

The background features a large, glowing red sphere in the center, surrounded by a complex network of blue lines and dots, resembling a data network or neural network. The overall color palette is dark with red and blue highlights.

BE-terna Day 2021

Artificial Intelligence in everyday business

Božidara Cvetković, PhD

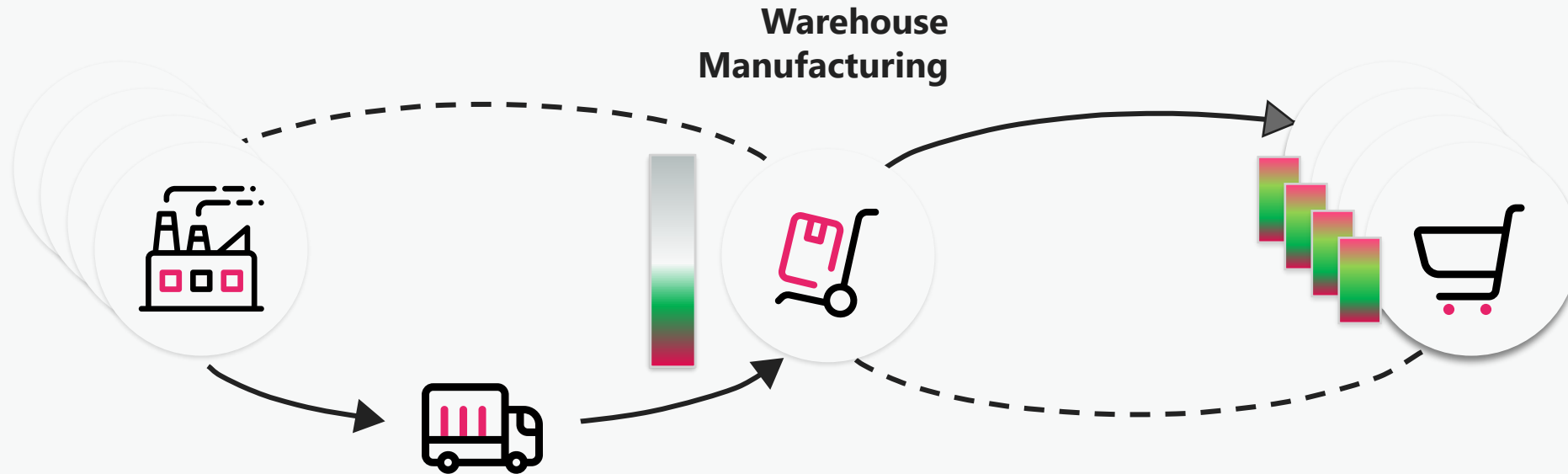
Agenda



1. Introduction – challenge
2. Fill purchase order
 1. Manually
 2. AI
3. Case Study - Salus
4. Benefits & Conclusion
5. Q&A

