



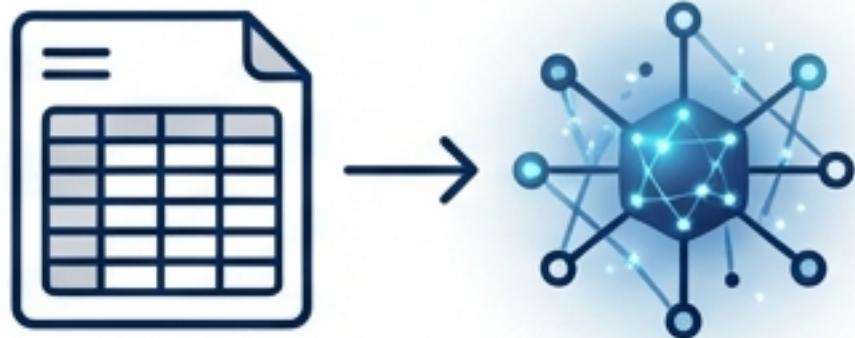
# Predictive OTIF Management: An AI-Driven Control Tower

Moving Supply Chains from Reactive  
'Firefighting' to Proactive 'Forecasting'



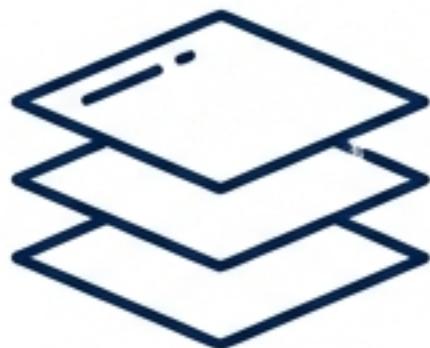
# Executive Summary: The Strategic Value of Intelligence

## The Shift



Moving from manual spreadsheet analysis to a unified Digital Twin.

## The Method



A composite 3-model approach (Transformers, XGBoost, Linear Programming) to predict and prevent failures.

## The Impact

**98%**

Target OTIF Score

**-20%**

Penalty Cost Reduction

# The Challenge: Hidden Upstream Killers

Delivery failures are rarely a last-mile problem; they are symptoms of upstream invisibility.



## Reactive Operations

Organizations operate in “firefighting mode,” discovering delivery failures only after the truck has arrived late.

**Result: High Penalties.**



## Inventory Imbalance

Stock sits in the wrong warehouses due to static, historical-average planning. Misalignment causes downstream stockouts.

