

# On the impact of inventory accuracy improvements on sales

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**Christoph Glock, Yacine Rekik, Aris A. Syntetos**

# About us

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## ■ Christoph Glock

- Professor Chair: Technical University of Darmstadt, Germany
- Specialises in Inventory Optimisation and Warehousing Management

## ■ Yacine Rekik

- Professor Chair: EM-Lyon Business School, France
- Specialises in Inventory Optimisation and Tracking (e.g. RFID) Technologies

## ■ Aris A. Syntetos

- Panalpina Chaired Professor: Cardiff Business School, Cardiff University, UK
- Specialises in Statistical Forecasting, Demand Classification & Inventory Optimisation.

## Background and objectives

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- **Inventory inaccuracies: major issue in retailing and apparel industry.**
- **Physical stock is (typically) less than what we think it is.**
  - Most reasonable assumption in retailing. Generally, stores are negative in terms of stock.
  - Thus, reconciling inventories may only lead to an increase in sales.
  - *(We will see later that positive stock discrepancies are also possible, still leading though to reduced sales!)*
- **The problem has been established; we are not here to argue for its existence.**

# Background and objectives

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## ■ But rather:

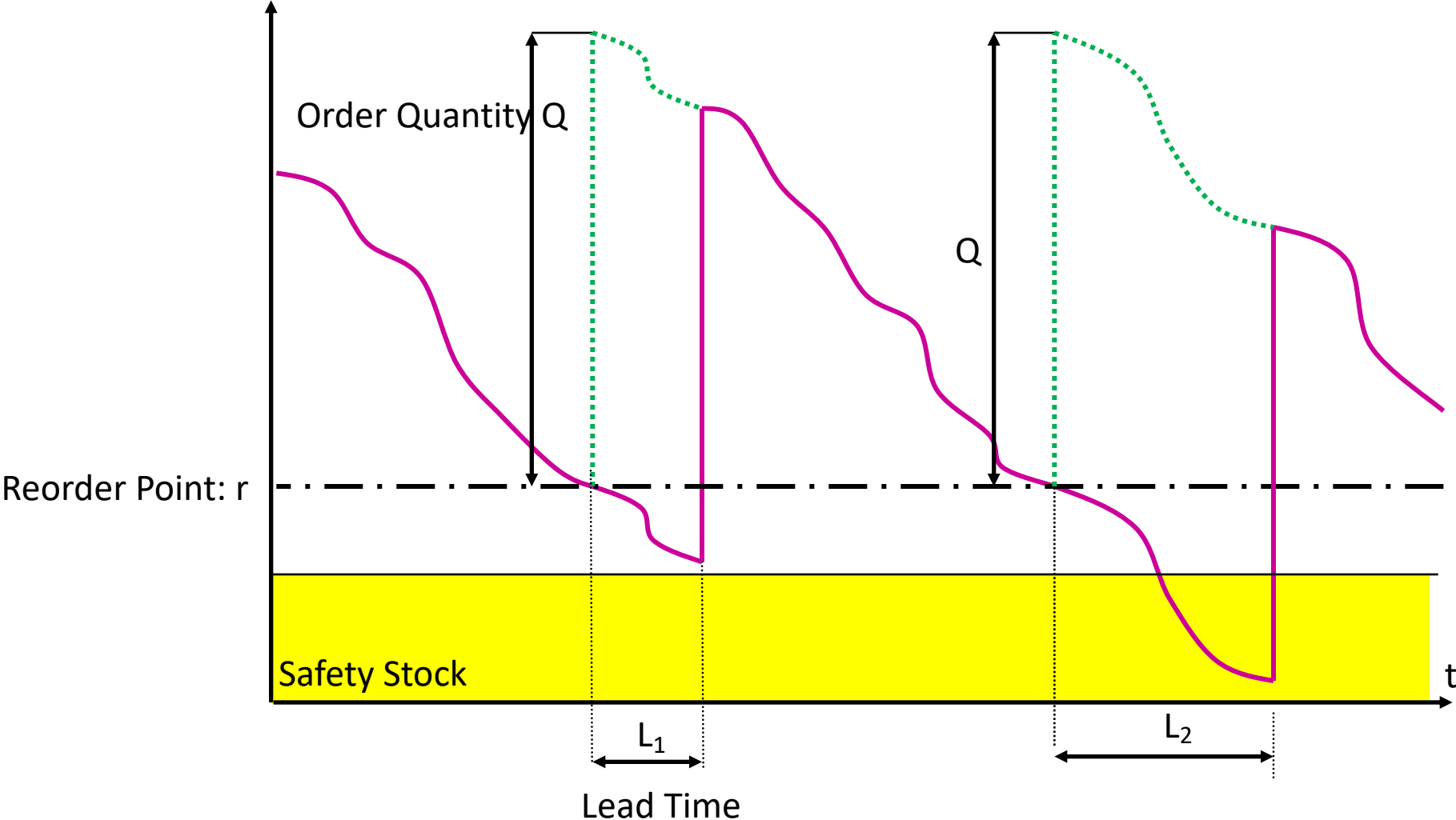
- Assess the implications of the problem, or rather the implications of fixing the problem (phase 1);
- Assess alternative ways of fixing the problem itself (phase 2).

## ■ Phase 1: What is the impact on (increased) sales if inventory accuracy is increased by $x\%$ ?

- How does inventory accuracy develop over time after a stock take?
- Is there an optimal number of stock takes? Do too many stock takes negatively influence inventory accuracy?
- What exactly constitutes this problem of inventory discrepancies?

## ■ Phase 2 (upon clearly establishing the implications): what are the strategies to be employed (algorithmic driven, new identification technologies, counting, etc.) to fight the root causes of the problem?

# Error free $(r, Q)$ inventory policy



# Impact of errors on the $(r, Q)$ inventory policy

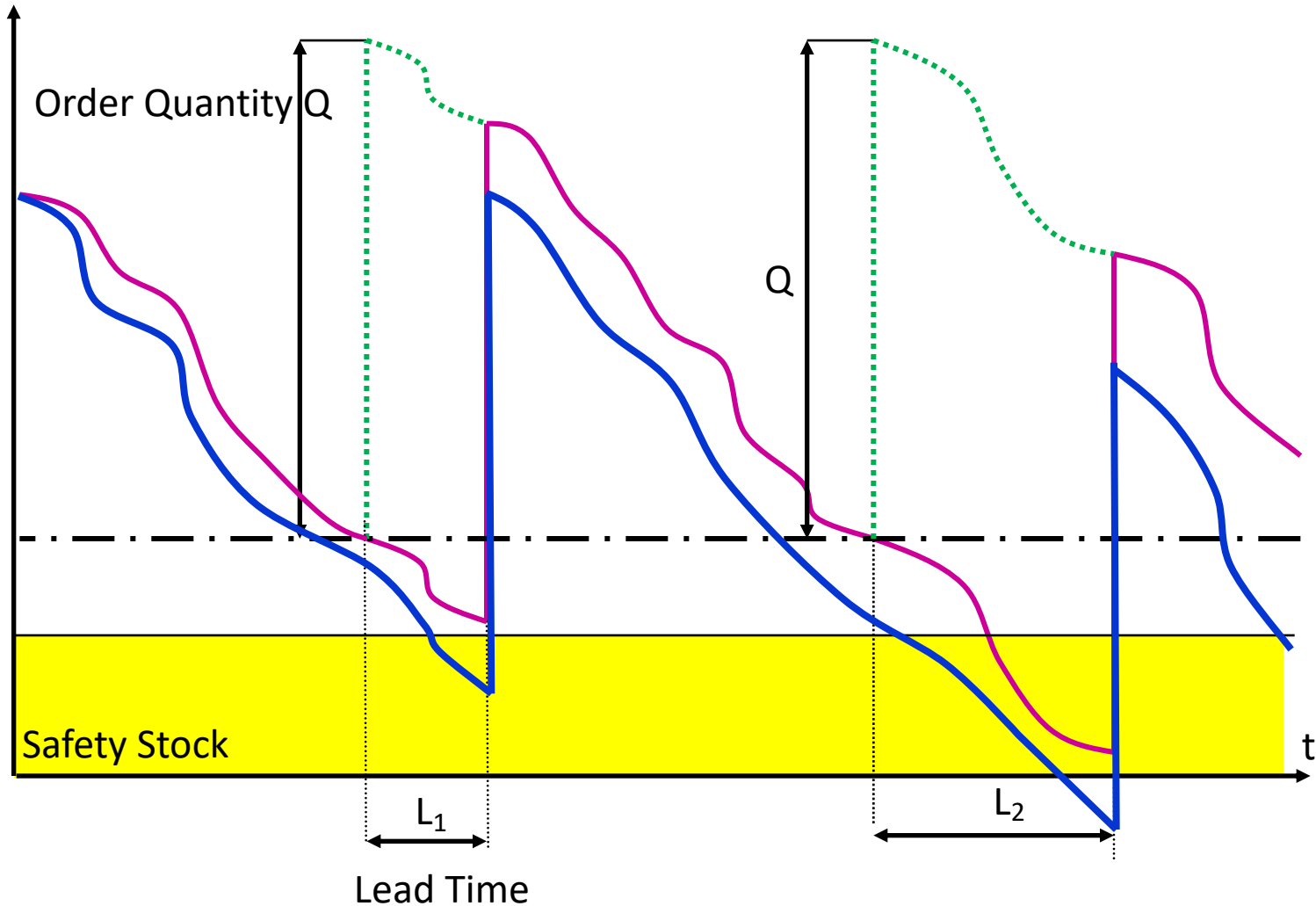
This is the **visible** stock behavior: POS (Real Demand) + Replenishment