Introduction

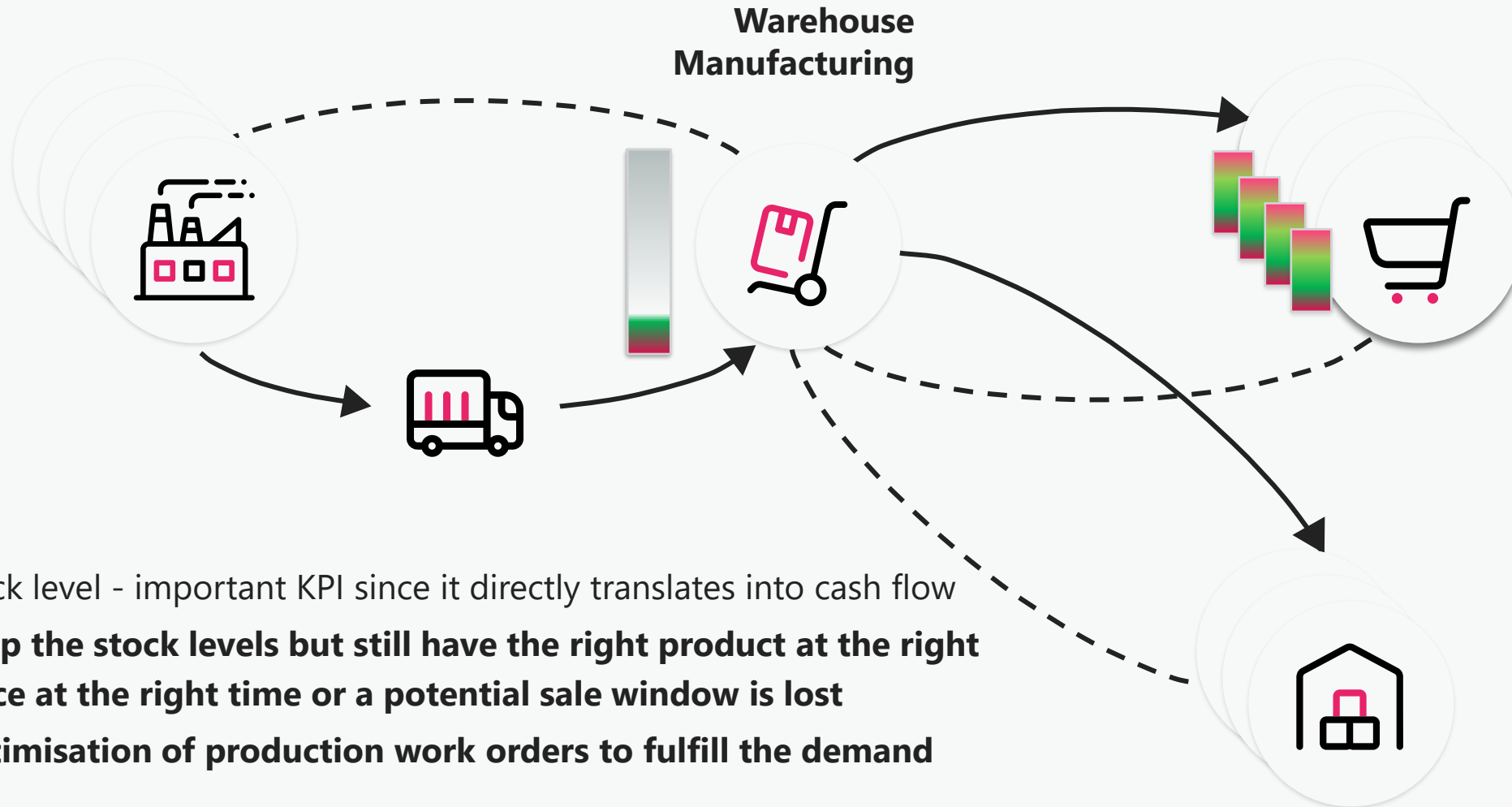
Challenge



- Stock level - important KPI since it directly translates into cash flow

Introduction

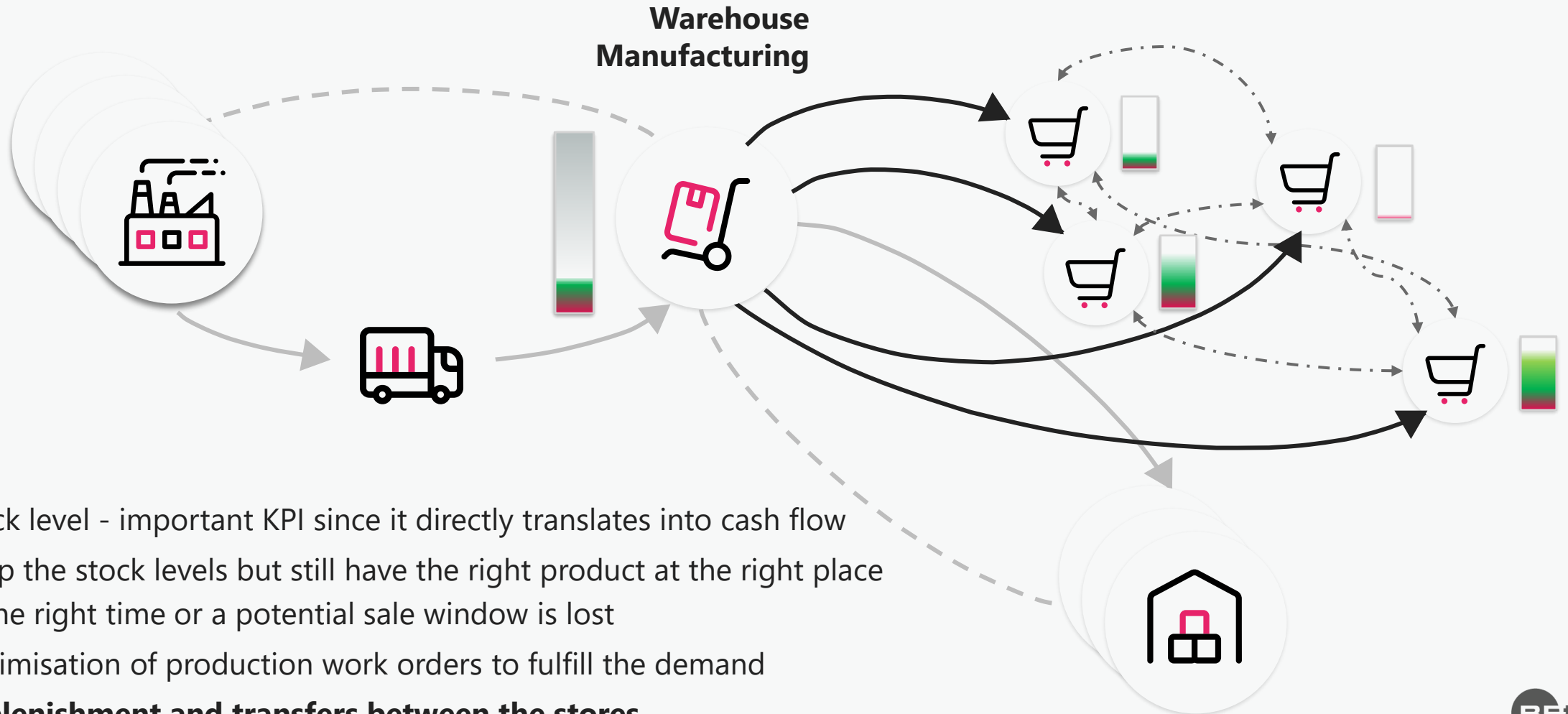
Challenge



- Stock level - important KPI since it directly translates into cash flow
- **Keep the stock levels but still have the right product at the right place at the right time or a potential sale window is lost**
- **Optimisation of production work orders to fulfill the demand**