**Result: Stockouts.**



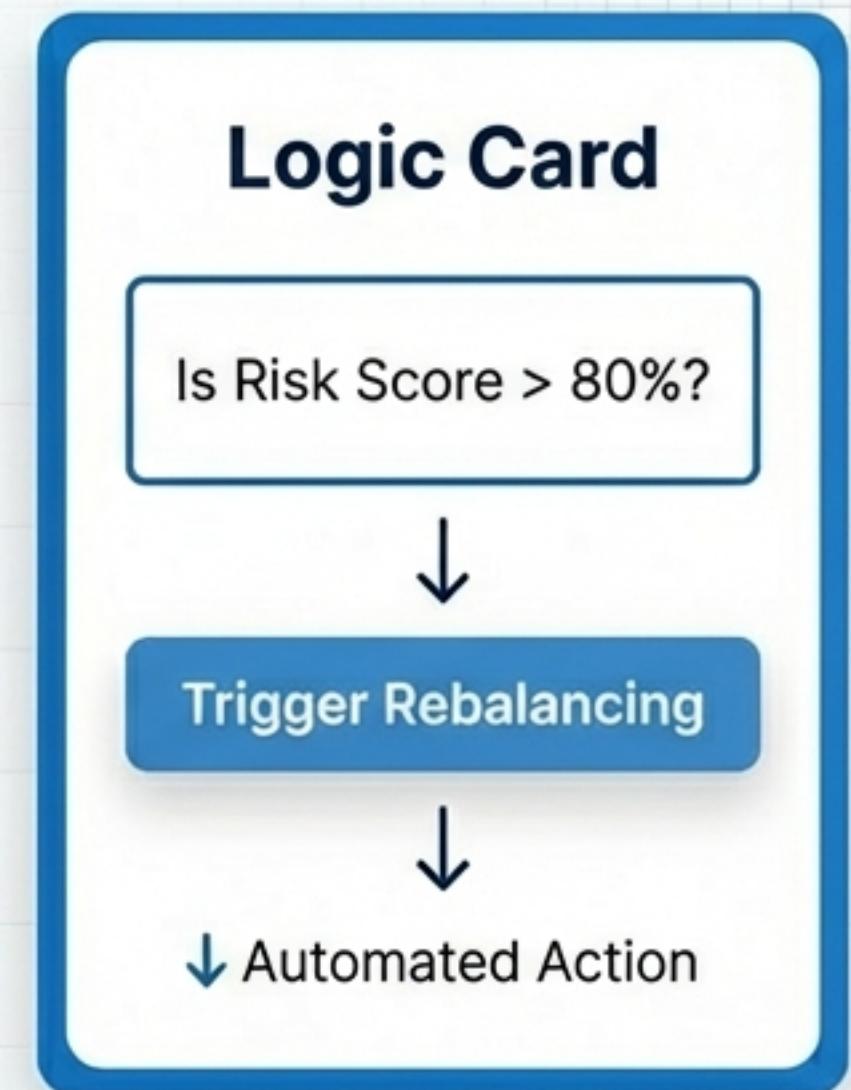
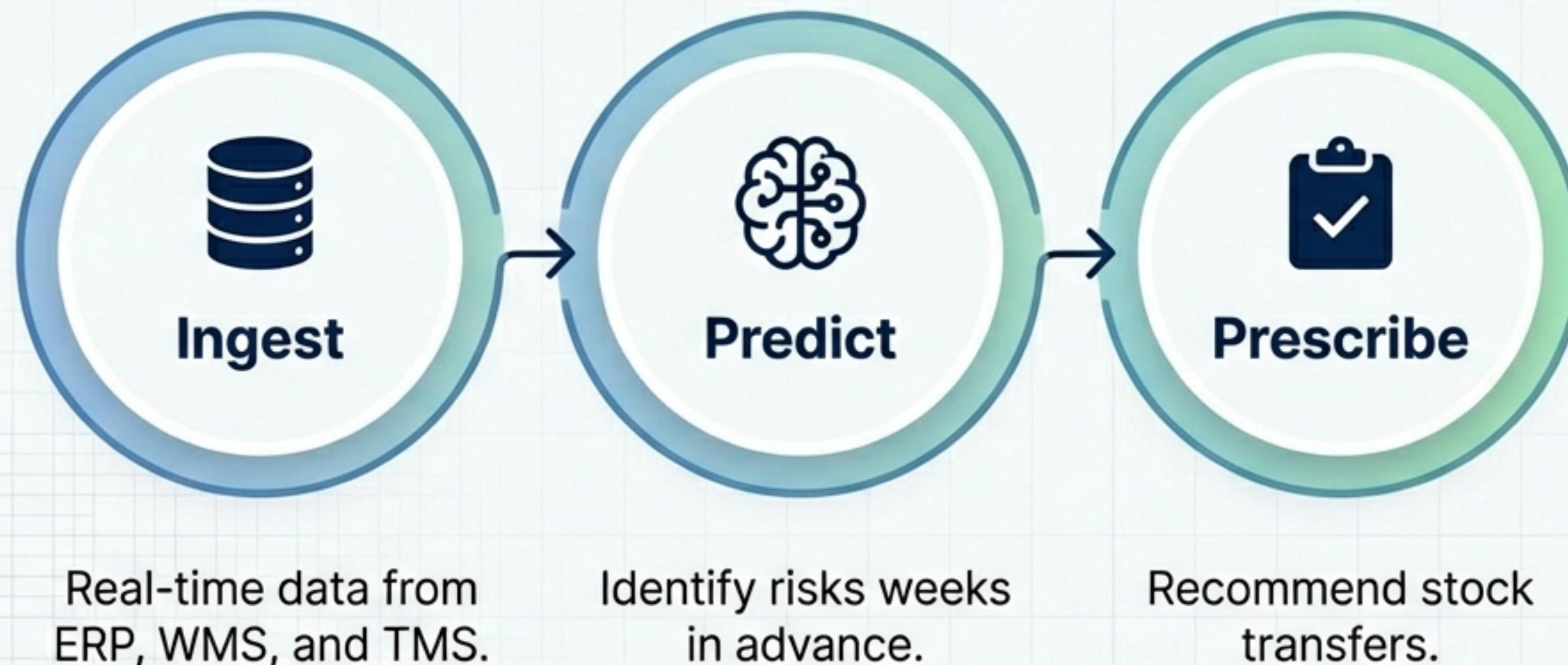
## OTIF Failure