Expected error free stock level



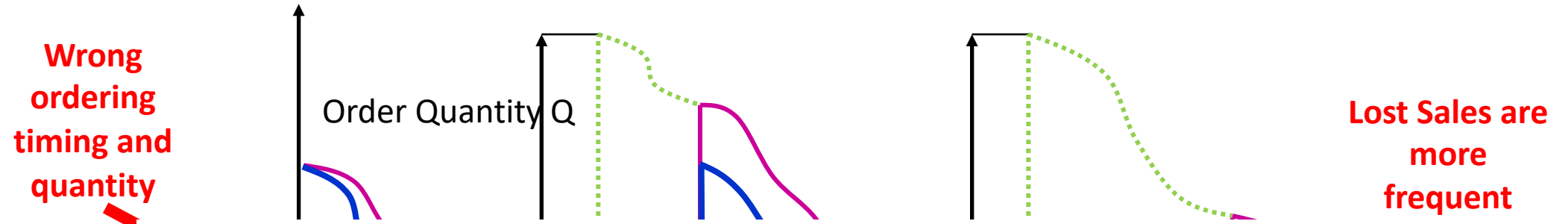
Actual stock level subject to errors

Reorder Point:  $r$



This is the **invisible** stock behavior: POS (Real Demand) + Replenishment + **Skrink (Ghost Demand)**

# Impact of errors on the $(r, Q)$ inventory policy



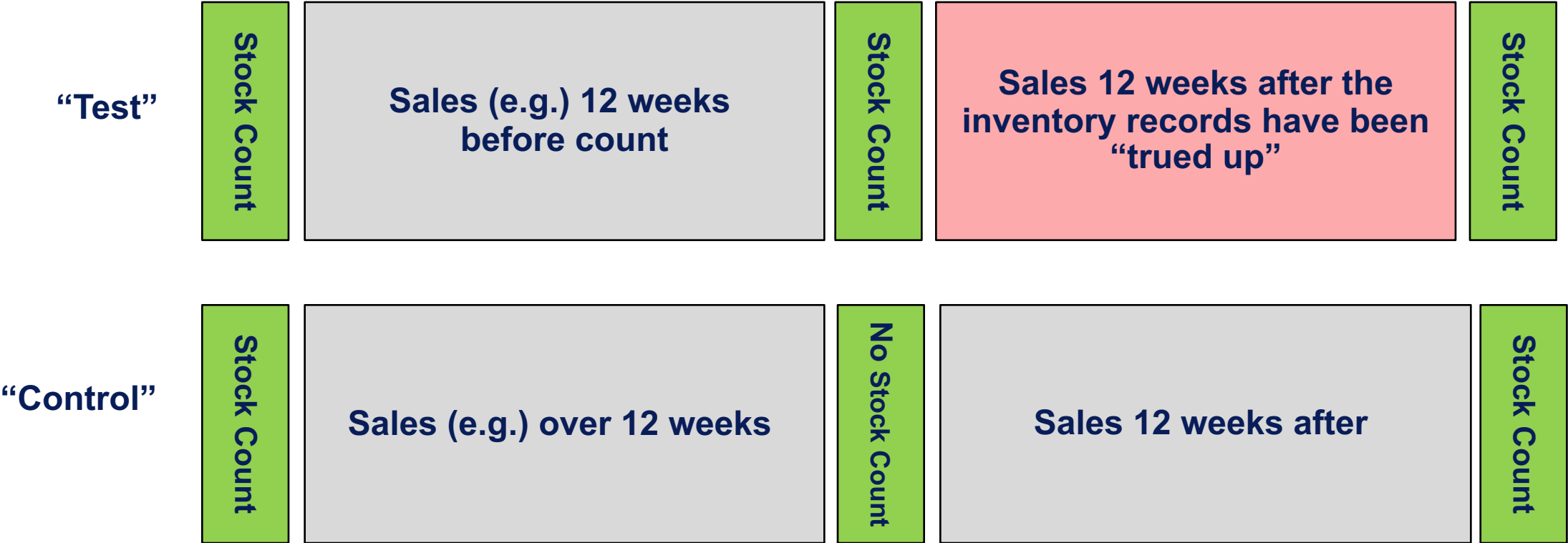
**Errors act as “ghost” demand decreasing the stock level without generating a revenue:**

**Inventory is controlled based on some visible wrong**

**information, whereas sales are satisfied based on some correct but invisible information**



# Experiment I: original / ideal experiment



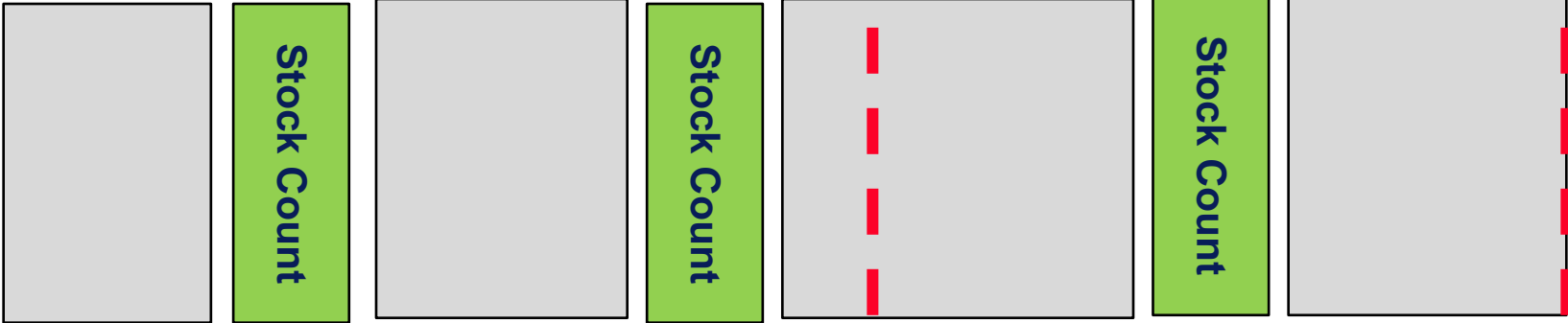
**Stock Counts in the beginning and at the end of the experiment in both Test and Control stores**



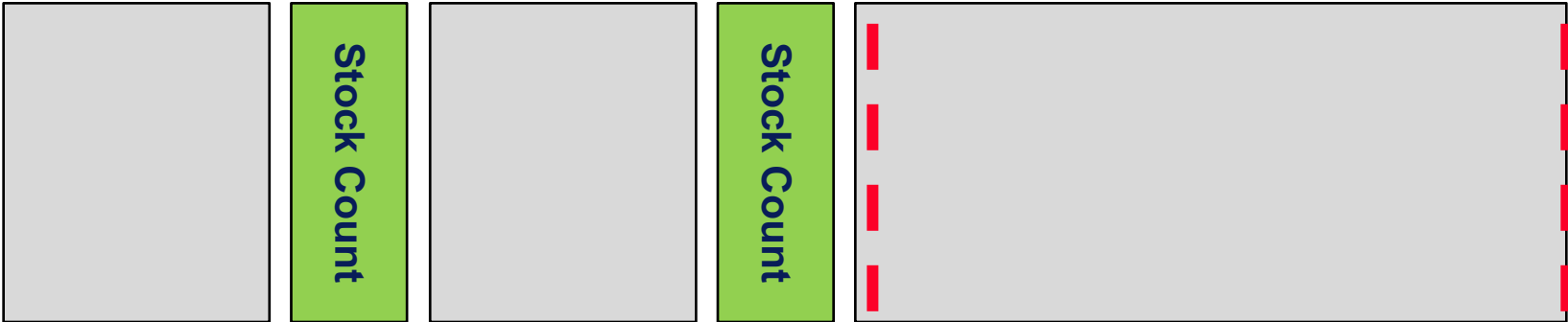
# Experiment II: retailers with frequent period

