



Finanțat de  
Uniunea Europeană  
NextGenerationEU



Planul Național  
de Redresare și Reziliență

# A Decision Support Model to Balance Efficiency and Resilience in SME Digitalization Financing Schemes










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# Agenda

-   **1.** Introduction, context
-  **2.** Problem Formulation and Research Question
-  **3.** Model Development (Literature Review)
-  **4.** Model Development (Methodology)
-  **5.** Empirical Illustration and Results
-  **6.** Conclusions, Scholarly Contribution, and Practical Implications

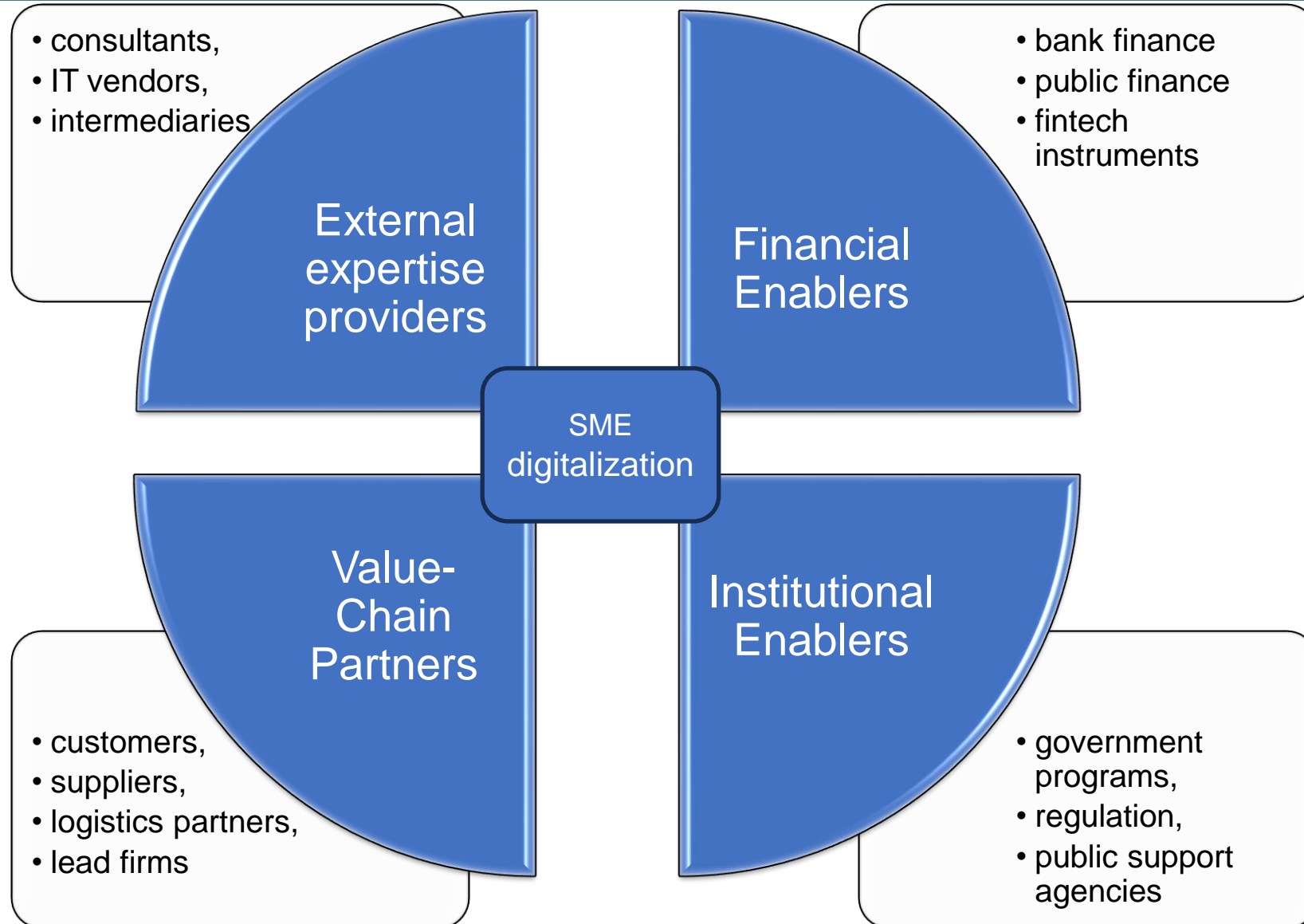


## Specifics of small and medium enterprises (SMEs) and digitalization

| Structural characteristic of SMEs                 | → | Implications for digitalization   |
|---|---|---|
| Limited financial and managerial slack            |   | Digital investments must <b>compete</b> with ongoing operational demands  |
| Central role of the owner-manager                 |   | Technology decisions and implementation quality <b>vary across firms</b>  |
| High sensitivity to short-term shocks             |   | Digitalization initiatives are <b>vulnerable</b> to interruption or delay |
| Heterogeneity in financial structures and buffers |   | Firms differ in their capacity to <b>sustain</b> transformation efforts   |



## SME digitalization ecosystem



*(Ben Slimane et al., 2022;  
Eller et al., 2020;  
Ramdani et al., 2022;  
Raimo et al., 2022;  
Scuotto et al., 2021;  
Pullen et al., 2009)*

