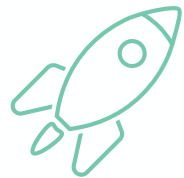
Failure Cost: 2-5 times CpF

1. Flight/Vehicle Replacement
2. Increase in Insurance Rates
3. Failure Investigation
4. Implementation of Modifications
5. Cost of Downtime



Vehicle/Flight Replacement

- Manufacturing Costs
- Operation Costs
- Re-Flight Guarantee (RFG)



Increase in Insurance Rates

- Insurance Policy
- Insurance Rates
- Time to Recover



Failure Investigation

- Investigation Duration
- Board size (Head Count)
- Worker Costs per Year



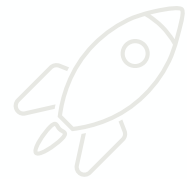
Implementation of Modifications

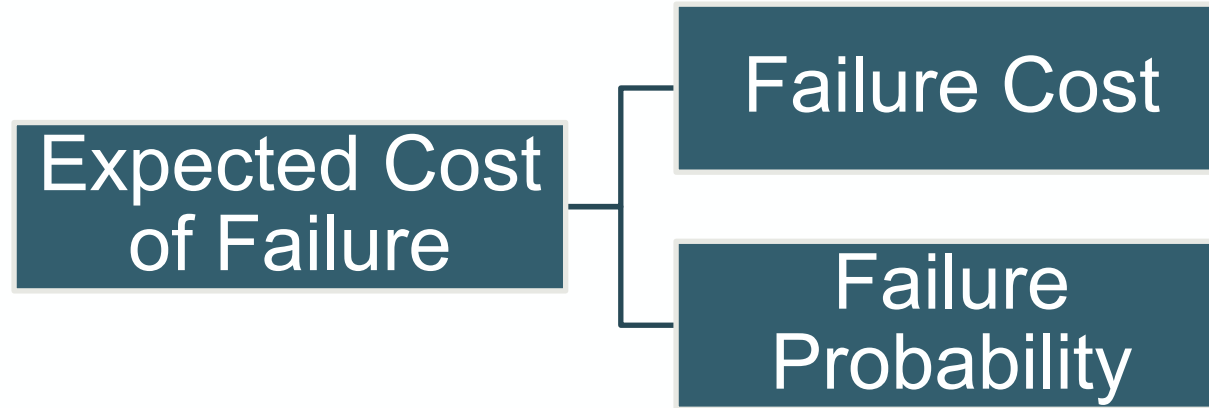
- Subsystem (type and T1)
- Level of Modification



Cost of Downtime

- Duration
- Launch Rate
- Profit Margin
- Mass in Storage
- Characteristics of Facilities





$$C_F = C_f \cdot (1 - R)$$

C_F - Expected Cost of Failure

C_f - Failure Cost

R - Reliability

Finding: Recovery failures do not lead to downtime or formal failure investigation.

$$C_F = \sum C_{fi} \cdot P_i$$

P_1 -Probability of Mission Failure

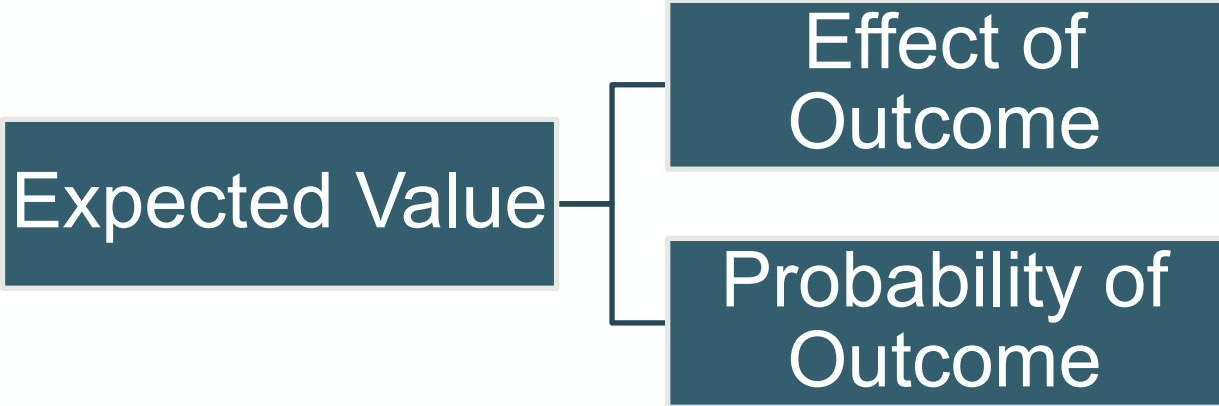
P_2 -Probability of First Stage not Surviving