In addition,  
several cases of Experiment I  
can be deduced from  
Experiment II

“Test”

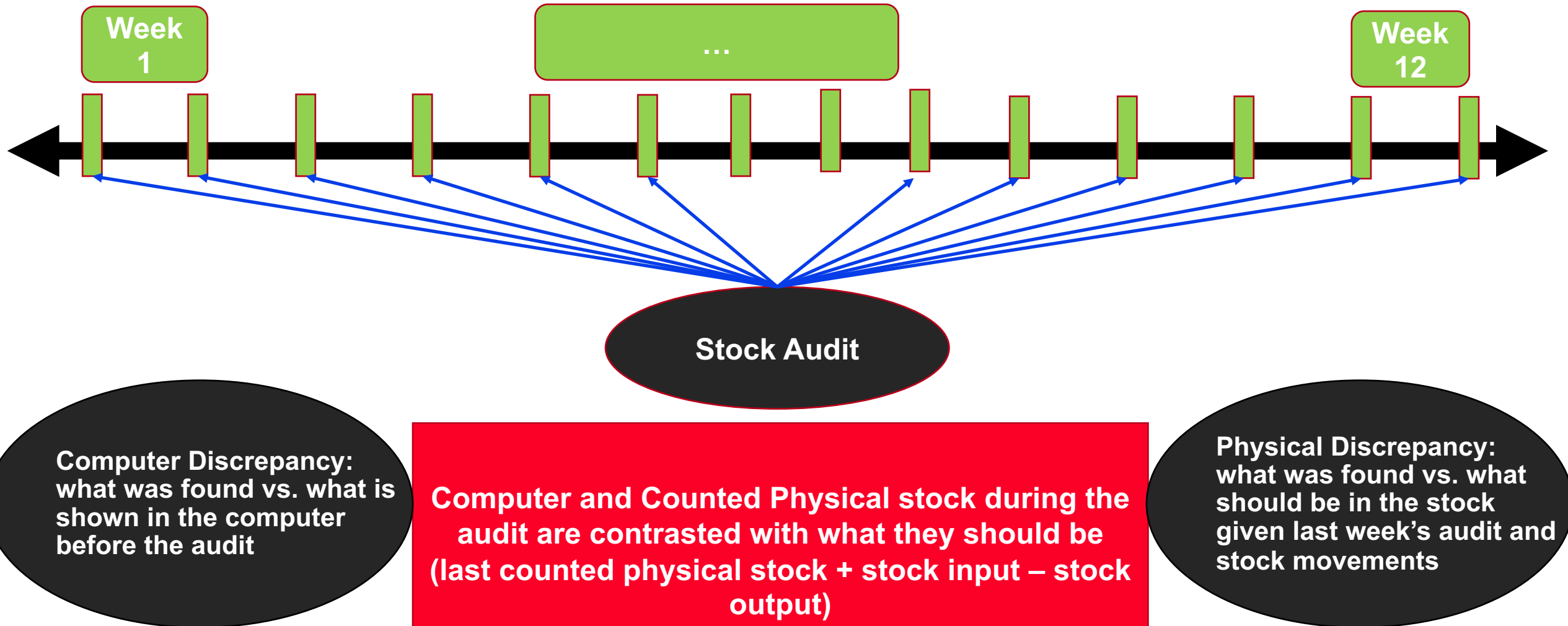


“Control”



A comparison of sales on a same period of time, with different stock audit tasks in Test and Control stores

# Experiment III: weekly stock audit



# Empirical analysis

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## ■ Currently working with 8 Retailers across Europe:

- NDAs have been signed and we are in various phases with regards to data transfer and analysis;
- 4 Grocery retailers (supermarkets), 2 Apparel retailers and 2 other;
- Customised reports to be produced for all participating retailers.

## ■ Initial results:

- 4 Grocery retailers (a, b, c and d)
- +600,000 SKUs
- 80 stores examined (40 test VS. 40 control)
- We are still working on the best possible way to present descriptive statistics without unintentionally disclosing individual retailer information (and identity)
- We present the (initial) results for the 4 Grocery retailers.

## **PART I: GENERAL INSIGHTS**

**(apply to all retailers)**

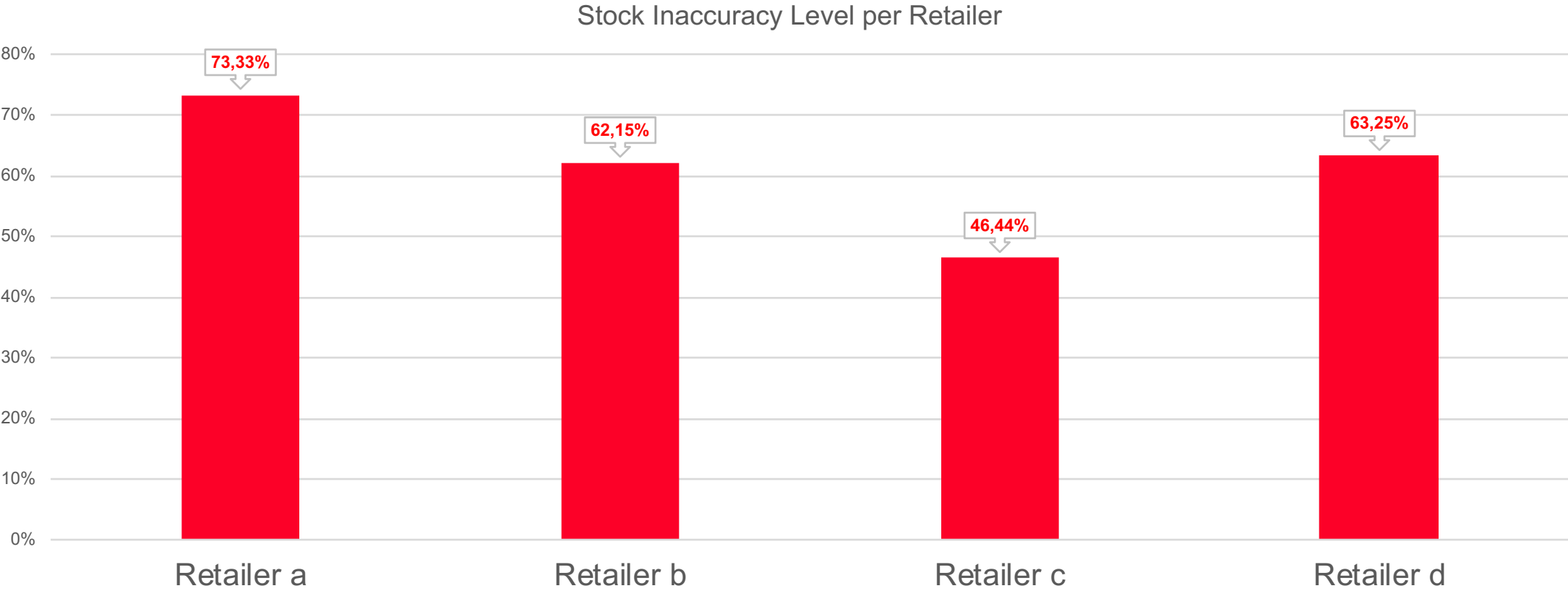
# Result 1

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**Independently of the experimental setting, inventory record inaccuracies are an important issue for all participating companies: across all grocery retailers, between 46% and 73% of the audited SKUs are subject to inaccuracies even if a stock take is performed very frequently (as in Experiment II, or even each week as in Experiment III)**