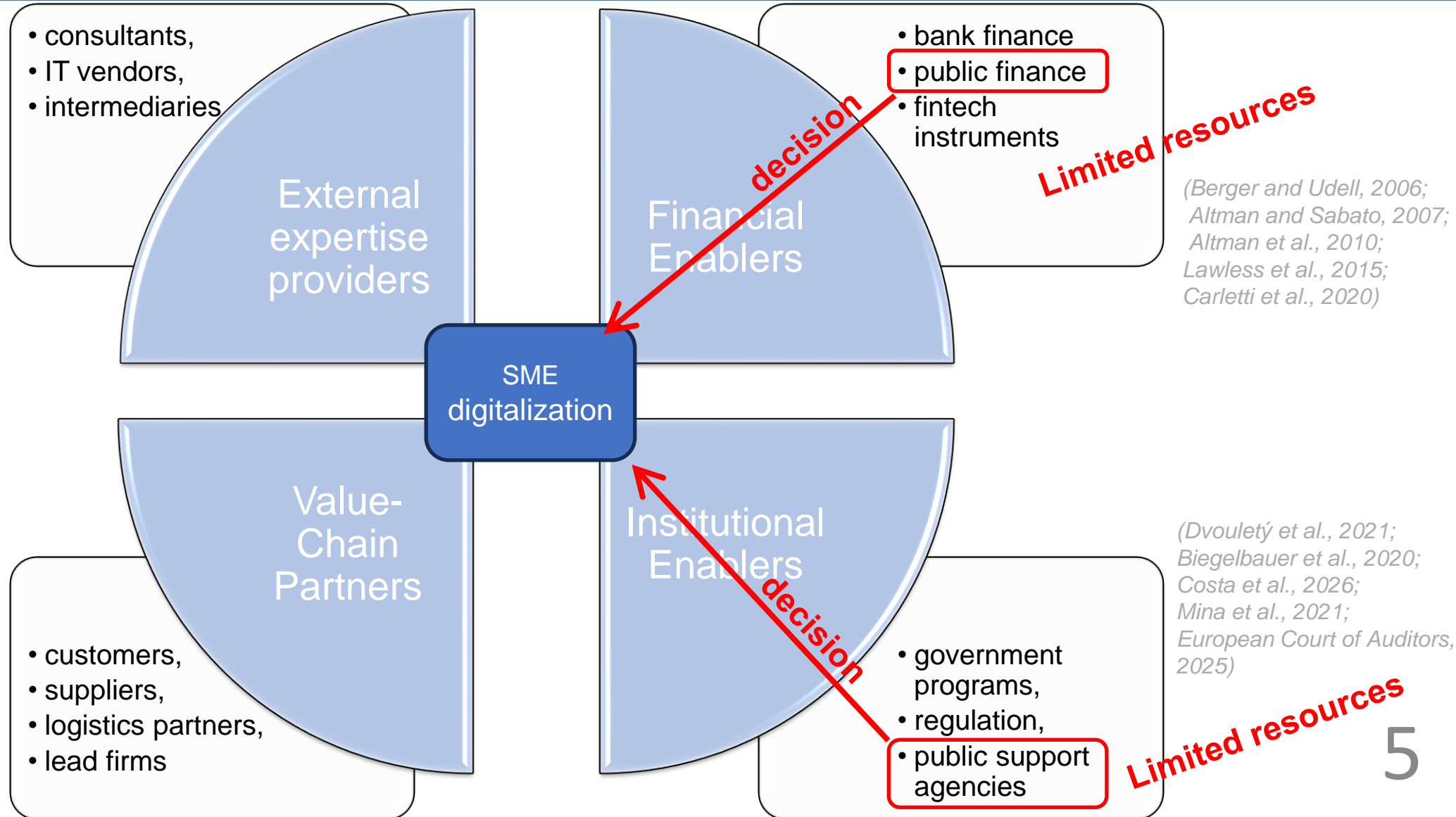
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Schniederjans et al., 2020;  
Huang et al., 2023;  
Hamann-Lohmer et al., 2023;  
Gunasekaran and Ngai, 2004)*

*(Dvouletý et al., 2021;  
Biegelbauer et al., 2020;  
Costa et al., 2026;  
Mina et al., 2021;  
European Court of Auditors,  
2025)*



## SME digitalization ecosystem



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# Introduction, context

Allocation decisions are made under constraints (capacity, budget, risk tolerance) across many organizations worldwide:

**KMU.DIGITAL**



CANADA DIGITAL  
ADOPTION PROGRAM



Investitionen von heute.  
Erfolg von morgen.



中小企連線  
SME LINK

**KFW**

Bank aus Verantwortung



Avancerad Digitalisering

austria  
wirtschafts  
service **aws**

**VLAIO**



經濟部中小及新創企業署

**IM** INFOCOMM  
MEDIA  
DEVELOPMENT  
AUTHORITY



Wallonie  
infrastructures  
SPW

INVITALIA



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# Problem formulation and research question

## Research question

**What decision architecture makes SME digitalization support selection transparent and auditable about efficiency - resilience trade-offs?**



# Problem formulation and research question

## Research question

What decision architecture makes **SME digitalization support selection** transparent and auditable about efficiency - resilience trade-offs?

## Architecture

A transparent **selection structure** that separates minimum standards from ranking priorities, making **trade-offs explicit** (not hidden in weights)

## Operationalization

Two decision-time objectives, built from standard financial statements (efficiency vs resilience kept separate)