Introduction

Challenge








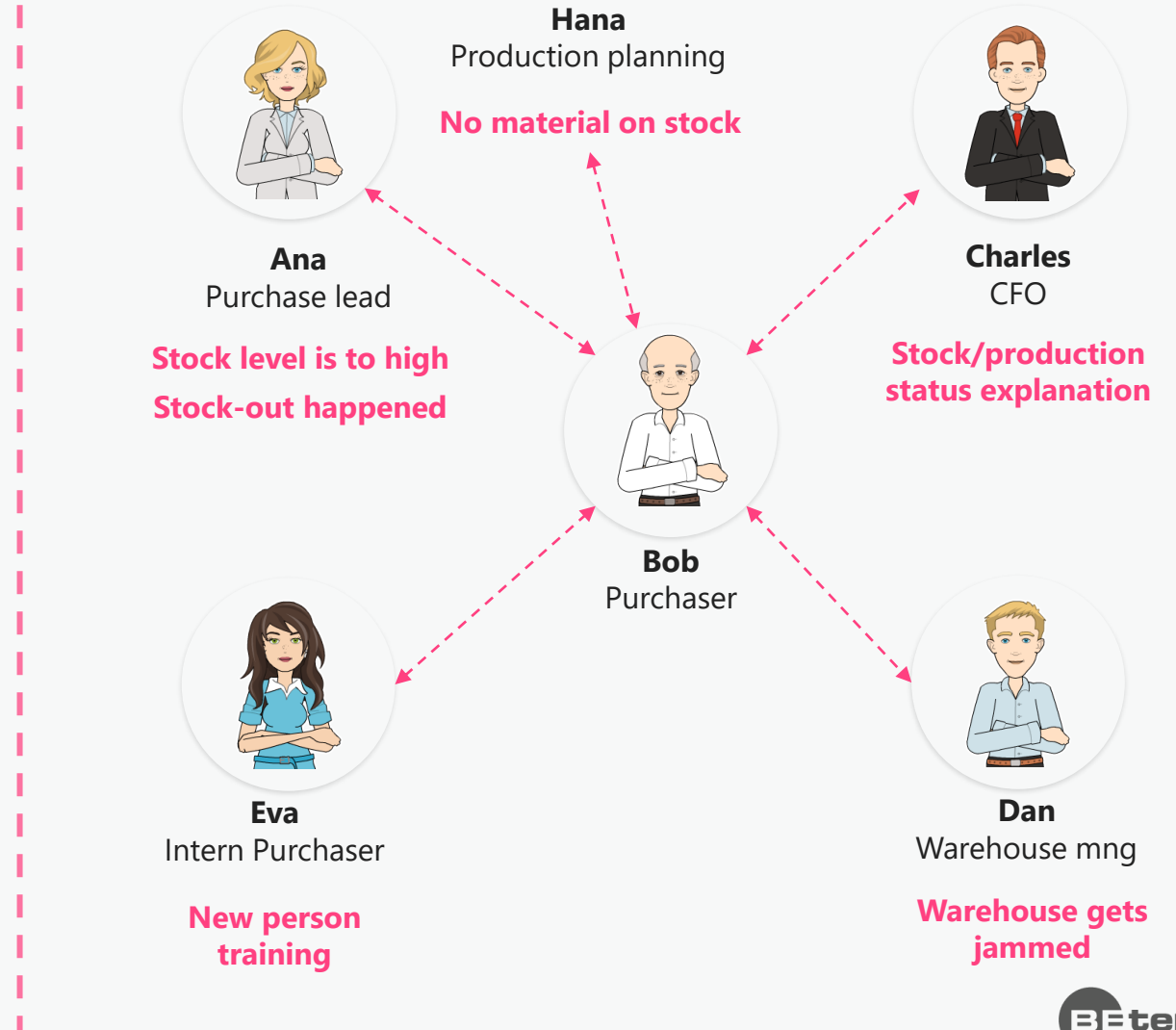
- Stock level - important KPI since it directly translates into cash flow
- Keep the stock levels but still have the right product at the right place at the right time or a potential sale window is lost
- Optimisation of production work orders to fulfill the demand
- **Replenishment and transfers between the stores**

Ordering procedure

Warehouse/Production - filling orders for ~600 items

For each item:






-  Analyze current stock
-  Analyze sales/production plan (weekly, monthly, seasonally)
-  Evaluate the date of the next purchase order
-  Set order quantity
-  Input order into the purchase form