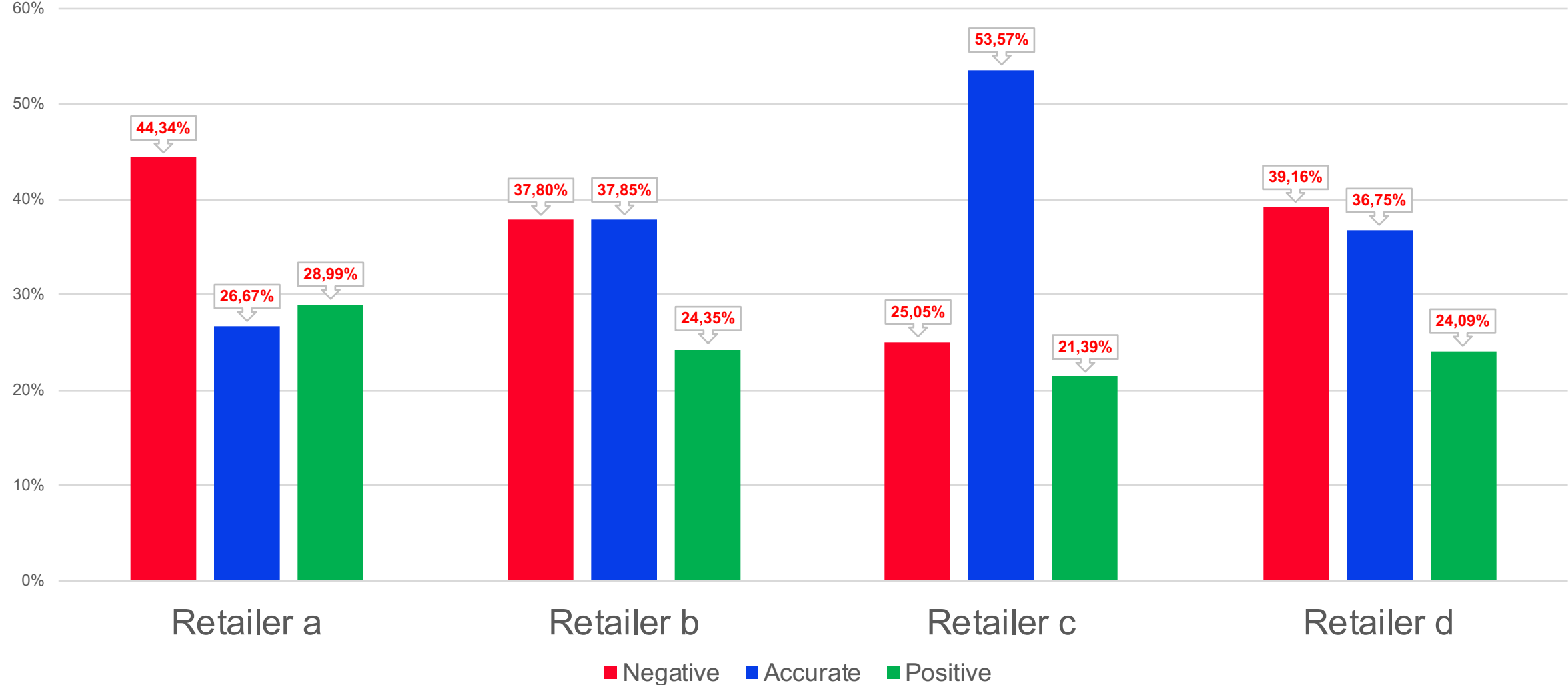
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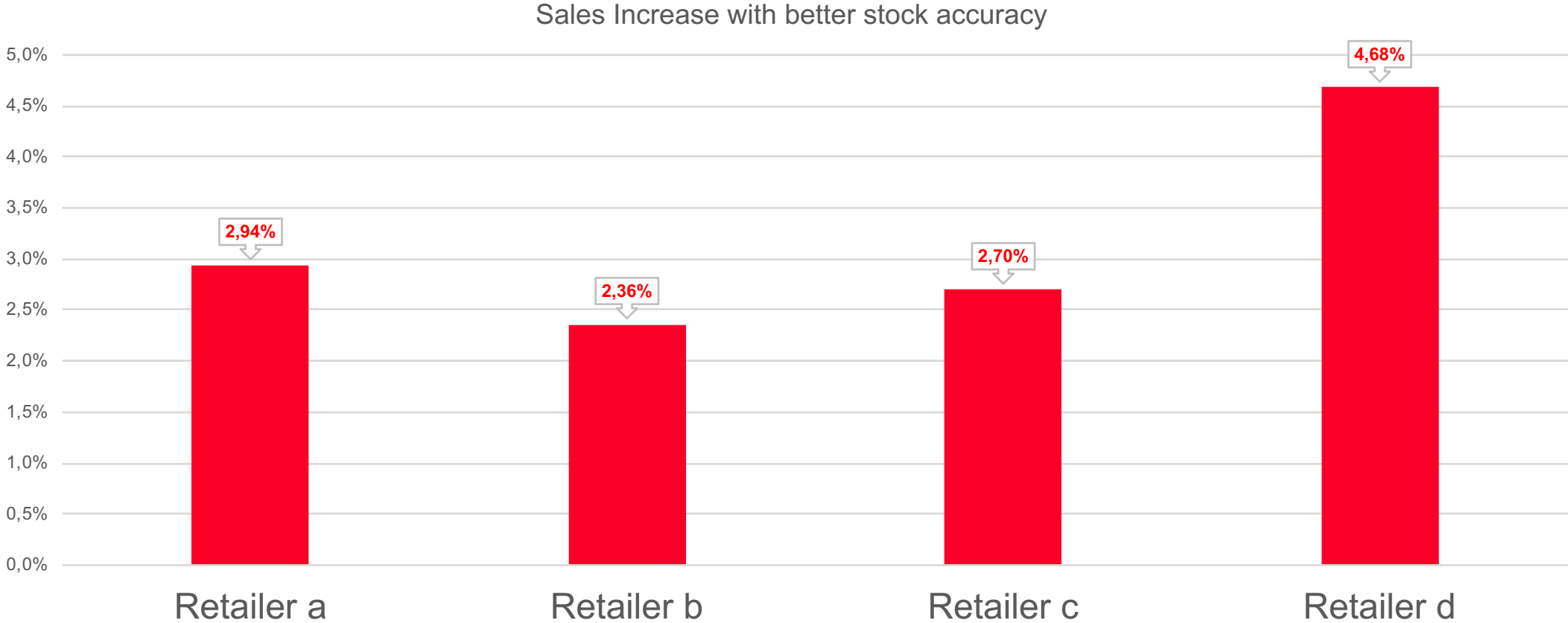
# Result 1: inventory record inaccuracies constitute an important issue

It is not only a matter of shrinkage: positive discrepancy is not negligible and generally is caused by Information System (IS) manipulations and errors