# The Vision: Transforming the Operating Model

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Dimension	Current State (Reactive)	Future State (Predictive)
Planning	Monthly Static Plans	Real-time Dynamic Planning
Visibility	Siloed (Logistics vs. Warehouse)	Unified “Digital Twin” Network
Trigger	Customer Complaint	AI Risk Alert (>80% Probability)
Resolution	Manual Firefighting	Automated Rebalancing

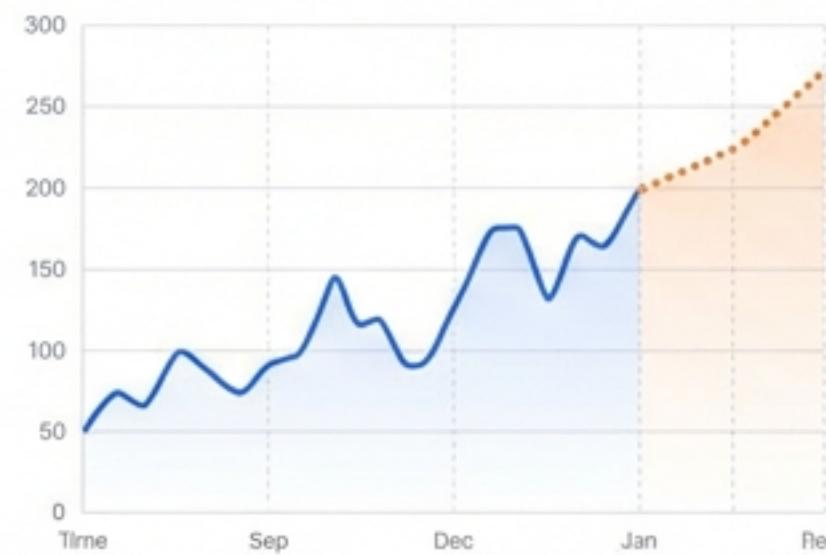
# The Solution: AI-Driven Control Tower



# The Engine: A Composite 3-Model Approach

## Demand Forecasting

Transformers



Predicts granular SKU-level demand per location.

## Risk Classifier

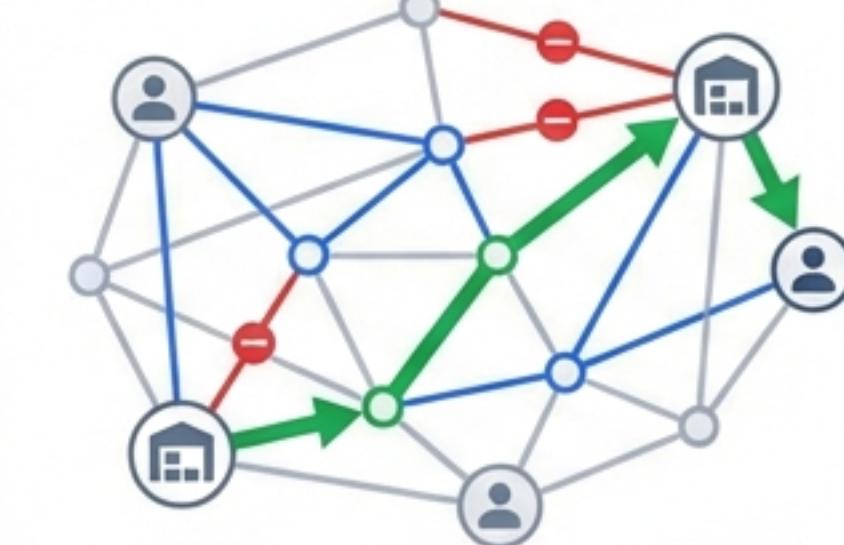
XGBoost / Random Forest



Assigns "Failure Probability Score" to every open order.