COMBINED MODEL – Expected Value

$$EV = \sum U_i \cdot P_i$$

U_i -Outcomes

P_i -Probability of Outcome



COMBINED MODEL – Expected Value

Standard Case

$$EV = \sum U_i \cdot P_i$$

Simple Case:

	Profit	RFG	Insurance Premium	Replace Vehicle	Relaunch Payload	Insurance Increase	Failure Investigation	Modifications	Downtime
Total Success	✓								
Ascent Failure	✓			✓			✓	✓	✓
Landing Failure	✓			✓				✓	

COMBINED MODEL – Expected Value Re-Flight Guarantee

$$EV = \sum U_i \cdot P_i$$

RFG Case:

	Profit	RFG	Insurance Premium	Replace Vehicle	Relaunch Payload	Insurance Increase	Failure Investigation	Modifications	Downtime
Total Success	✓	✓							
Ascent Failure	✓	✓		✓	✓		✓	✓	✓
Landing Failure	✓	✓		✓				✓	

COMBINED MODEL – Expected Value Insured Launch Vehicle

$$EV = \sum U_i \cdot P_i$$

Insured Case:

	Profit	RFG	Insurance Premium	Replace Vehicle	Relaunch Payload	Insurance Increase	Failure Investigation	Modifications	Downtime
Total Success	✓		✓						
Ascent Failure	✓		✓			✓	✓	✓	✓
Landing Failure	✓		✓			✓		✓	

COMBINED MODEL – Expected Value

RFG & Insurance

$$EV = \sum U_i \cdot P_i$$

RFG & Insured Case:

	Profit	RFG	Insurance Premium	Replace Vehicle	Relaunch Payload	Insurance Increase	Failure Investigation	Modifications	Downtime
Total Success	✓	✓	✓						
Ascent Failure	✓	✓	✓		✓	✓	✓	✓	✓
Landing Failure	✓	✓	✓			✓		✓	