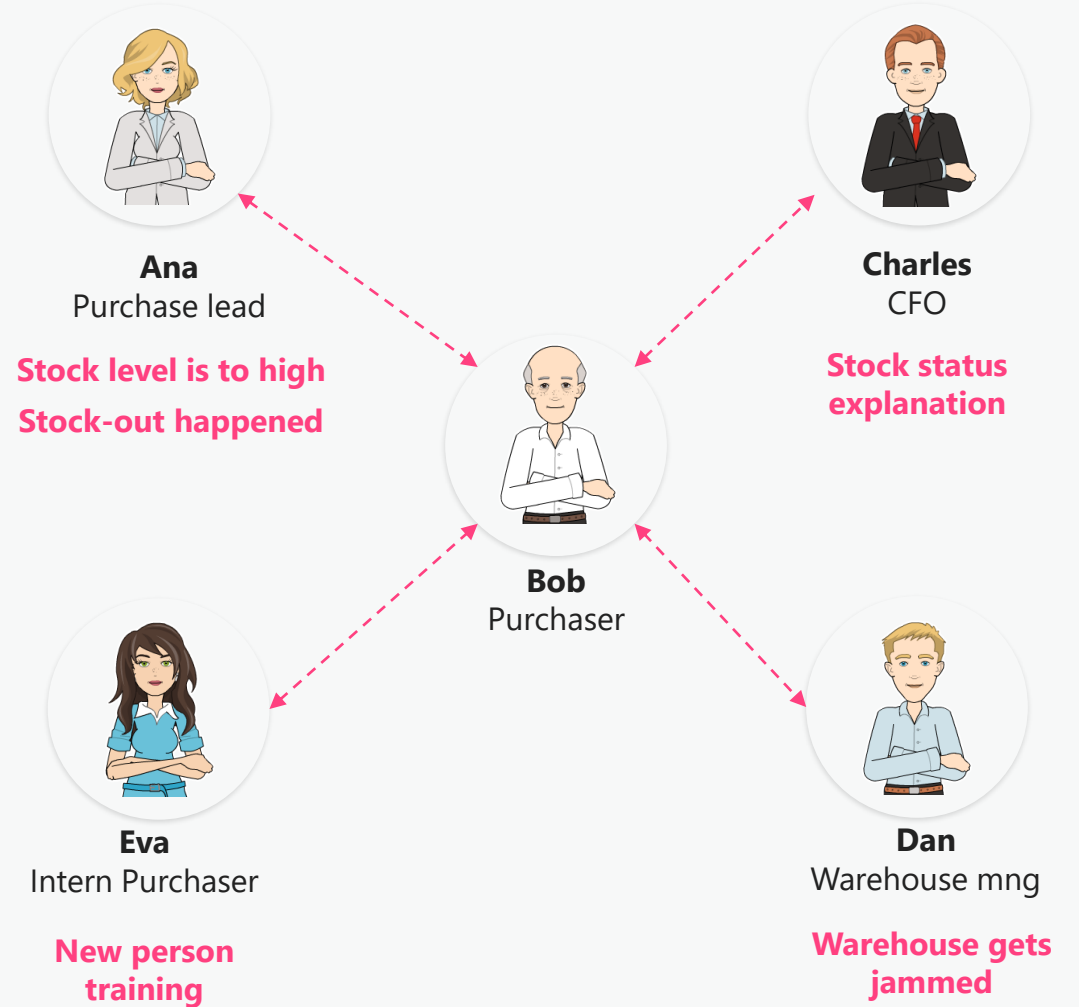


Ordering procedure

Retail store - filling orders for ~1 store (1k+ items)

For each item:

-  Analyze current stock
-  Analyze sales (weekly, monthly, seasonally)
-  Evaluate the date of the next purchase order
-  Set order quantity
 - + Check availability in the warehouse
 - Check for potential transfer
-  Input order into the purchase form



How can AI help Bob?

Stock optimisation with AI

Employ technology to crunch the data and return recommendations

- The steps Bob takes for generating a single order can be encoded into an algorithm
- Connect warehouse orders with retail store orders and introduce possibility of transfers
- Connect inventory and production plan

INPUT

CRM



ERP



BI



WEB

MOBILE



3rd PARTY
DATA



STOCK MONITOR

Detect & Quantify

- Alerts
- Overstock
- Stockouts

Decide on procedure

- Warehouse order
- Retail store replenishment
- Transfer procedure
- Planning optimisation

FORECAST & ORDER QUANTITY

Forecast sale per item

- Evaluate granularity
- ML model per type of item

Recommend order per procedure

- Evaluate forecast
- Quantify order
- Use constraints (item, vendor, ...)