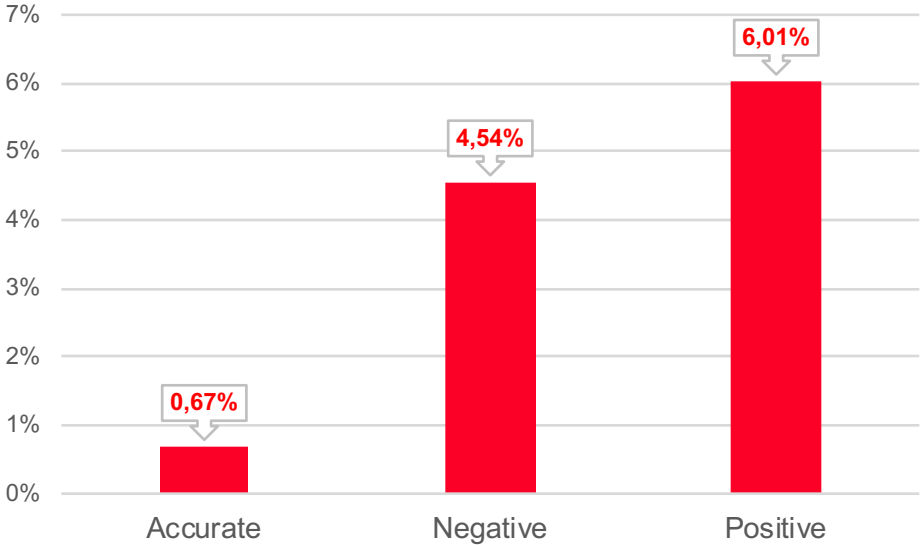
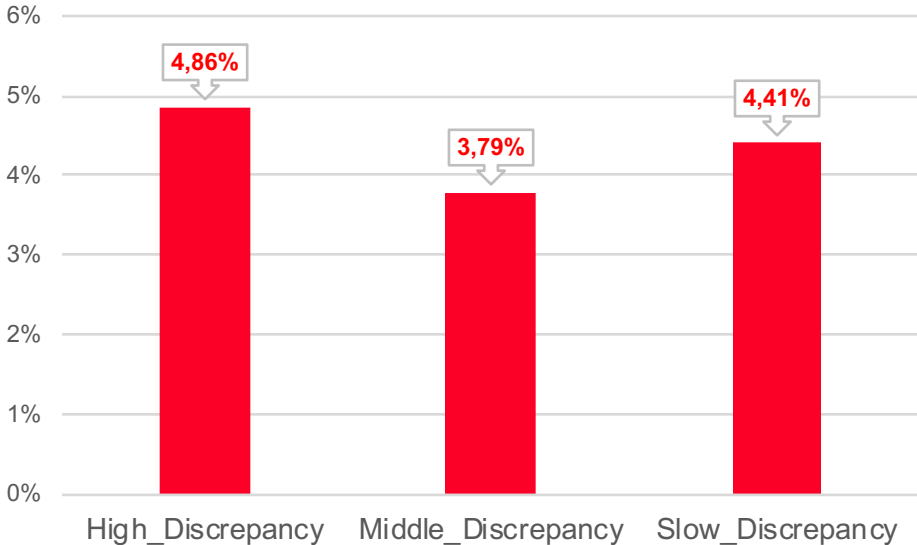
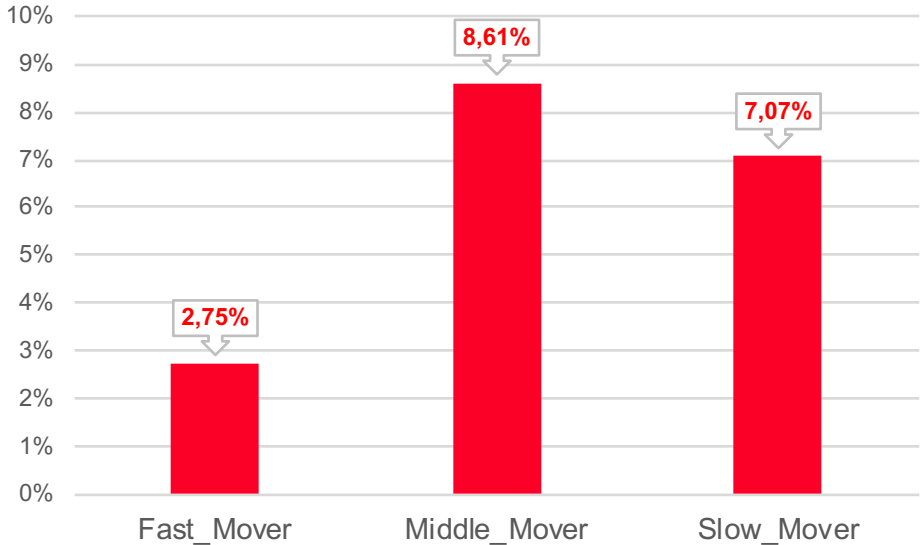
# Result 2

Inventory record accuracy leads to an increase in sales turnover between 2.36% and 4.68% at the retailers.

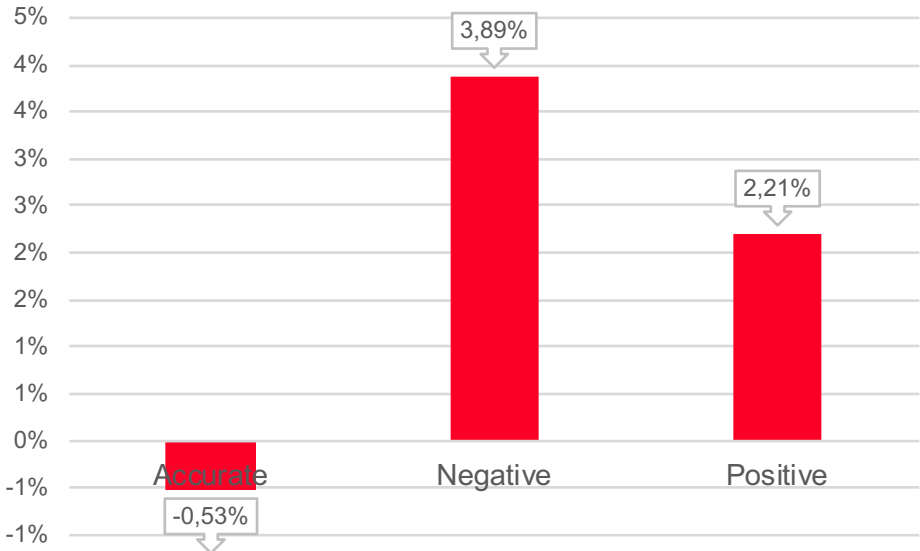
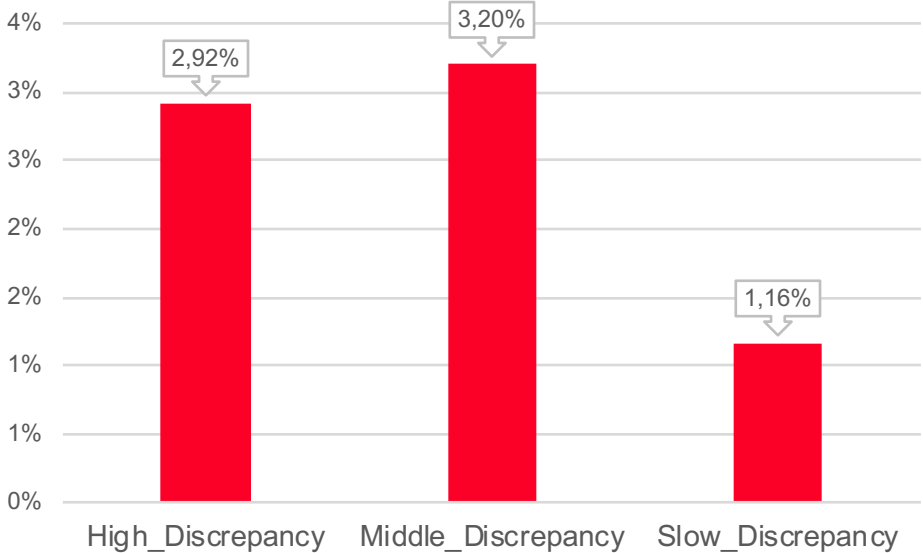
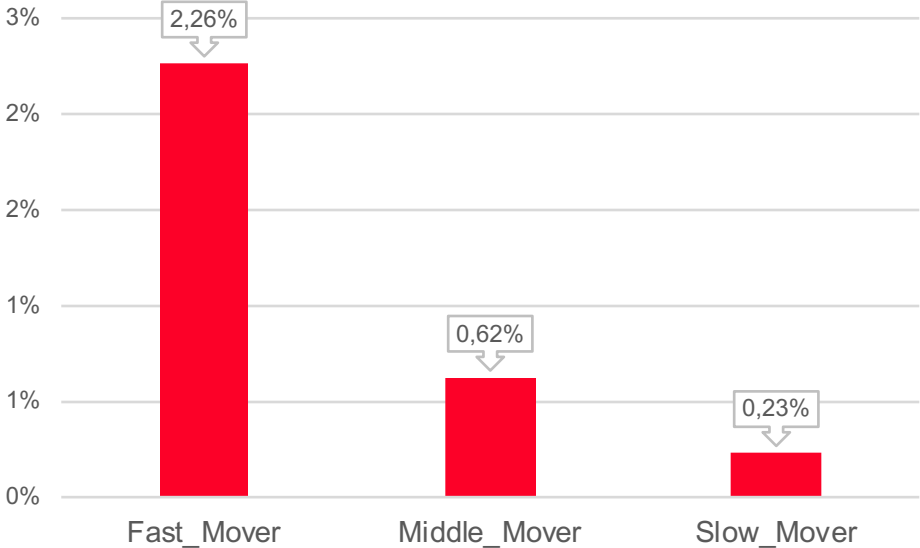