RESULTS - Reliability

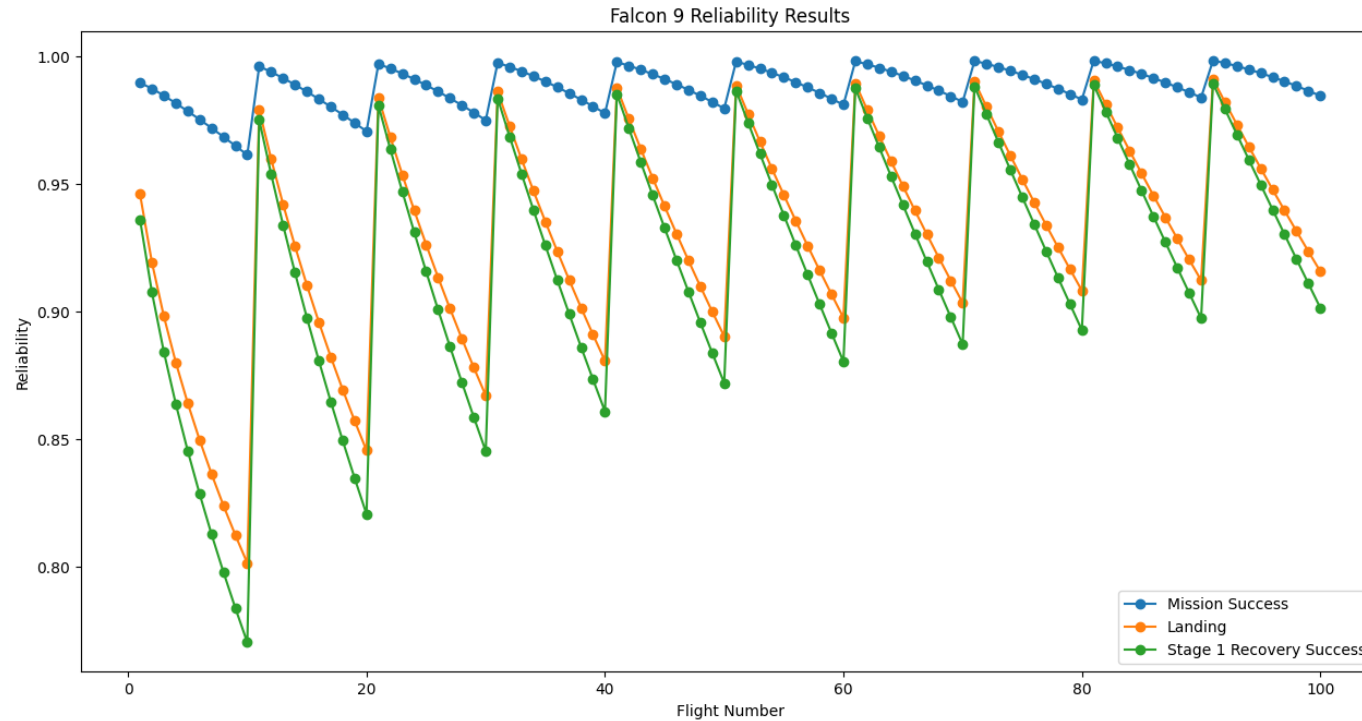


Fig. 8 – Reliability life-cycle results for Falcon 9.

Element	Average Reliability
Mission Success	0.9881
Landing Success	0.9298
First Stage Recovery	0.9190

RESULTS – Cost per Flight

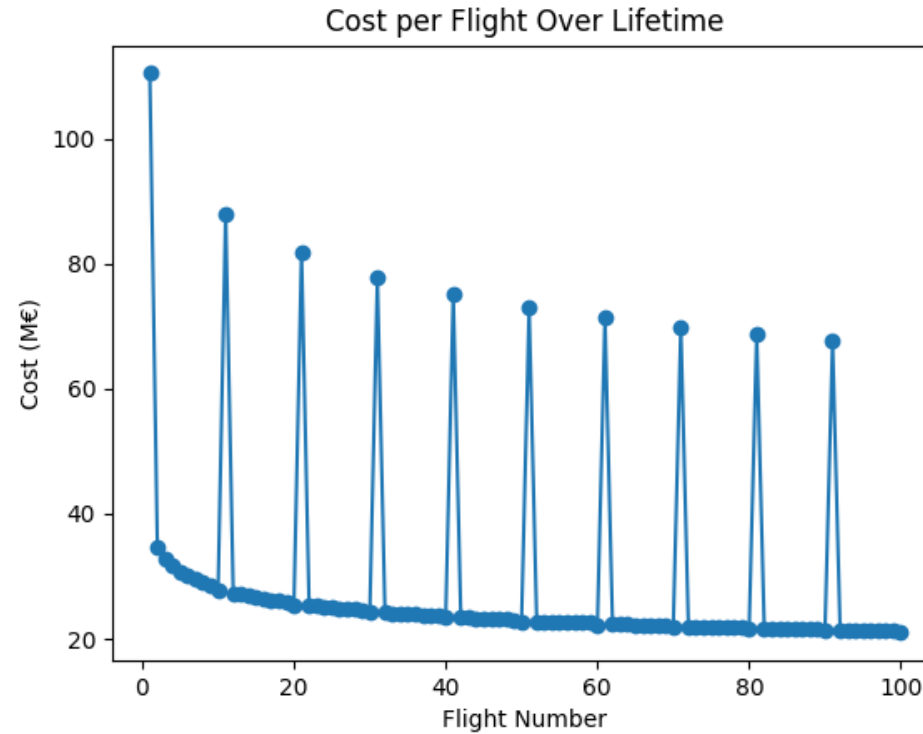


Fig. 9 – Life-cycle Cost per Flight results for Falcon 9.

Flight Type	Average Cost (2021 M€)	Average Cost (2021 M\$)
New Launcher	78.3	92.6
Launch w/ Reused Booster	23.8	28.1
Total	29.3	34.65

RESULTS – Failure Cost

- Expectation from literature: 2-5 times the CpF;
- Result for Falcon 9: 17 times the CpF.