PLANNING

Production optimisation

- Use recommended quantities
- Schedule work orders per production line
- Recommend material orders

TRANSFER OPTIMISATION

Stock availability

- Use stock availability
- Use locations/route

CARGO & LOGISTICS

Cargo optimisation

- Use logistic constraints (truck, container, volume ...)

OUTPUT

CRM



ERP



BI



WEB

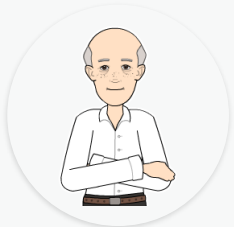
MOBILE



How can AI help Bob?

Stock optimisation with AI

- Bob is presented with results – **Purchase order**



Bob
Purchaser

← Requisition Worksheets | Work Date: 1/27/2022 ✓ Saved

Name

Manage Process Report Drop Shipment Special Order Line Item Availability by More options

Type	No.	Accept Action Message	Description	Location Code	Quantity	Unit of Measure Code	Direct Unit Cost	Due Date	Replenishment System
→ Item	70074	<input checked="" type="checkbox"/>	Coca-Cola	GREEN	120	PCS	0.664	1/28/2022	Purchase
Item	70075	<input checked="" type="checkbox"/>	Apple juice	GREEN	80	PCS	0.232	1/28/2022	Purchase
Item	70076	<input checked="" type="checkbox"/>	Banana juice	GREEN	60	PCS	0.232	1/28/2022	Purchase
Item	70077	<input checked="" type="checkbox"/>	Black coffe	GREEN	1,400	PCS	0.15	11/2/2020	Purchase
Item	70078	<input checked="" type="checkbox"/>	Tea	GREEN	800	PCS	0.13	1/28/2022	Purchase