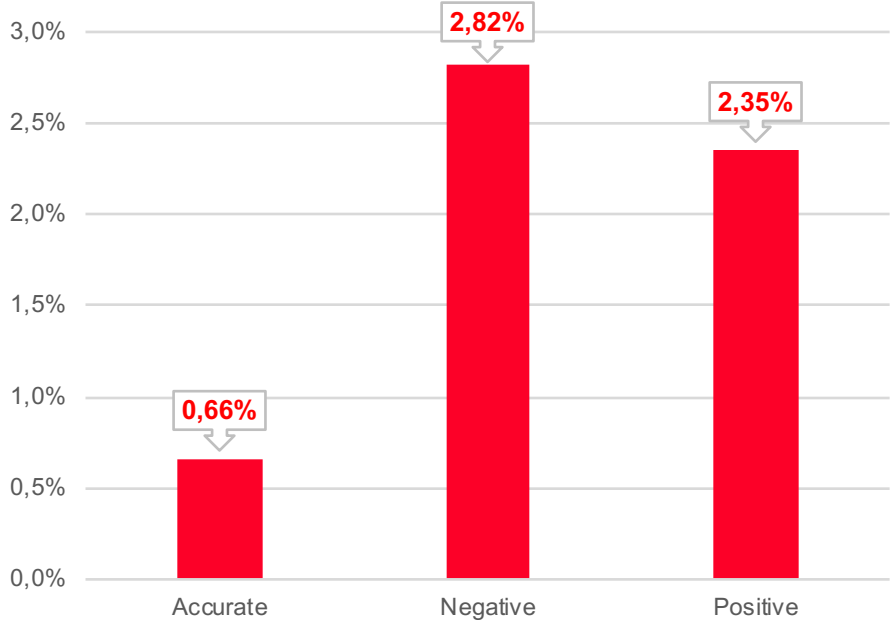
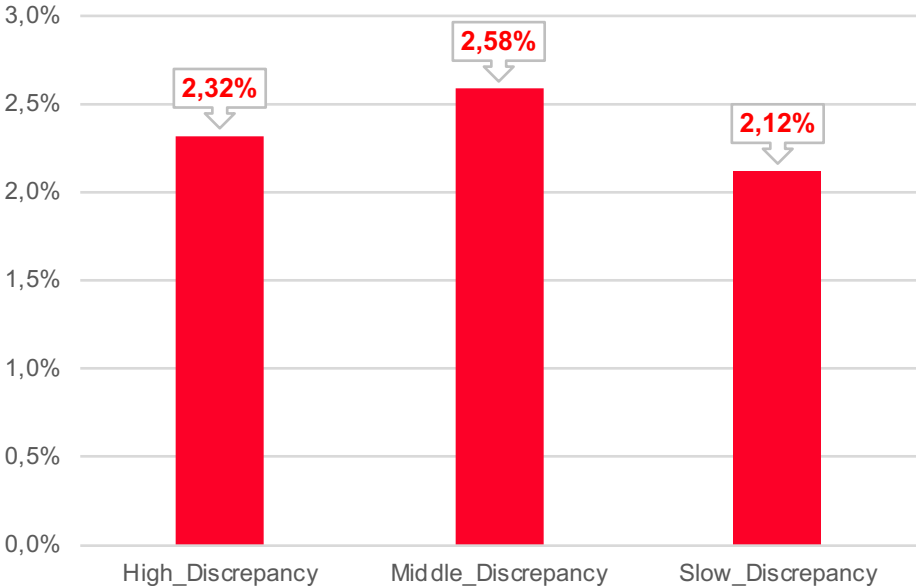
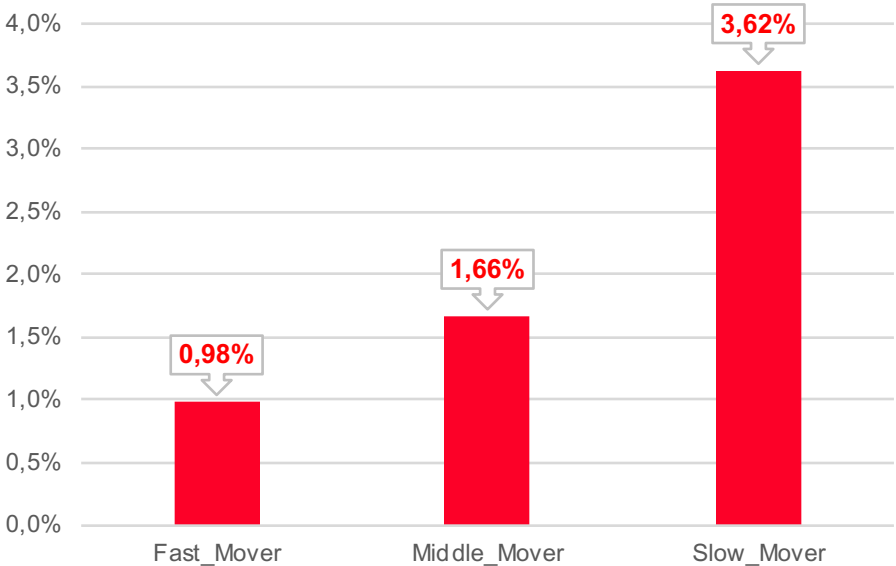
# Retailer a – sales increase of 2.94% in the Test stores comes from:



# Retailer b – sales increase of 2.36% in the Test stores comes from:



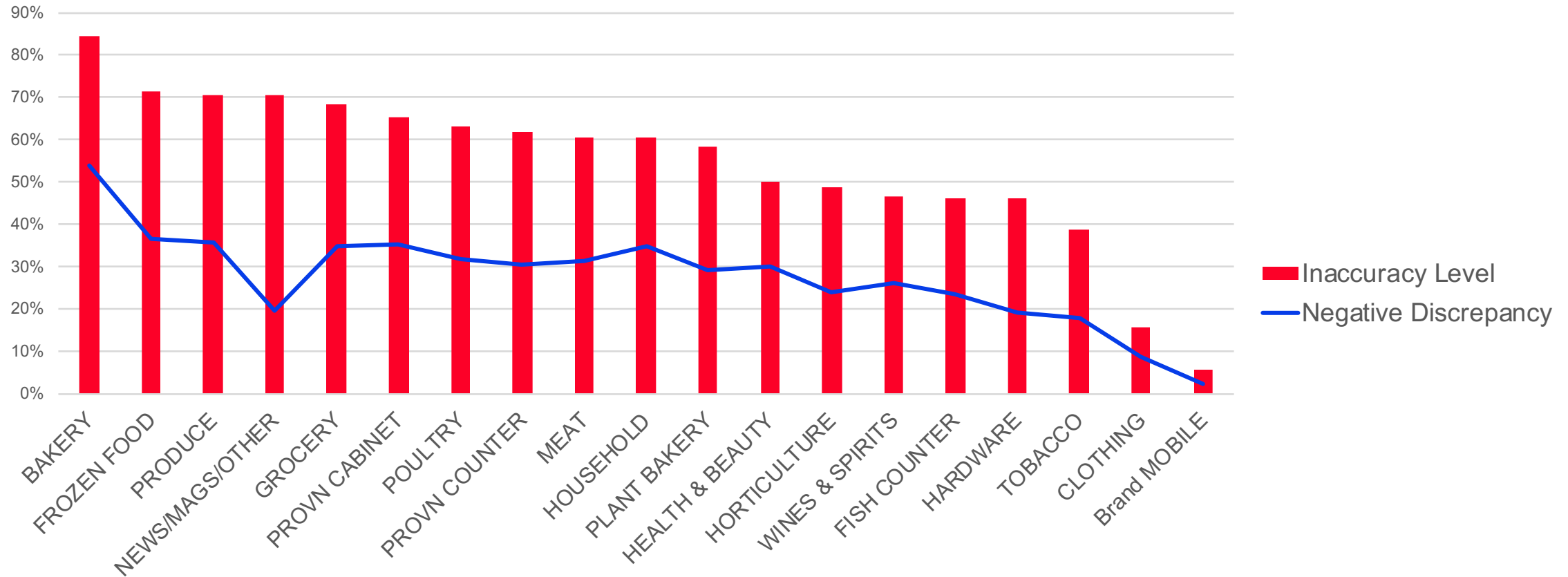
# Retailer c – sales increase of **2.70%** in the Test stores comes from:



# Retailer c: inaccuracy level per category

## ■ SKU Categories subject to both positive and negative discrepancies

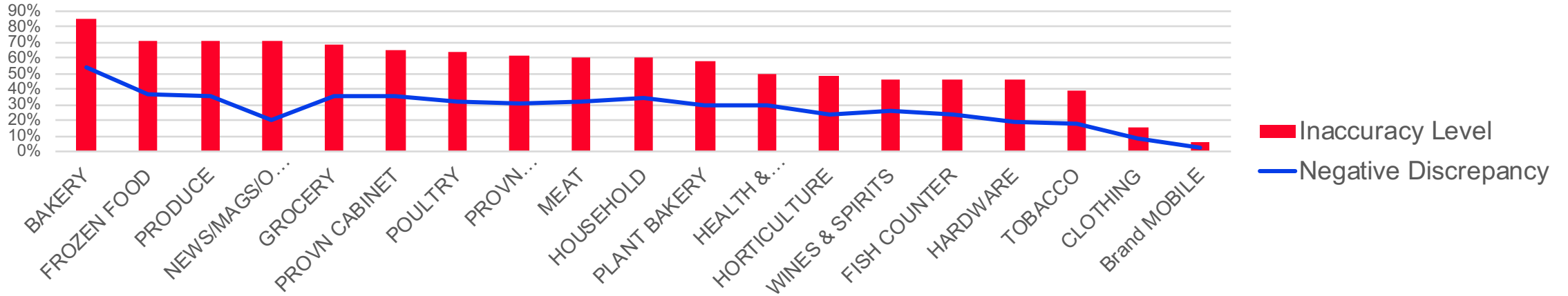
Inaccuracy Level per Category



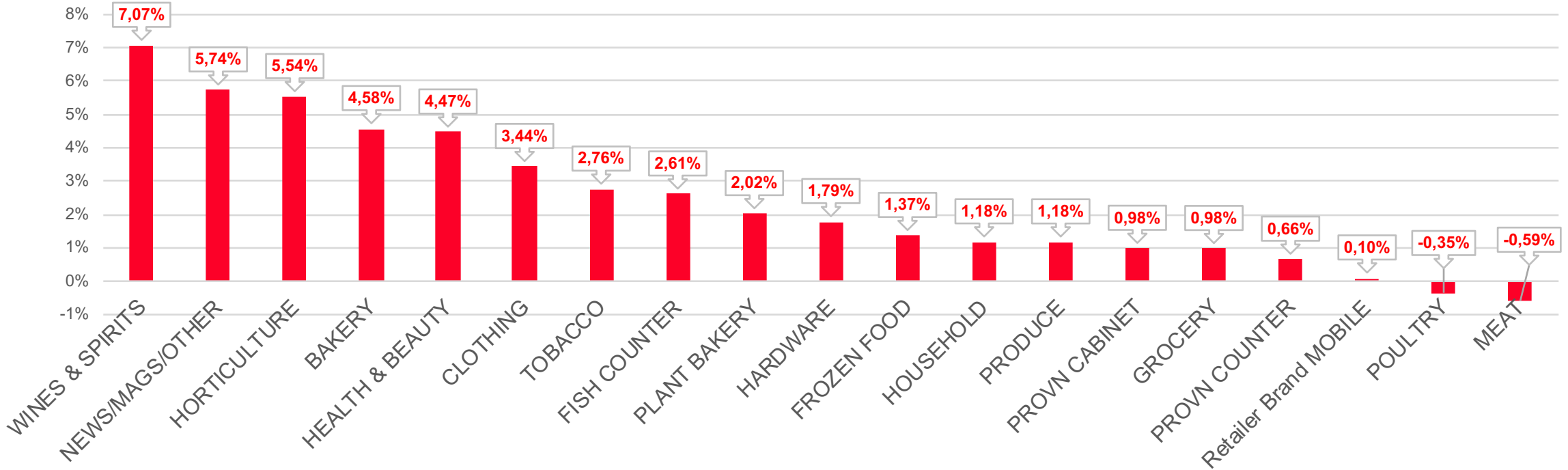
## ■ Can we infer that the sales increase offered by better stock accuracy is proportional to the inaccuracy level?