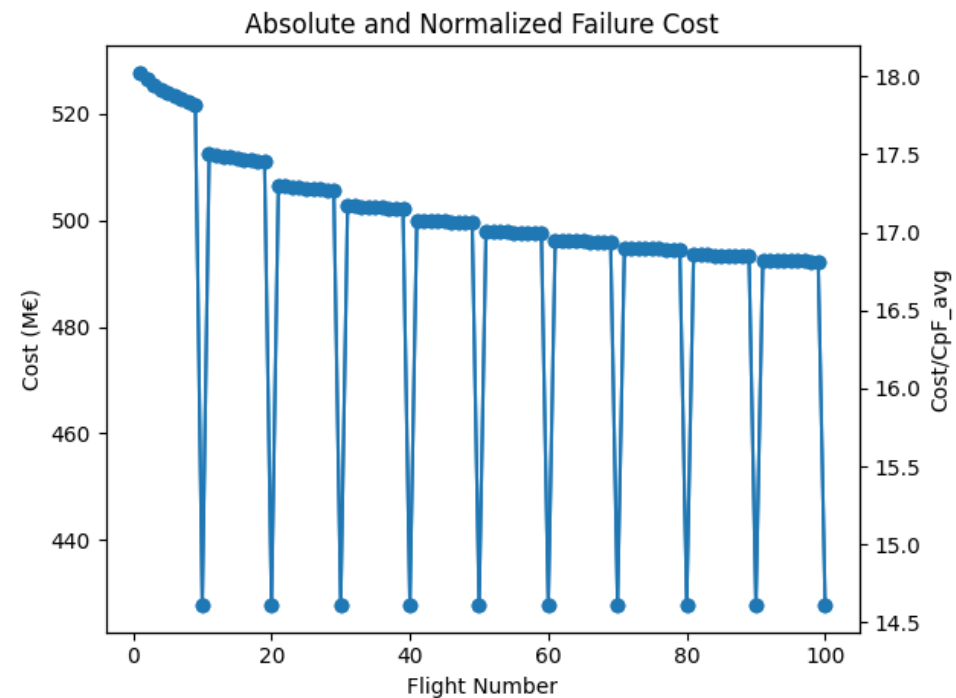
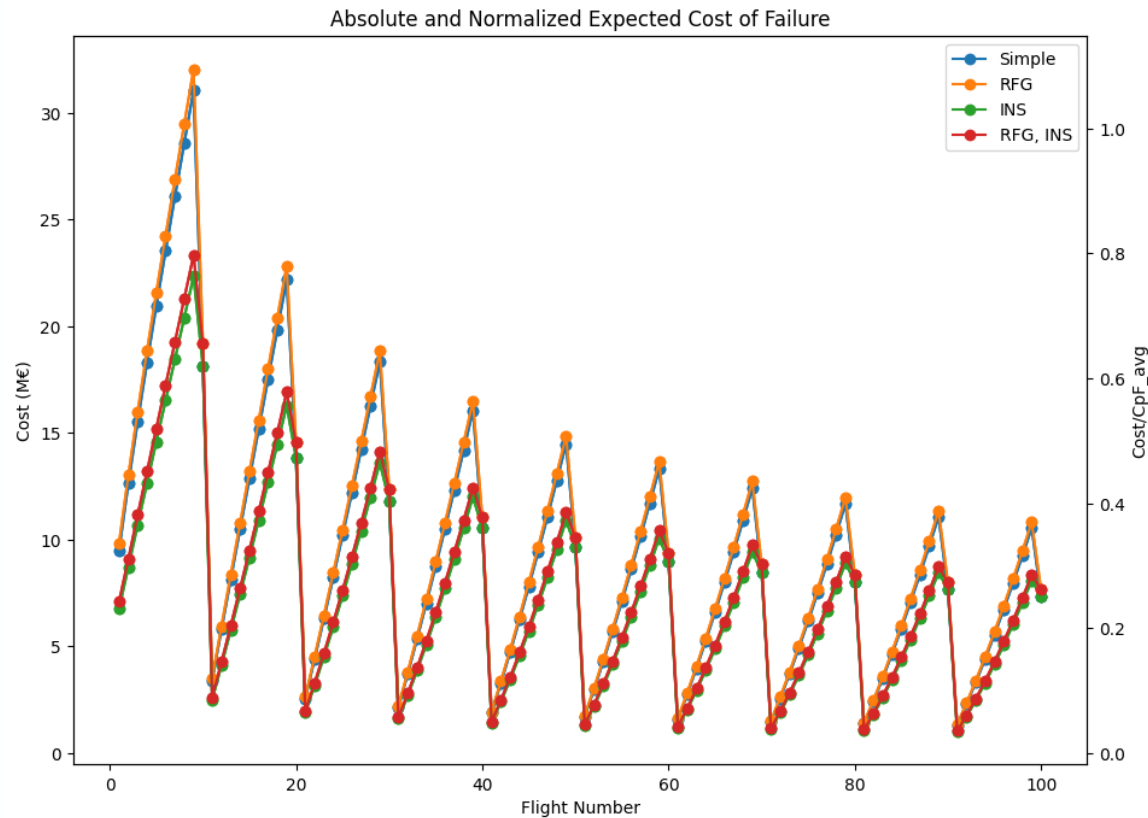