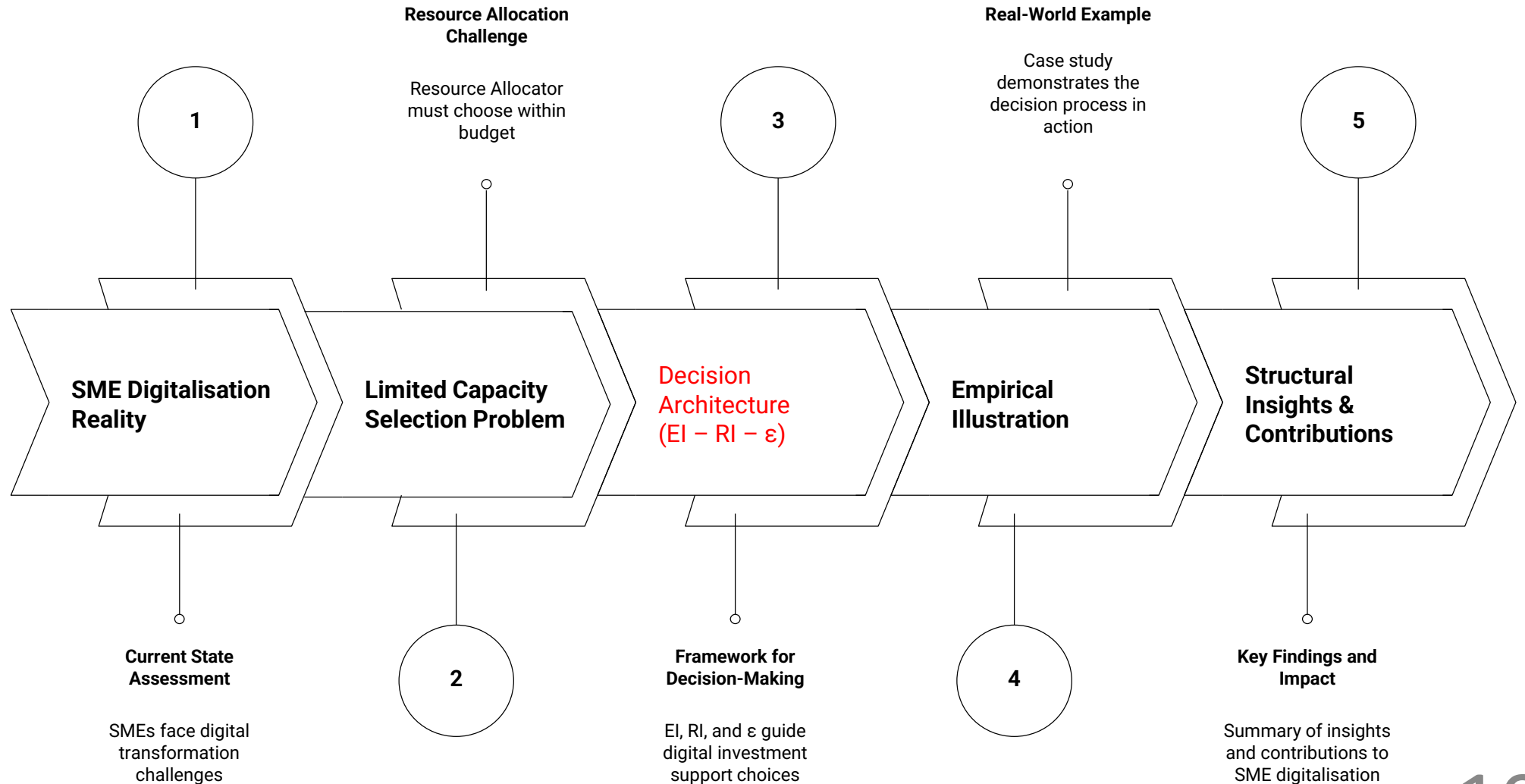
## Diagnostics

The model yields interpretable program-design outputs:

- eligibility,
- implicit cutoffs, and a
- feasibility boundary

# Building the decision support model

## Structure



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## Why fund allocators need both efficiency and resilience?

### **Efficiency rationale** (public value creation)

- Digitalisation programs aim to generate productivity and scaling effects
  - Allocators prioritise firms likely to absorb and operationalise support effectively
- Objective: maximise expected economic impact

### **Resilience rationale** (risk containment & stewardship)

- SMEs differ substantially in financial robustness
- Supporting financially fragile firms increases default and implementation risk
- Public governance requires defensible safeguards in allocation

### **Structural challenge**

- Efficiency and resilience are weakly correlated
- High efficiency does not imply high resilience

→ **The trade-off is structural, not rhetorical**



## How the resilience–efficiency trade-off affects SMEs

**Resource redundancy costs:** Increasing resilience requires buffering and redundancy (e.g., safety stocks), which directly lowers operational efficiency by increasing input costs (Berendes et al., 2025)

**The efficiency-adaptability paradox:** SMEs face a conflict between the need to cut costs to survive short-term (efficiency) and the need to experiment and invest to adapt long-term (resilience) (Chaudhary et al., 2024).

**Opportunity costs of consistency:** Trying to maintain a perfect balance between exploitation (efficiency) and exploration (resilience) during a crisis generates high opportunity costs that hamper recovery, following an inverted U-shaped relationship (Iborra et al., 2022)



## Resilience Index (RI): definition and theoretical operationalization

### Resilience in SMEs: two lenses

- **Baseline survival capacity** (competition/exit/default type resilience) (Linnenluecke, 2017; Korber and McNaughton, 2018; Koporcic et al., 2026).
- **Shock resilience** (absorb disruption, stabilise operations, recover) (Doern et al., 2019; Miklian and Hoelscher, 2022; Koporcic et al., 2026).

### Scalable proxies used in large-sample research

- Accounting-based predictors are widely used for SME survival/resilience screening (Altman and Sabato, 2007; Altman et al., 2010; Lawless et al., 2015; Carletti et al., 2020).

### Operational definition (conceptual formula)

- **RI = average (Liquidity buffer, Solvency/Equity cushion, Earnings capacity)**



## Efficiency Index (EI): definition and theoretical operationalization

### Digitalisation “efficiency” in two angles

- **Adoption / readiness angle:** why SMEs adopt (or fail to adopt) digital technologies given constraints and readiness factors (Eller et al., 2020; Ramdani et al., 2022; Raimo et al., 2022).
- **Impact / absorption angle:** heterogeneous operational and performance effects; depends on execution and complementary investments (Brynjolfsson and Hitt, 2000; Kohli and Devaraj, 2003; Devaraj et al., 2007; Oduro et al., 2023).