## Network Solver

Linear Programming

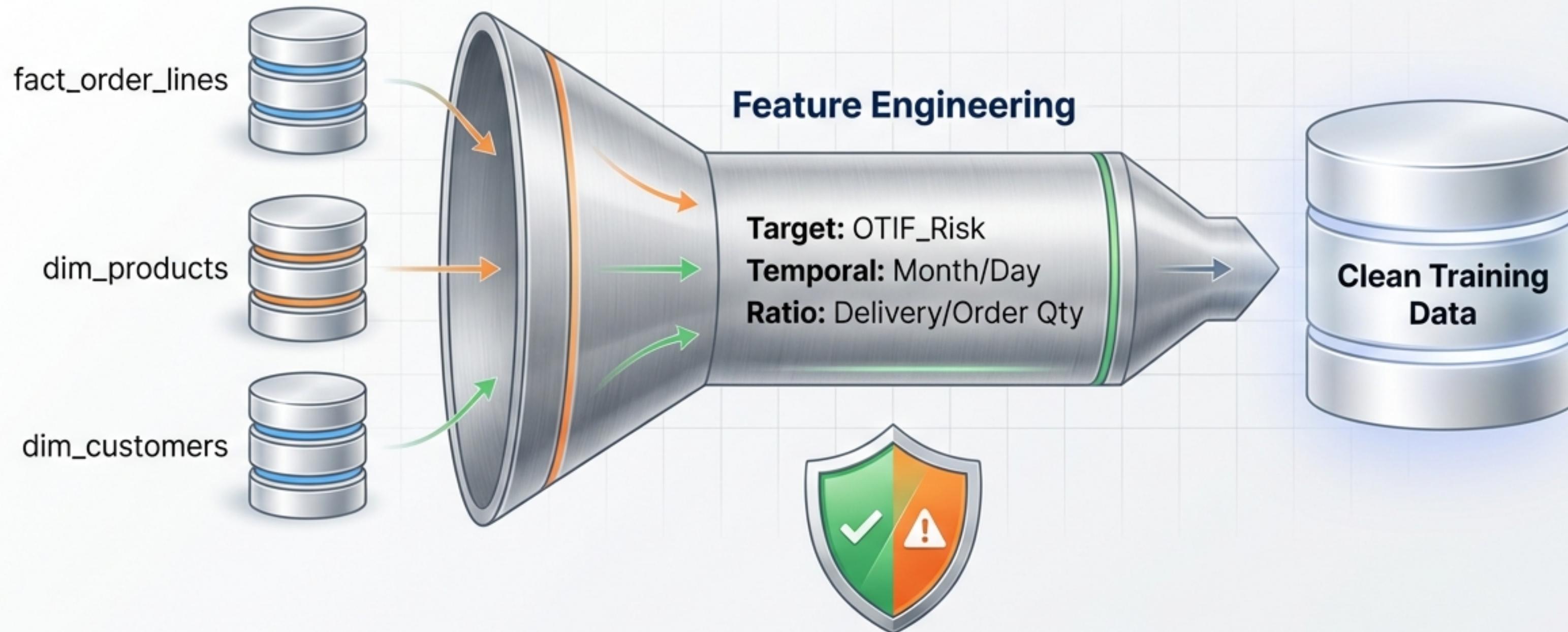


Calculates optimal corrective action balancing cost vs. speed.

# Methodology: The CRISP-DM Framework



# Data Engineering & Governance Foundations



Automated Validation Rules: Range Checks & Format Checks  
to prevent Garbage In, Garbage Out.

# Model Selection Strategy: Classification vs. Regression

## Regression Approach



Predicts exact delay  
(e.g., 48 hours).

Good for estimation,  
but lacks a clear  
trigger.

## Classification Approach



Predicts Binary Risk  
(Alert / No Alert).

Selected because  
operations need a  
clear trigger for  
automated workflows.

Contenders Evaluated: Logistic Regression vs. Random Forest Classifier.

# Model Evaluation: The Cost of a Missed Signal

Comparing Confusion Matrices on Test Data

Logistic Regression

TP	6104
FP	176
FN	2043
TN	3097

High Precision, but missed 2,043 risks.