Fig. 10 – Failure cost results for Falcon 9.

RESULTS – Expected Cost of Failure



Case	$C_{F_{avg}}$ (M€)	$C_{F_{avg}}/CpF_{avg}$ (%)
Simple	9.4	32.1%
RFG	9.7	33%
INS	7.2	24.4%
RFG+INS	7.4	25.4%

Fig. 11 – Expected Cost of Failure cost results for Falcon 9.

RESULTS – Expected Value

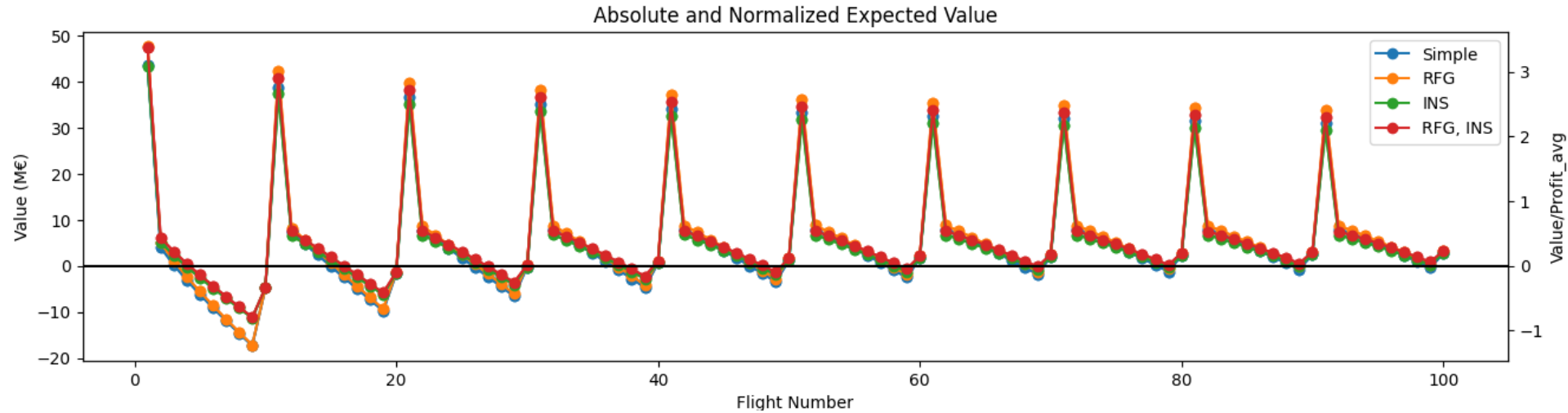


Fig. 12a – Falcon 9 Expected Value results 9 (constant profit).