### Scalable decision-time proxies (hard signals)

- Productivity-related dynamics are used as observable operational channels (Tian et al., 2023; Demeter et al., 2024; Benedek et al., 2025).

### Operational definition (conceptual formula)

- **EI = average (Productivity dynamics, Scaling / asset-base dynamics)**



## Transparency: make decision explicit

Composite score (single number)

$$\text{Score}_i = w_1 \cdot \text{EI}_i + w_2 \cdot \text{RI}_i$$

w1 (EI weight)

w2 (RI weight)

(trade-off embedded in weights)

Transparent rule architecture

Step 1: eligibility gate  
Index  $\geq \epsilon$

Step 2: ranking priority  
rank by other index  $\rightarrow$  pick K

(choices explicit:  $\epsilon$  + ranking)

Minimum standards and ranking priorities are **explicit** and **auditable**. This architecture makes the implicit economics of fixed-capacity selection explicit, *revealing cutoff dynamics and feasibility limits as structural properties of the rule*.

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## How we construct Resilience Index (RI)?

Common denominator: Total Assets

$$TA_{\{i,t\}} = FixedAssets_{\{i,t\}} + CurrentAssets_{\{i,t\}} + PrepaidExpenses_{\{i,t\}}.$$

Liquidity buffer:

$$LIQ_i = \frac{CashAndBank_{\{i,2022\}}}{TA_{\{i,2022\}}}$$

Equity cushion / solvency:

$$SOLV_i = \frac{Equity_{\{i,2022\}}}{TA_{\{i,2022\}}}.$$

Earnings capacity:

$$CAP_i = \frac{EBIT_{\{i,2022\}}}{TA_{\{i,2022\}}}$$

Resilience Index in equal weights:

$$RI_i = \frac{LIQ_i + SOLV_i + CAP_i}{3}$$



## How we construct Efficiency Index (EI)?

Two decision-time **dynamics**: asset-base growth + labour productivity growth

Labour productivity:  $LP_{\{i,t\}} = \frac{TotalRevenues_{\{i,t\}}}{EmpAdj_{\{i,t\}}}$ .) *EmpAdj* ≥ 1; owner-managed firms adjusted)

Use **bounded symmetric growth** (Davis, Haltiwanger and Schuh, 1996)

$$DHS_{GROW_i} = \frac{2 \cdot (TA_{\{i,2022\}} - TA_{\{i,2021\}})}{TA_{\{i,2022\}} + TA_{\{i,2021\}}}; DHS_{PROD_i} = \frac{2 \cdot (LP_{\{i,2022\}} - LP_{\{i,2021\}})}{LP_{\{i,2022\}} + LP_{\{i,2021\}}}$$

Efficiency Index in equal weights:

$$EI_i = \left( \frac{DHS_{GROW_i} + DHS_{PROD_i}}{2} + 2 \right) / 4 \rightarrow \text{mapped to } [0,1]$$

Interpretation: **0.5** ≈ no change, >0.5 improvement, <0.5 contraction

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## Empirical setting & decision-time principle

- Romanian NRRP/PNRR 2023 SME digitalization call (competitive selection): **companies with proven interest in digitalization**
- Decision-time inputs: annual financial statements **2021–2022** (pre-award)
- Eligible applicants (after data cleaning): **N = 4,537** → turnover filter  $\geq 200,000$  RON → **N = 3,912**
- Fixed capacity: **K = 1,000** awards
- Romanian accounting data “tweak”: EBIT is not available in the official extract; therefore, CAP uses “Profit Brut” ( $\approx$  gross profit) as a proxy. This measure may include earnings components beyond EBIT (e.g., financial/investment-related items).