Description Buy-from Vendor Name

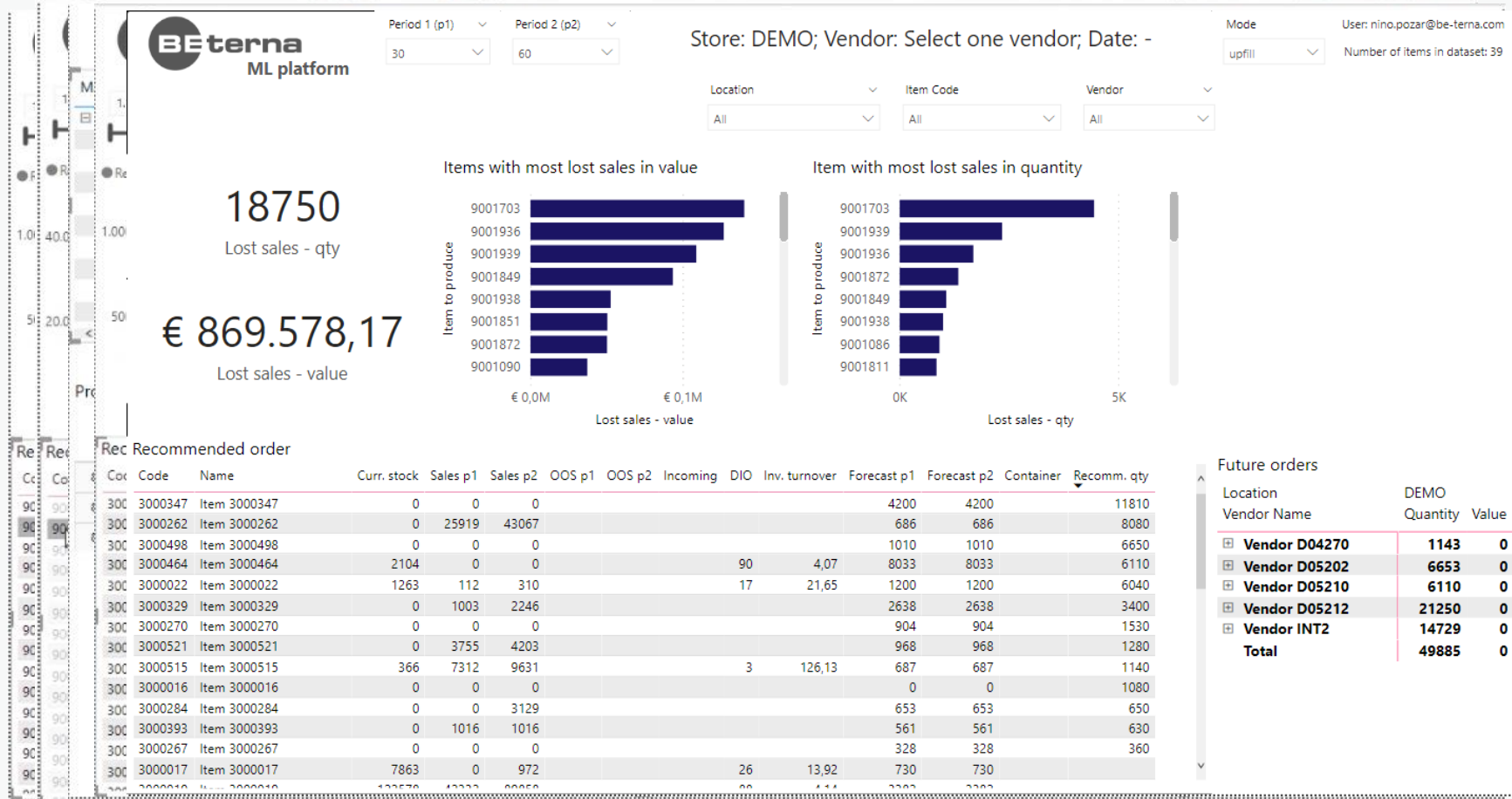
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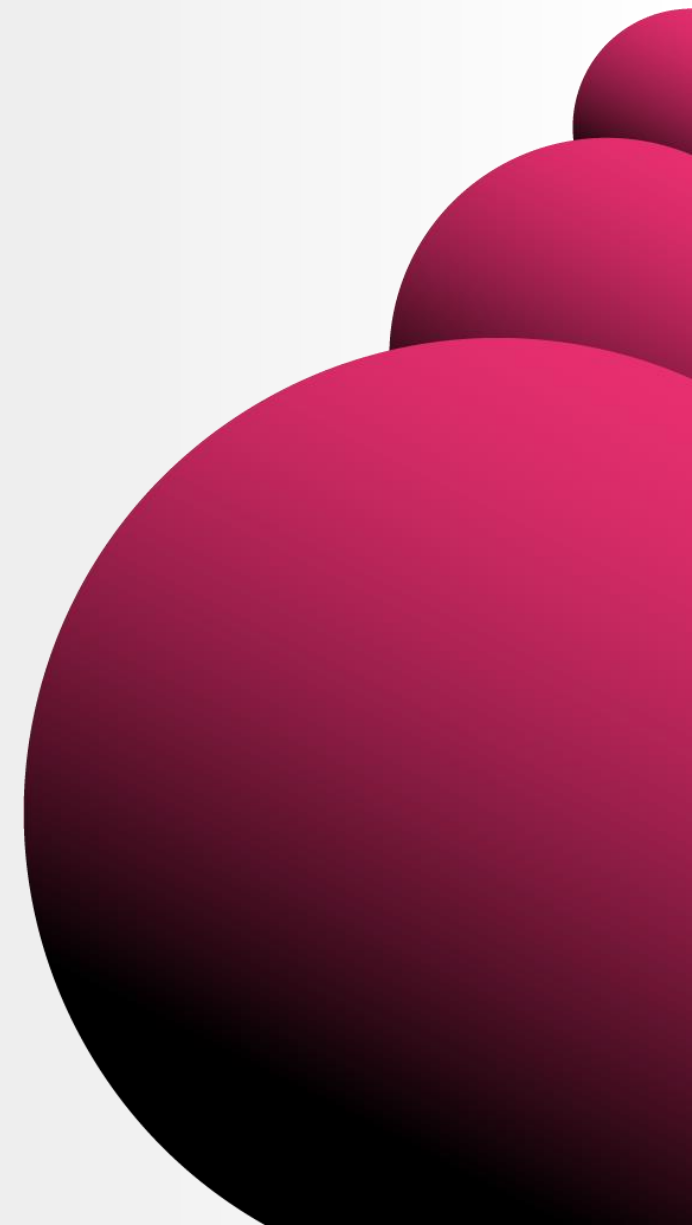