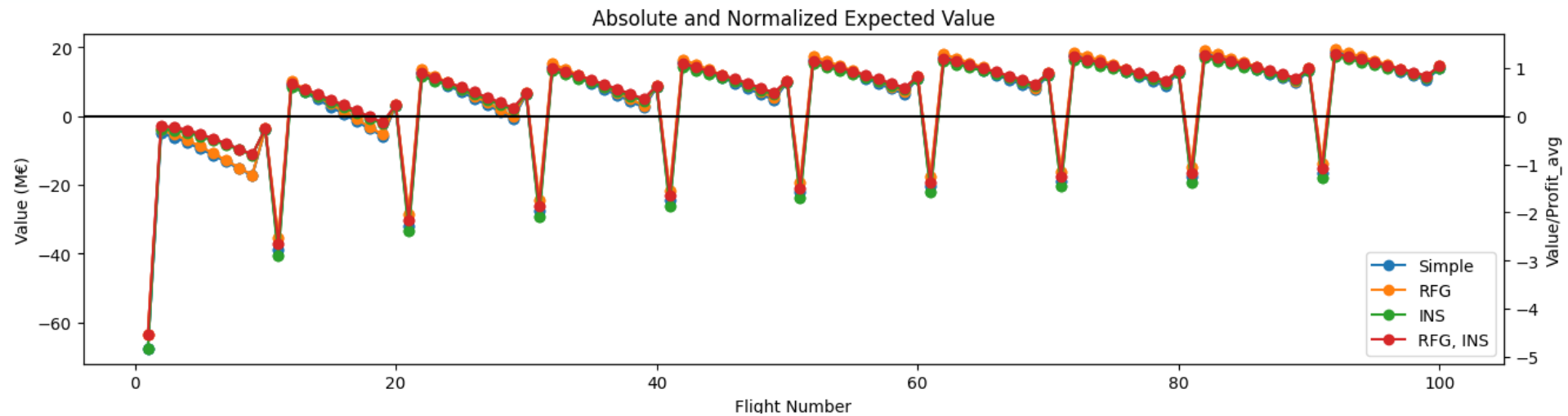


Fig. 12b – Falcon 9 Expected Value results 9 (fixed price).

RESULTS – Expected Value

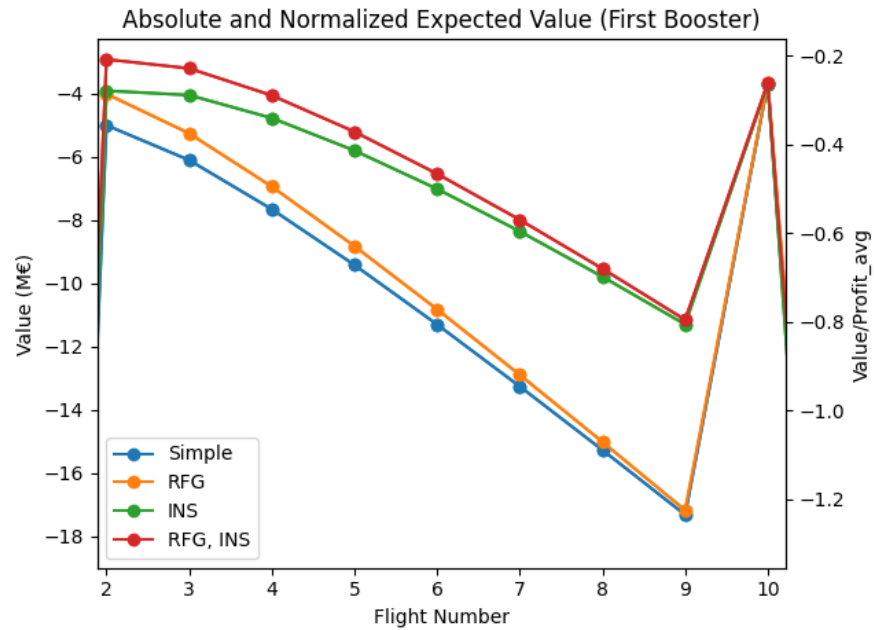


Fig. 13a – Falcon 9 Expected Value (first booster).