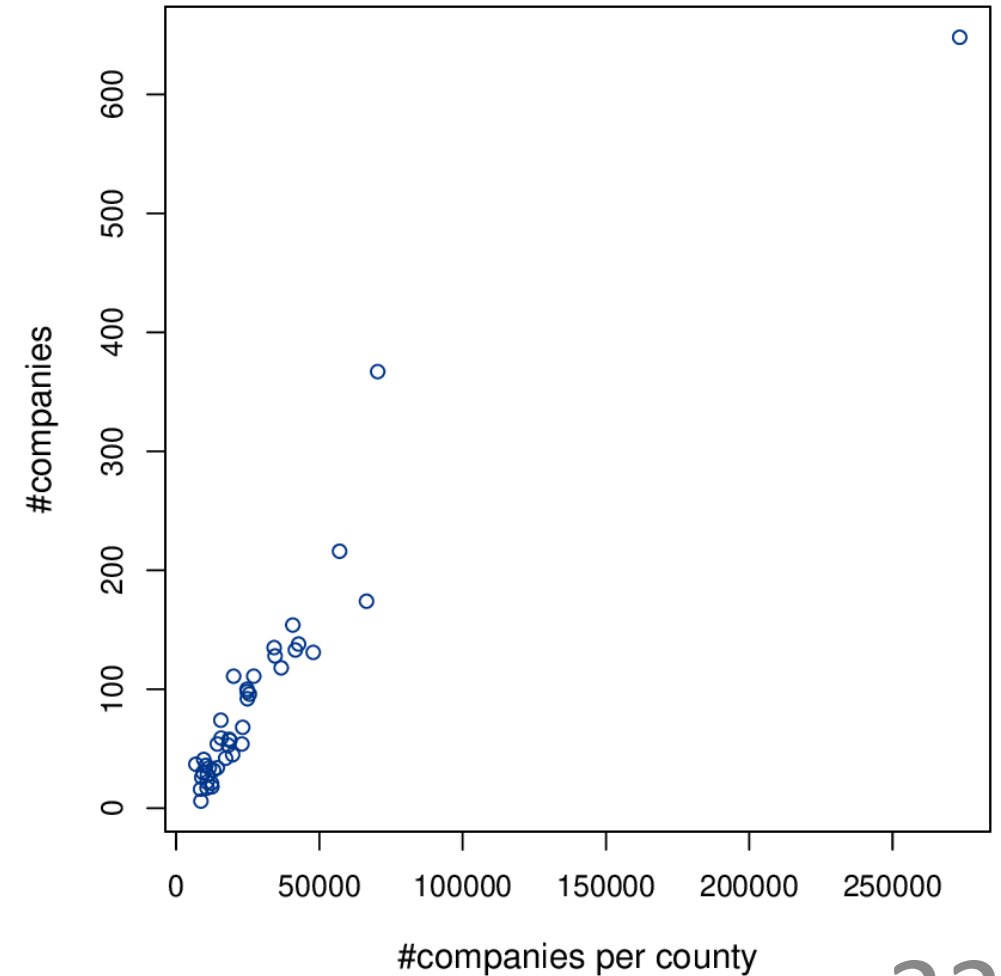
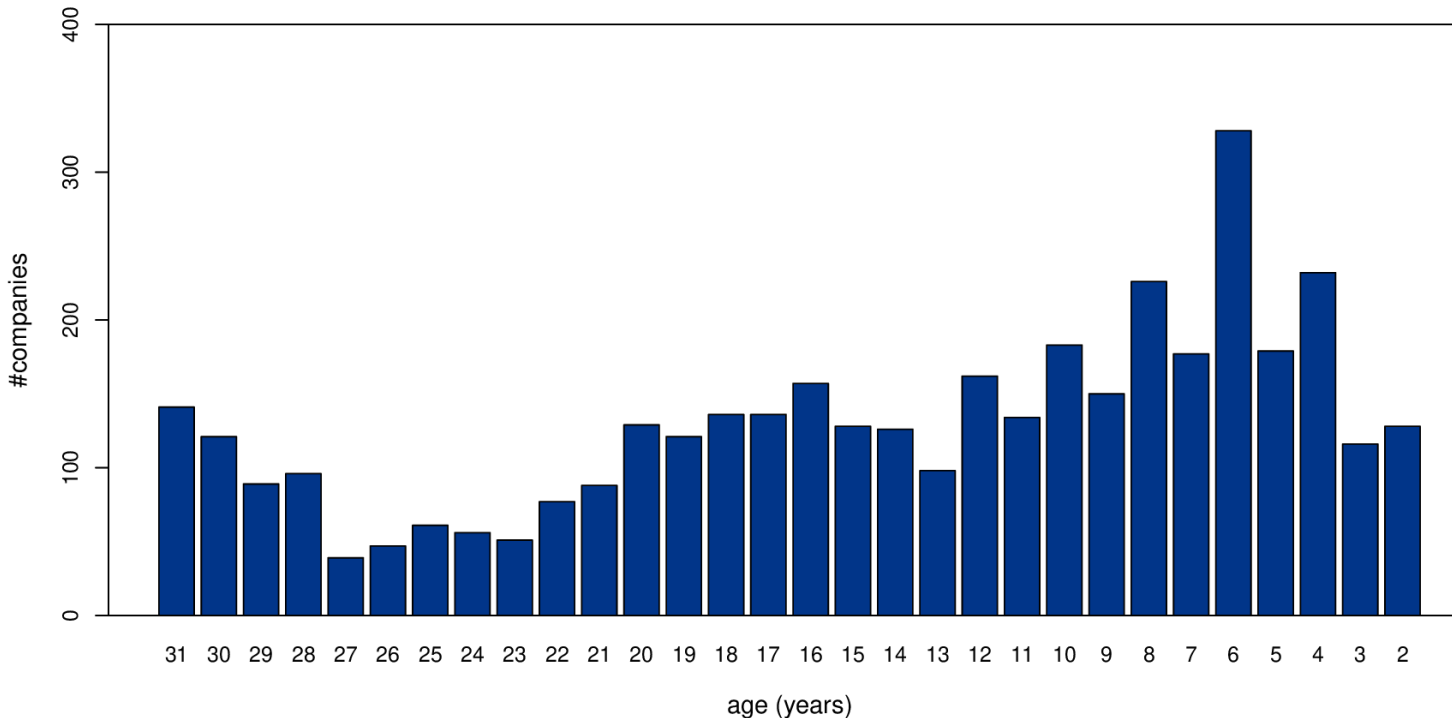


## Sample profile

financial statements **2021–2022** (pre-award)

**N = 3,912**, **K = 1,000** awards

Age and county-level heterogeneity.