Random Forest (Selected)

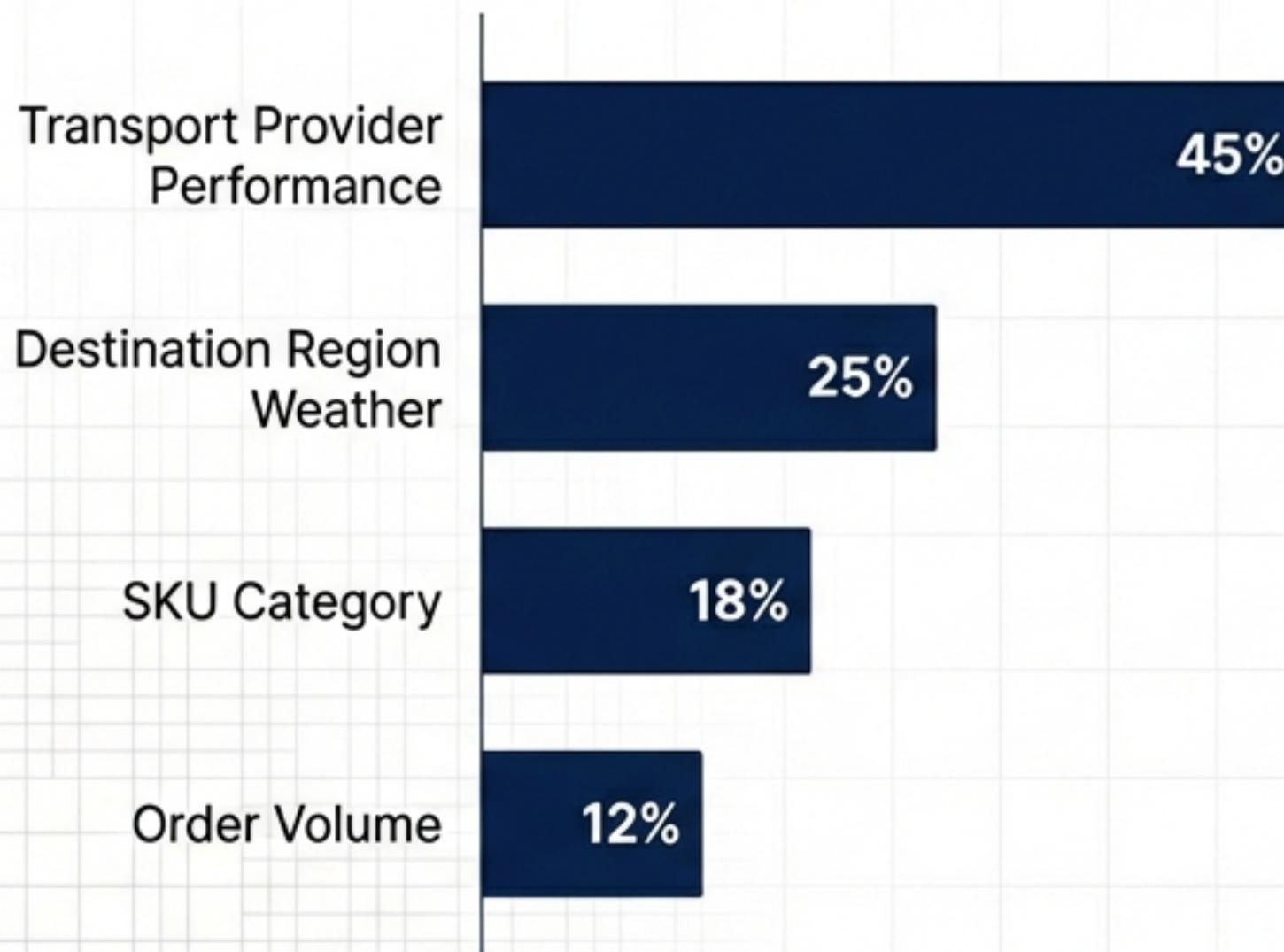
TP	6745
FP	954
FN	1402
TN	2319

Superior Recall. Reduced missed risks by ~30%.

We selected Random Forest because in supply chain, a missed risk (False Negative) costs significantly more than a false alarm.