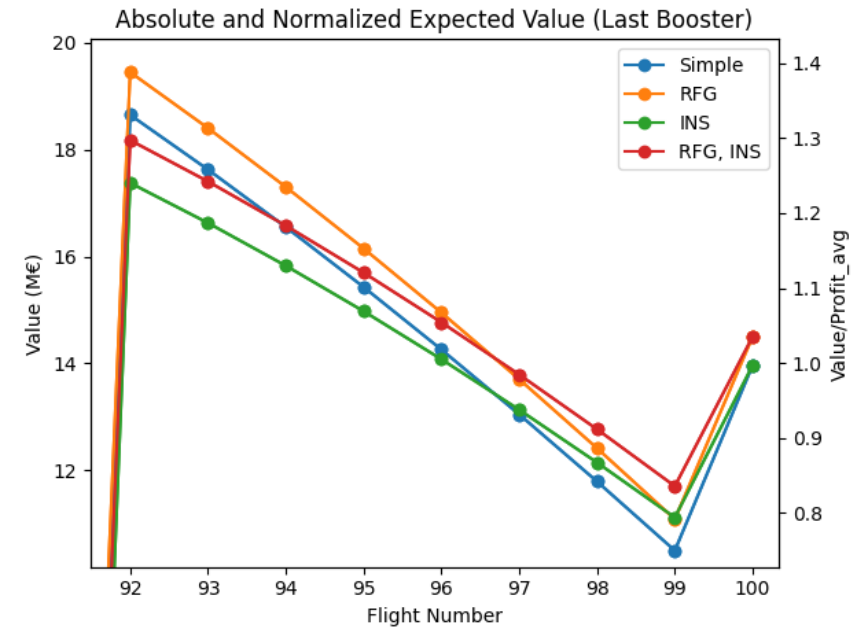


Fig. 13b – Falcon 9 Expected Value (last booster).



RESULTS – Expected Value

Case	EV_{avg} (M€)	$EV_{avg}/(Profit)_{avg}$ (%)
Simple	4.6	32.8%
RFG	5.5	39%
INS	5.0	35.7%
RFG+INS	5.8	41.4%
Maximum Value	6.2	44.3%

RFG: Re-Flight Guarantee

INS: Insurance



RESULTS – Expendable Case



	LpY = 20 Profit = 48%	LpY = 10 Profit = 48%	LpY = 10 Profit = 8%
PpF	96.9 M€	86.3 M€	63 M€
EV/Profit	92.6%	82.6%	30%



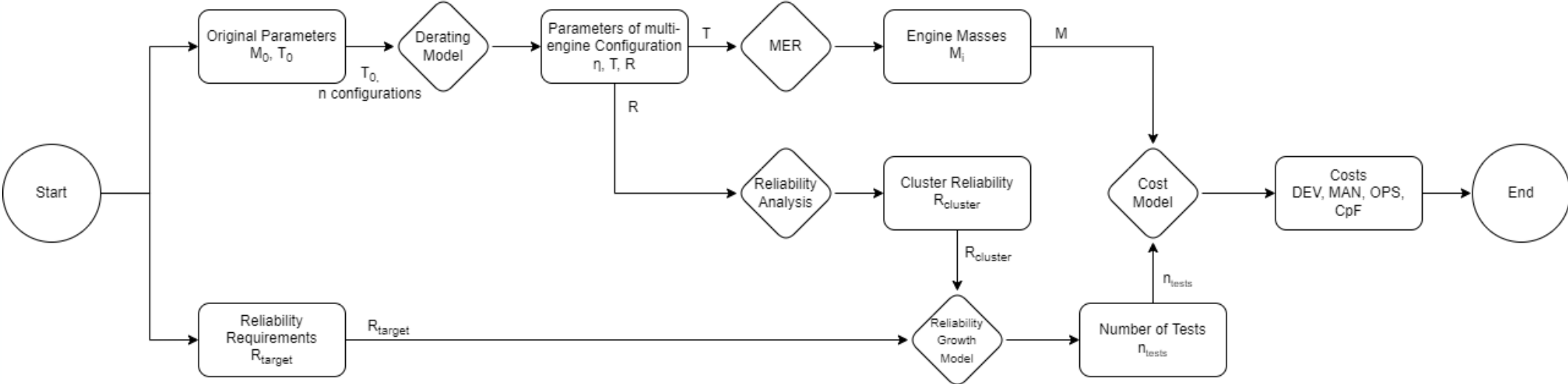


Fig. 14 – Multi-stage problem solving methodology.

Fig. 15a – Expendable Vehicle results.