# Empirical Illustration and Results

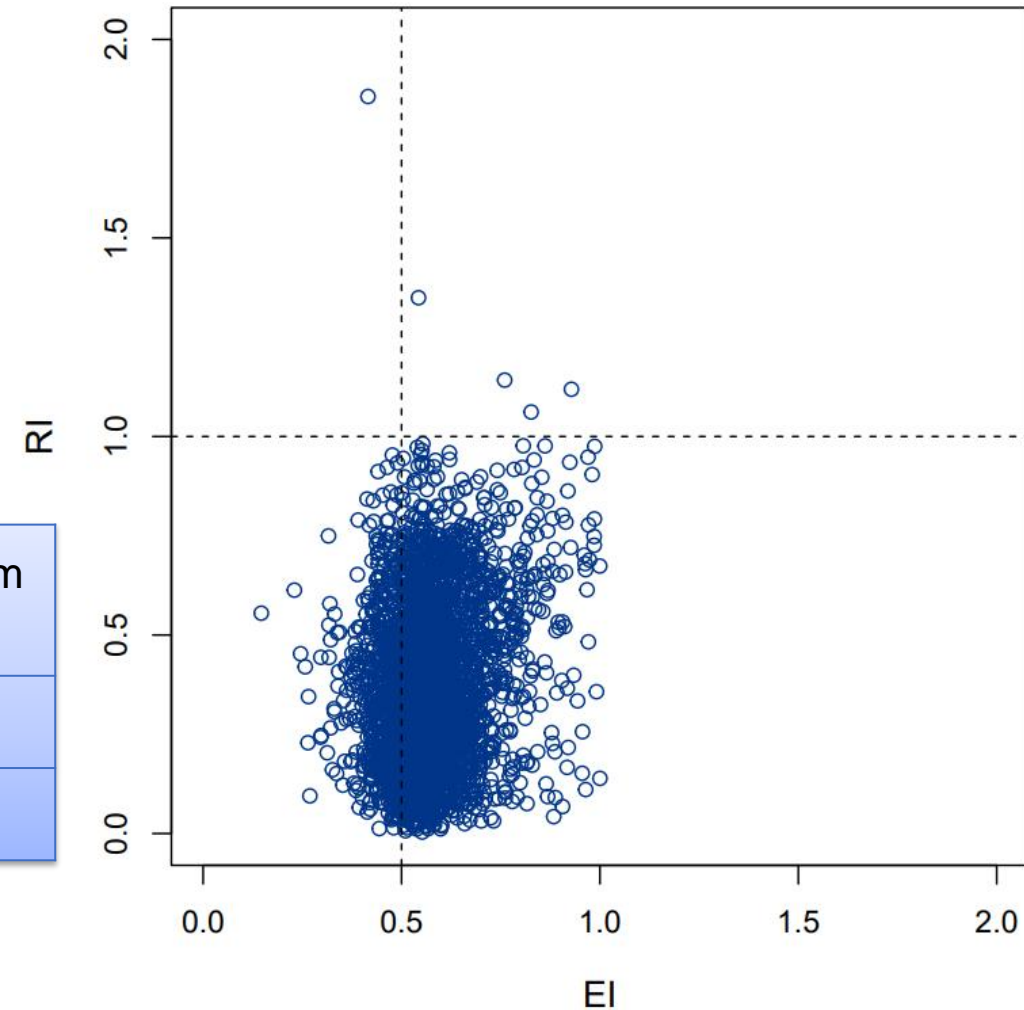
## Descriptives: EI vs RI (N = 3,912)