# Explainability & Feature Importance

## Top Risk Drivers



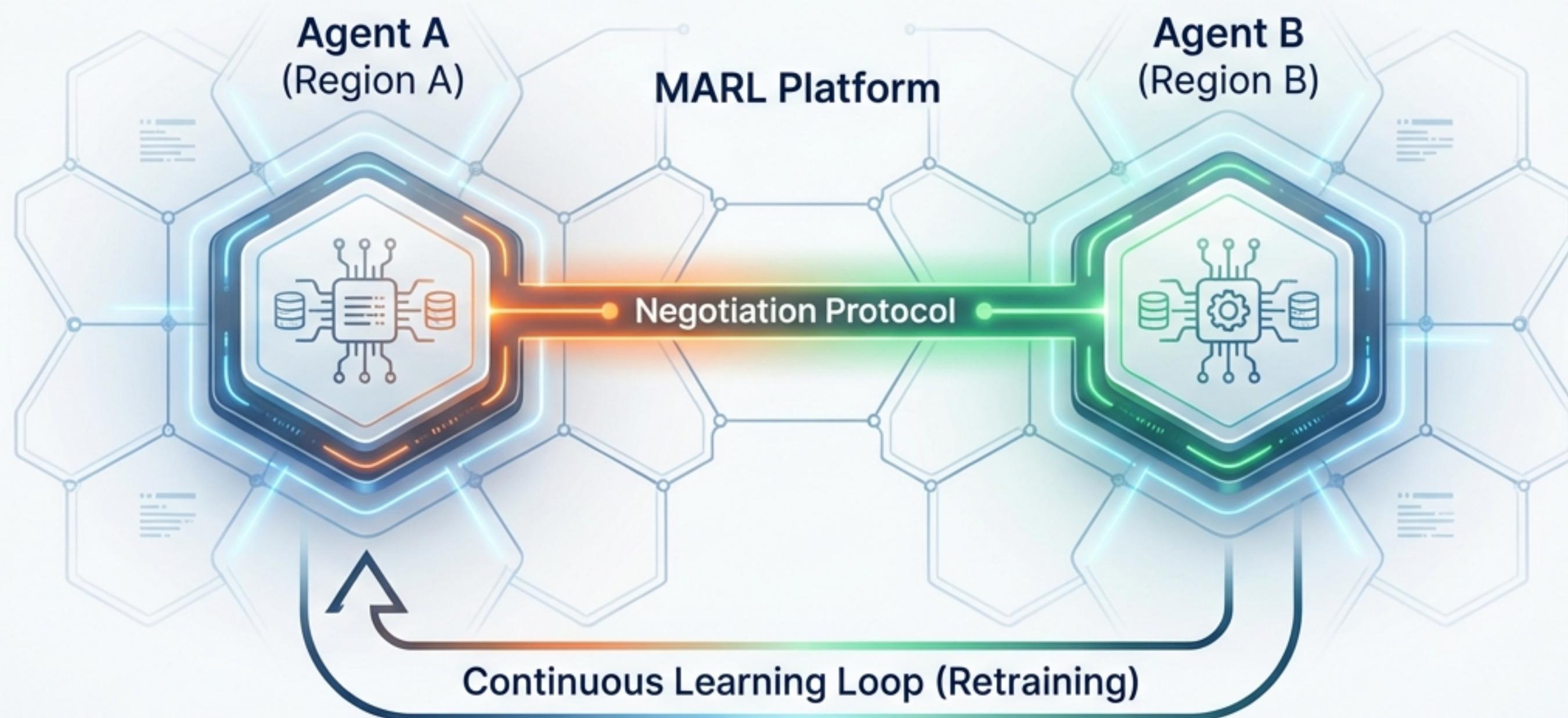
**Order #1024 - High Risk (92%)** ⚠

**Why?**

Primary Driver: Carrier Reliability in Southeast Region.

XAI (Explainable AI) ensures human trust in the loop.

# Future State Architecture: Autonomous Orchestration



Moving from centralized prediction to decentralized  
multi-agent negotiation

# Implementation Roadmap

## Phase 1: Foundation

(Months 1-3)



Data Ingestion, Cleaning,  
and Graph DB Setup.  
Establishing visibility.