Bob
Purchaser





Case study



Salus Group

Status before implementation

- Pharma distribution centre
- SKUs
 - Daily sales/daily orders
 - Items with different sales characteristics
 - Seasonal, expiration date, promotinal...
- Order quantity is set by experience
- Balancing between high stock & stock outs
 - High orders out of fear
 - High stock level & dead stock



Salus Group

INPUT

CRM



ERP



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MOBILE



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MOBILE



Customer Journey (challenges)

Infrastructure

Where will it run

Data Quality

Integration

How do we know if we can trust the recommendations

The dashboard with explanation

Continuous evaluation & feedback

Comfortable in using the system

Monthly meetings

Upgrades & optimisation

Start using the recommendations

Recommendations are sent directly to ERP

Vendor & item specifics

Substitutes, promotional, expiration, tender items

Outliers, anomalies, ...

How it effects the stock value

Daily stock monitor

Order evaluation

Trend in stock level

Trend in stock outs

Trend in turnover

Salus Group – case study

>85%
Stock
Automatization

Up to 50%
Lowered manual
effort time

25% - 65%
Cash flow savings

SALES FORECASTING BRINGS THE FOLLOWING BENEFITS:

- Users can rely on the automatization of items that are being sold consistently with data models built on sales history, allowing for **high-precision** in processing short-term and long-term sales.
- Automatizing the vast majority (85% and more) of items, gave the purchasing department **enough time to focus** on slow-moving but high-value items and seasonal jumps, which bring a high risk of overstock and stock-out.

MAKE BETTER-INFORMED BUSINESS DECISIONS:

- Manual effort time was **lowered by up to 50%** for all team members, providing them with the opportunity to focus on non-standard, high-value items.
- **Support human decision-making** by using daily stock monitoring to spot outliers in sales and to react faster in potential stock-outs
- **ERP integration** allowed users to receive order proposals every morning and provided them with interpretability analysis in the self-service BI tool.

INVENTORY SAVINGS ARE JUST THE BEGINNING:

- **Cash flow savings** compared to the as-is scenario was 25% - 65%, depending on the item category.
- The Number of **stock-outs was minimized** and the algorithm calculated new minimum stocks which customers could supplement with some hard restrictions coming from vendors.
- **Stock coverage** in days was optimized without having an impact on the number of stock-outs.

Soft Benefits



Extra time can be spent on complex & new items & new vendors



Roll-out if new warehouses and retail stores are opened



Verification of orders through dashboard



Possibility of **controlling order frequency** per vendor

- Date of incoming trucks/containers
- Important items are in the first shipments (trucks/containers)
- Less jams in warehouses



Advantage in negotiations with vendor

Set suitable bonuses for customers / better promotional activities

Conclusion

Using technology as a tool for crunching large amounts of data **unlocks benefits:**

Automatisation of orders

Controlled and optimised stock

Increased service level

Optimised production

Timely detection of specific events

Controlled movement in the warehouse

... so, we are really **able to have:**



Right product



At right place



At right time

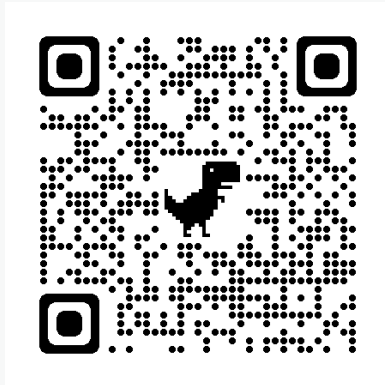
...across **different industries:**



Thank you!

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Lead Data Scientist



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