EI and RI capture distinct firm profiles

Spearman correlation:  $\rho = 0.1628$

Implication: multi-objective selection is non-redundant

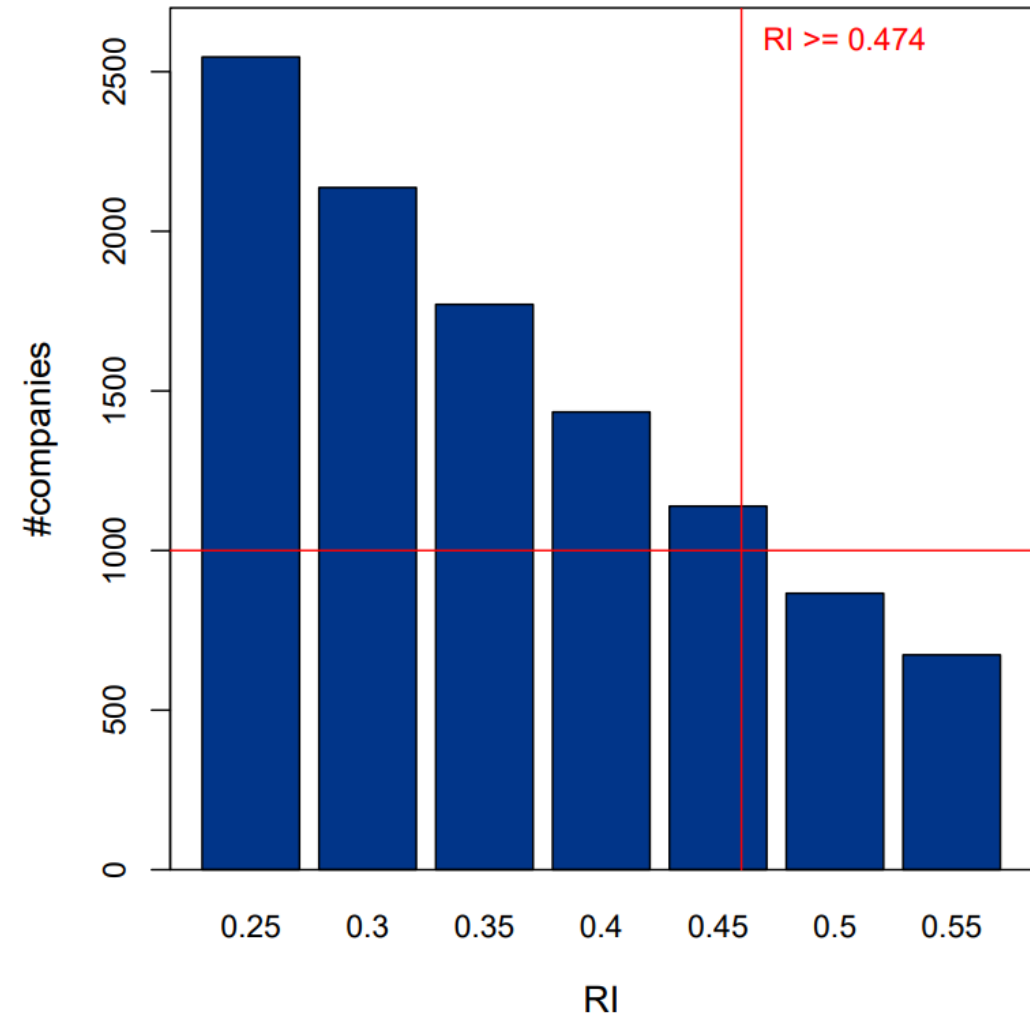
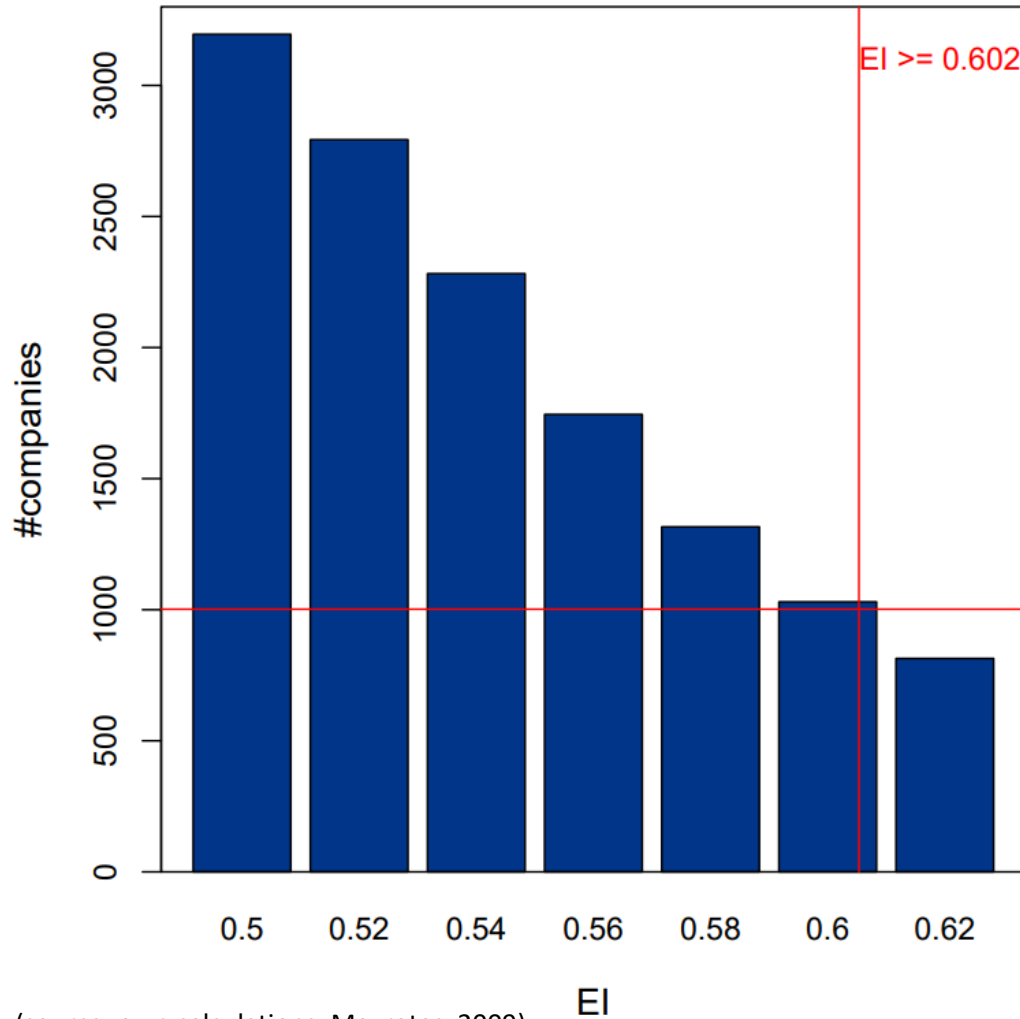
| Index | Median | Mean  | 95th percentile | 99th percentile | Maximum |
|-------|--------|-------|-----------------|-----------------|---------|
| RI    | 0.323  | 0.354 | 0.717           | 0.887           | 1.856   |
| EI    | 0.551  | 0.566 | 0.746           | 0.889           | 0.999   |