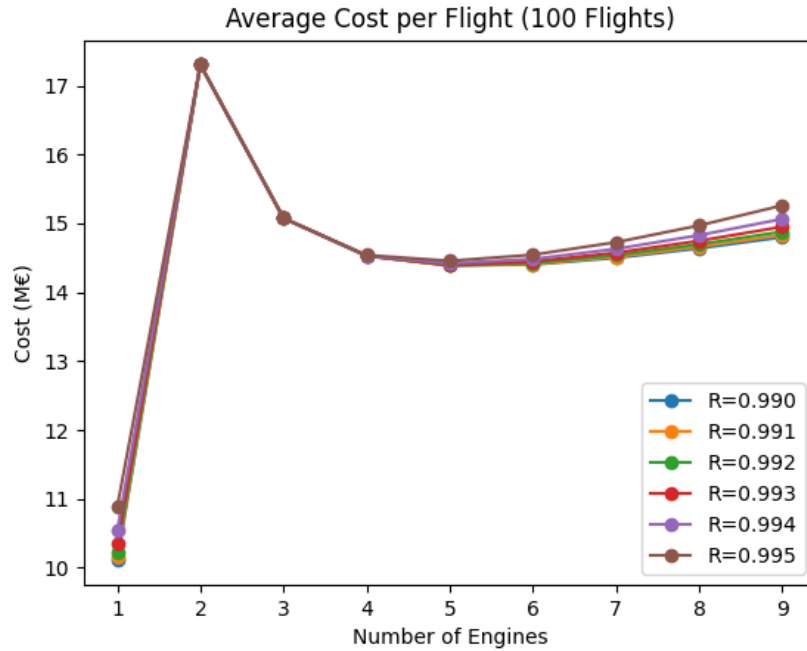
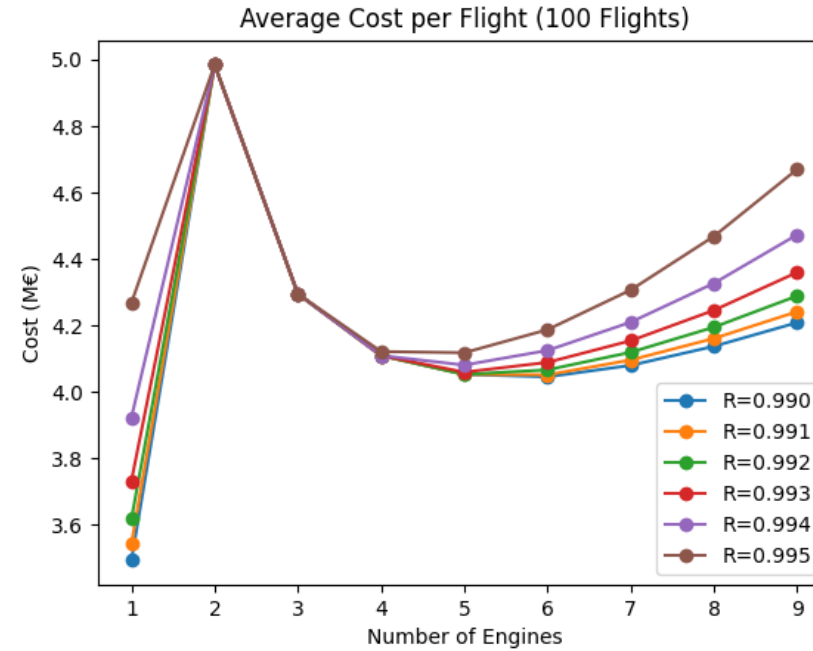


Fig. 15b – Reusable Vehicle results.



Additional findings:

- Engine commonality with upper stage beneficial in reusable case;
- Heavier original engines yield better results

- Combination of tools;
- Development of new CERs;
- Failure incorporated as a cost figure;
- Accounting for cost of Reliability increase;
- New variable for MDO: Value
- Range of applications: From design to insurance

-
- [1] Ayala, L., Carsten, F., & Vitali, W. (2022). Analysis of Space Launch Vehicle Failures and Post - Mission Disposal Statistics. *Aerotecnica Missili & Spazio*, 0123456789. <https://doi.org/10.1007/s42496-022-00118-5>.
- [2] What is censored data. [https://reliability.readthedocs.io/en/latest/What% 20is%20censored%20data.html](https://reliability.readthedocs.io/en/latest/What%20is%20censored%20data.html). Accessed: 25/04/2022.
- [3] Charles Lillie and Bruce Thompson. Parametric cost estimation for space science missions art. no. 701827. 07 2008. doi: 10.1117/12.789615.