# Retailer c: sales increase per category

Inaccuracy Level per Category

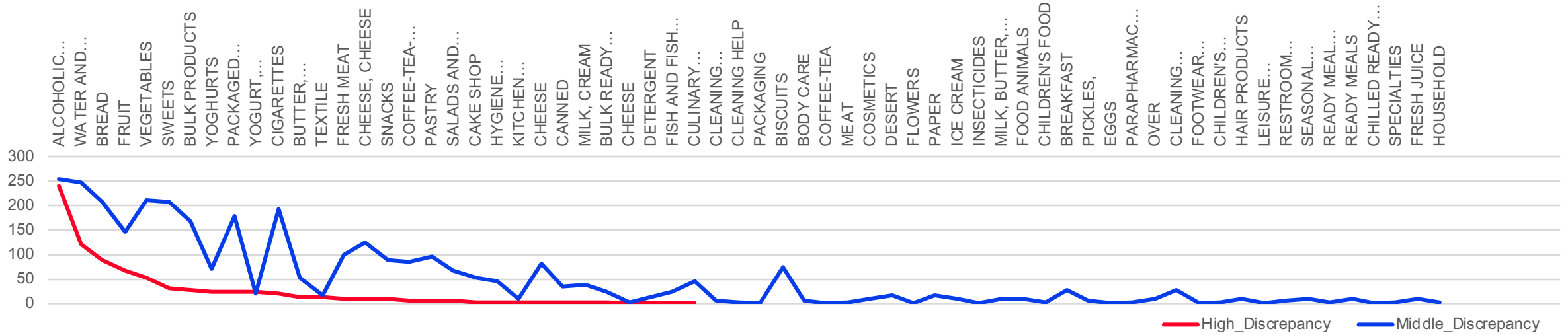


Sales increase per Category

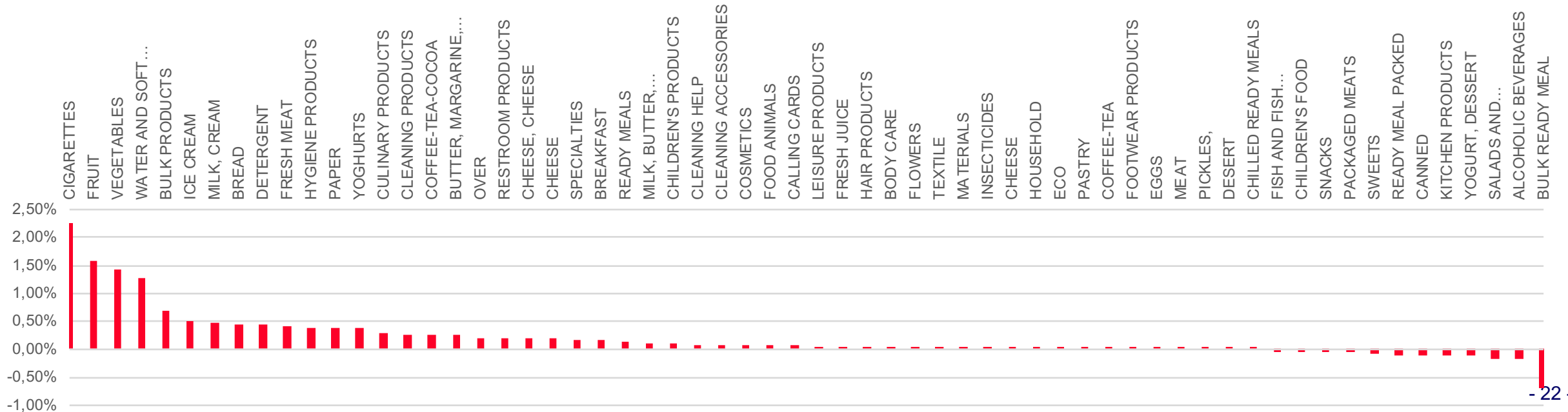


# Retailer a: sales increase per Category

Count of High and Middle Discrepancy SKUs per Category



Sales increase per category

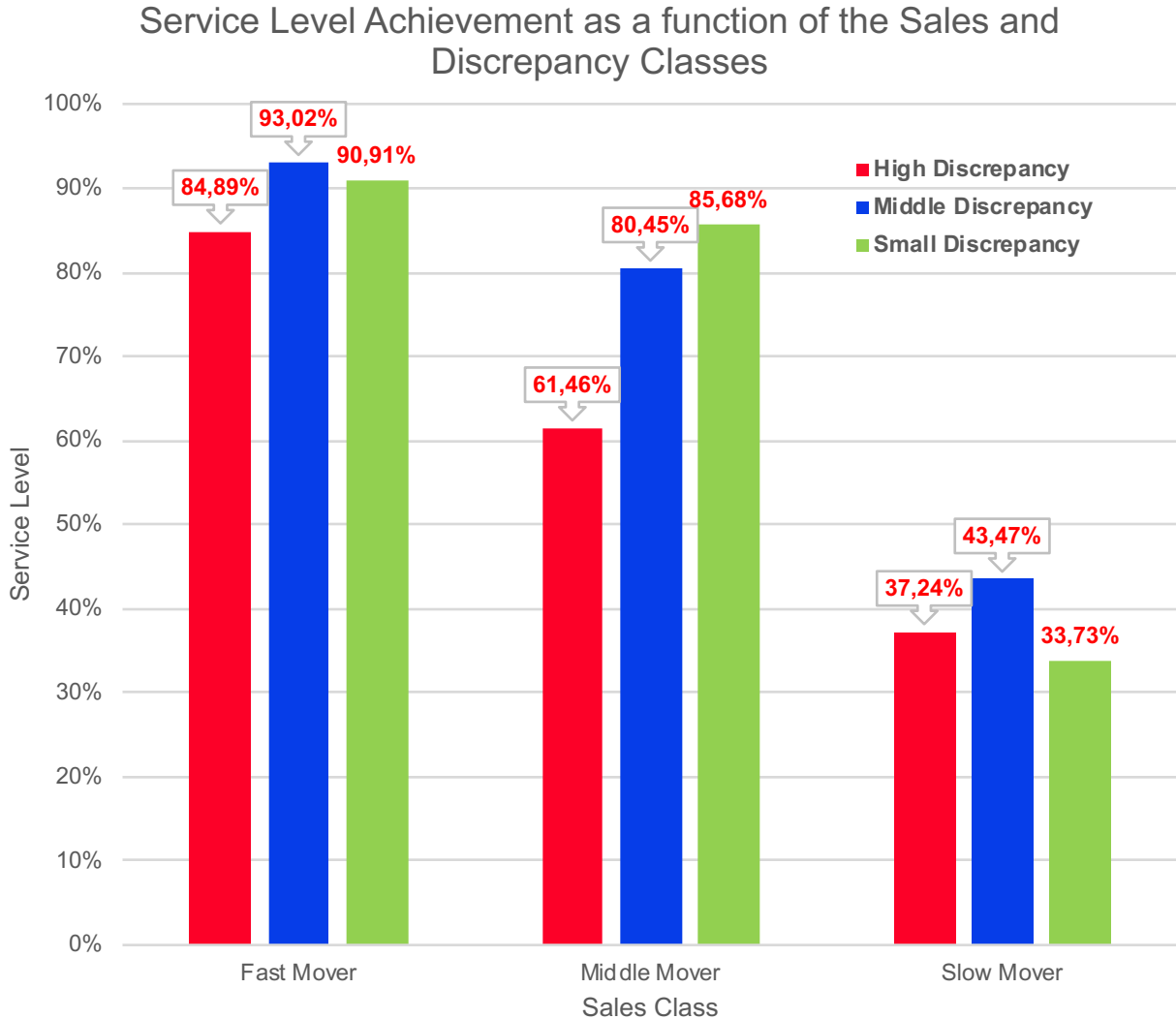
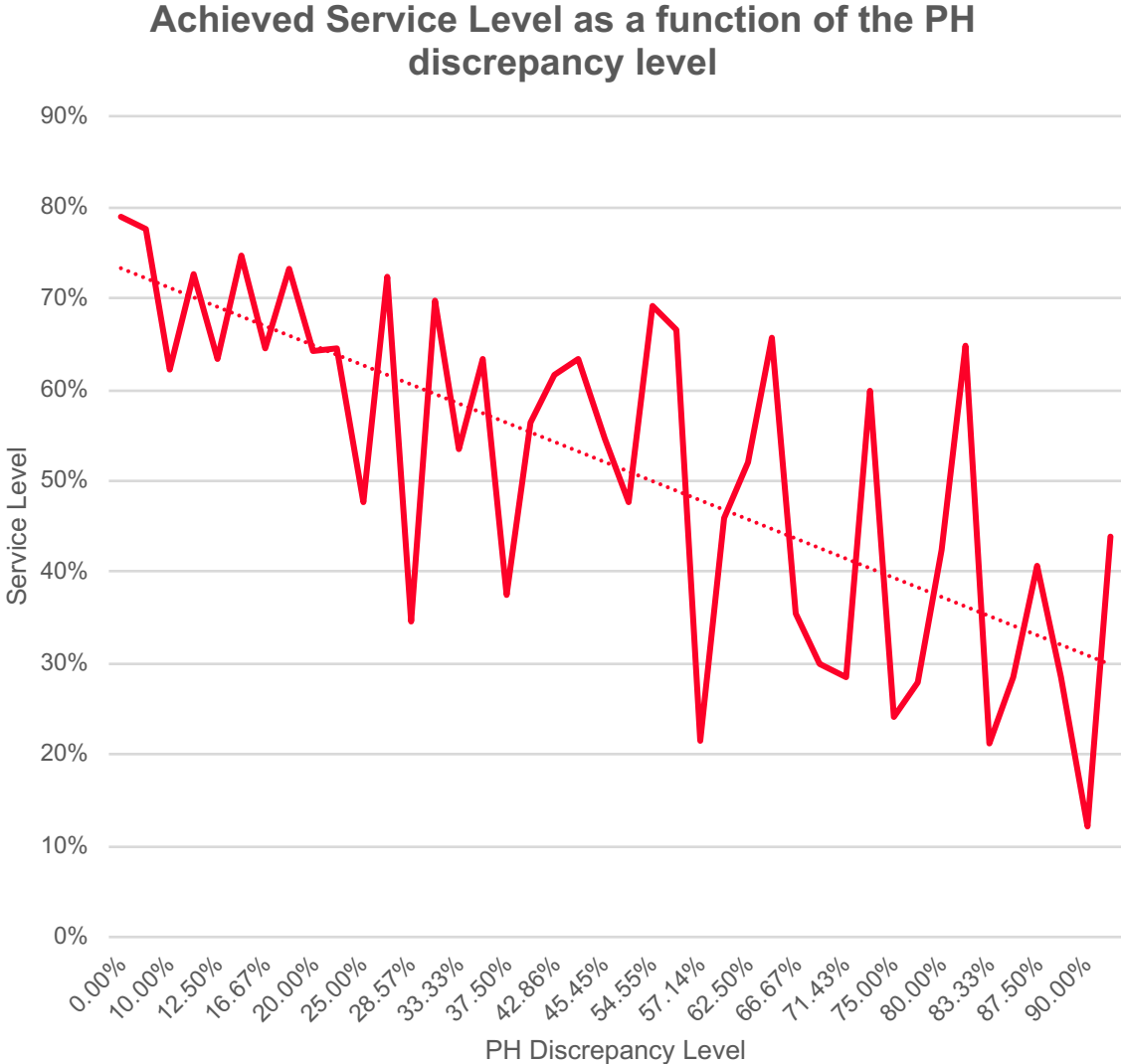


## **PART II: SPECIFIC INSIGHTS**

**(apply to some retailers)**

# Retailer d: service Level deterioration due to IRI

■ Service levels achievement is very sensitive to stock inaccuracies:





## **Retailer d: some SKUs end up as 'ghost SKUs'- no sales during several weeks**

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- **Some SKUs faced a situation during some weeks where the computer stock record was positive whereas the counted physical record showed a stock level equal to zero.**
- **With a positive computer stock level, the replenishment process does not trigger an order from suppliers leading to a physical stock level equal to zero in the forthcoming week and consequently leading to lost sales.**
- **Each week, approximately 10% of SKUs faced this situation and it could be verified that the EPOS for these SKUs is approximately equal to zero in the forthcoming week.**
- **6% of SKUs faced this situation each week and a big majority of them end up as 'ghost SKUs' without any EPOS signal during the 12 weeks experiment.**

## Next steps and opening up the discussion

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- Complete the analysis for the rest of retailers;
- Produce customized reports for each of the participating retailers;
- Synthesize the results in the form of a white paper to be hopefully useful for the retailing industry (and sectors within it).

### FOR DISCUSSION

- What are the implications of our findings for your organisation?
- How could you operationalise our insights?
- What would you like to see addressed in Phase 2 of the project?
- How do you envisage a benchmarking exercise in this area?

## APPENDIX