# Empirical Illustration and Results

## Near-feasible thresholds ( $\epsilon^*$ ): feasibility diagnostic

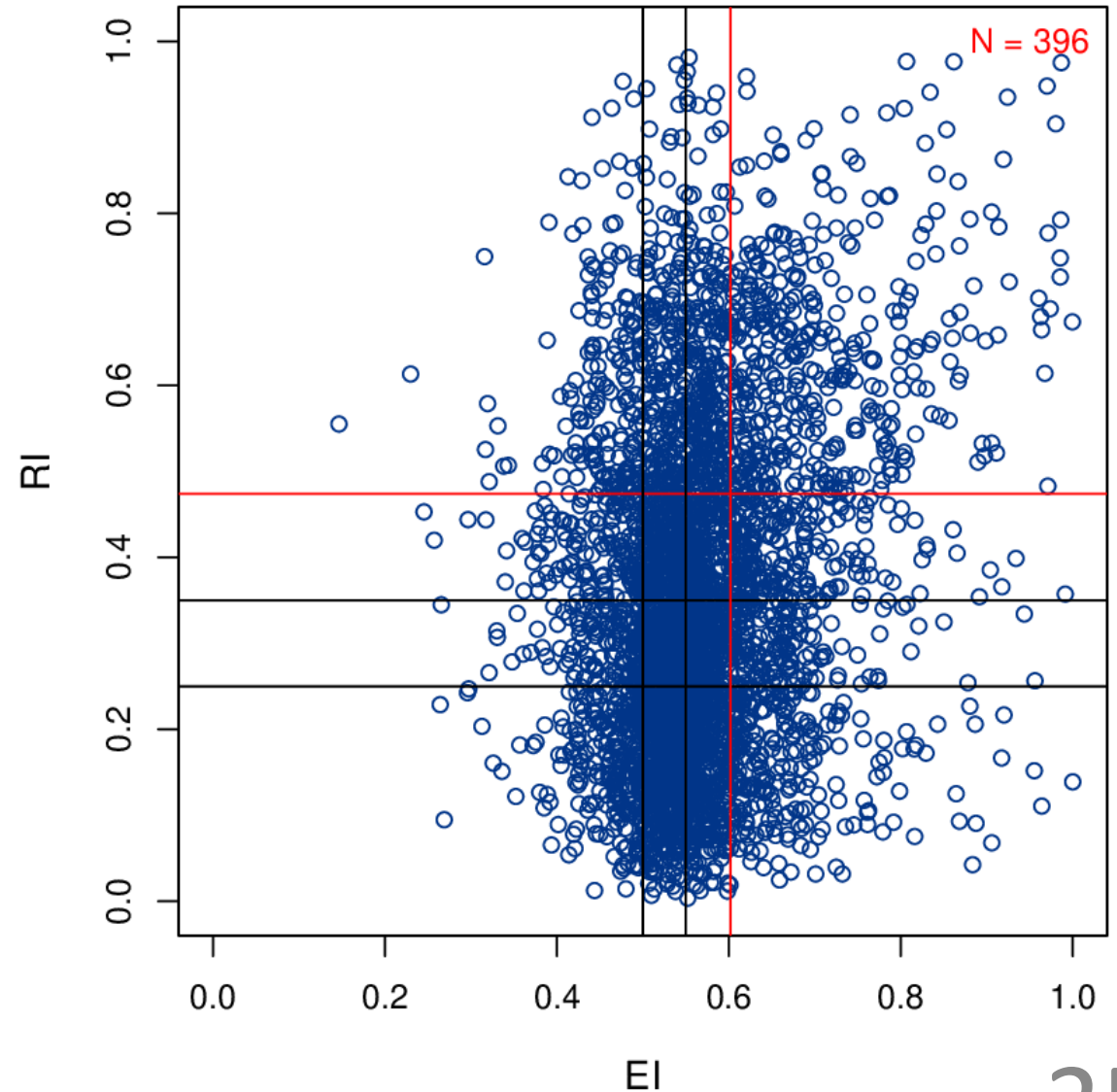
$\epsilon^*$  = highest threshold still allowing Eligible  $\geq K$  (1000)



(source: own calculations; Mavrotas, 2009)

# Empirical Illustration and Results

- Total companies in sample:  $N=3,912$
- A minimum standard defines an eligibility region
- Only  $N=396$  companies meet both both thresholds simultaneously
- Tightening  $\varepsilon$  reshapes the candidate pool under fixed capacity
- Cutoff pressure concentrates near the portfolio boundary



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**A transparent rule architecture using financial statements can make fixed-capacity SME digitalization funding decisions auditable with respect to efficiency–resilience trade-offs**

- EI and RI capture distinct firm profiles → multi-objective selection is **non-redundant** ( $\rho \approx 0.1628$ )
- Under **fixed capacity (K)**, tightening a minimum standard reshapes the portfolio and shifts the **implicit cutoff** (a structural effect, not an artefact)
- The near-feasible threshold ( $\varepsilon^*$ ) is a **feasibility diagnostic**: highest standard still allowing eligible  $\geq K$

# Conclusions, Scholarly Contribution, Practical Implications

## Scholarly contribution

- A **decision architecture** for fixed-capacity multi-objective selection that makes **trade-offs explicit** and auditable
- Provides interpretable diagnostics for rule design: **eligibility, cutoffs, feasibility boundary**

## Practical contribution

- Uses **standard financial statements** as scalable decision-time signals
- Supports defensible allocation under scrutiny (transparent parameters vs opaque weighting)

## Limitations

- Screening/allocation tool using decision-time accounts — **not** a causal impact evaluation
- Accounting data are a partial view (soft enablers/capabilities largely unobserved)
- Short-window dynamics and nominal accounts require cautious interpretation

# Research project

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# Thank you for your attention!



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# Appendix

# First finding

Take a look at the two indices, they are weakly correlated ...

| Scenario                                 | Rule    | Constraint      | Eligible N | Cutoff | RI mean | RI median | EI mean | EI median |
|--|---------|-----------------|------------|--------|---------|-----------|---------|-----------|
| Baseline (rank EI)                       | Rank EI | None            | 3912       | 0.602  | 0.424   | 0.405     | 0.688   | 0.662     |
| Baseline (rank RI)                       | Rank RI | None            | 3912       | 0.474  | 0.627   | 0.605     | 0.599   | 0.578     |
| $\epsilon$ -constraint A                 | Rank EI | RI $\geq$ 0.25  | 2546       | 0.577  | 0.500   | 0.477     | 0.667   | 0.640     |
| $\epsilon$ -constraint A                 | Rank EI | RI $\geq$ 0.35  | 1771       | 0.552  | 0.548   | 0.522     | 0.650   | 0.621     |
| $\epsilon$ -constraint A                 | Rank EI | RI $\geq$ 0.45  | 1139       | 0.480  | 0.607   | 0.584     | 0.617   | 0.587     |
| $\epsilon$ -constraint A (near-feasible) | Rank EI | RI $\geq$ 0.474 | 1000       | 0.147  | 0.627   | 0.605     | 0.599   | 0.578     |
| $\epsilon$ -constraint B                 | Rank RI | EI $\geq$ 0.50  | 3195       | 0.437  | 0.599   | 0.574     | 0.624   | 0.592     |
| $\epsilon$ -constraint B                 | Rank RI | EI $\geq$ 0.55  | 2002       | 0.357  | 0.552   | 0.524     | 0.648   | 0.621     |
| $\epsilon$ -constraint B                 | Rank RI | EI $\geq$ 0.60  | 1030       | 0.084  | 0.432   | 0.412     | 0.686   | 0.660     |
| $\epsilon$ -constraint B (near-feasible) | Rank RI | EI $\geq$ 0.602 | 1000       | 0.025  | 0.424   | 0.405     | 0.688   | 0.662     |