## Phase 2: Intelligence

(Months 4-6)



Model training (Random  
Forest) and Pilot  
Program in one region.

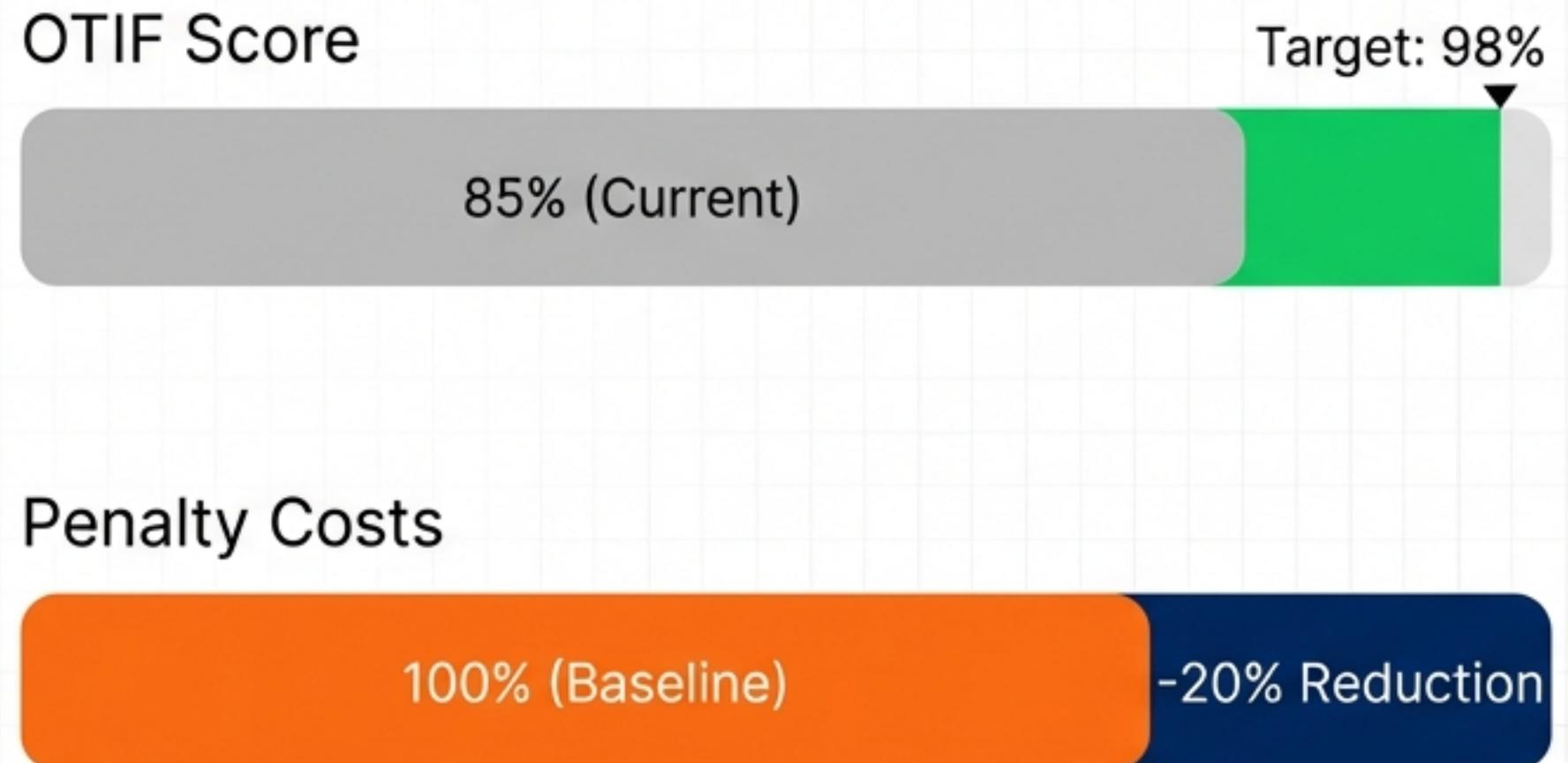
## Phase 3: Autonomy

(Months 7-9)



Network Solver  
deployment and ERP  
integration for  
automated execution.

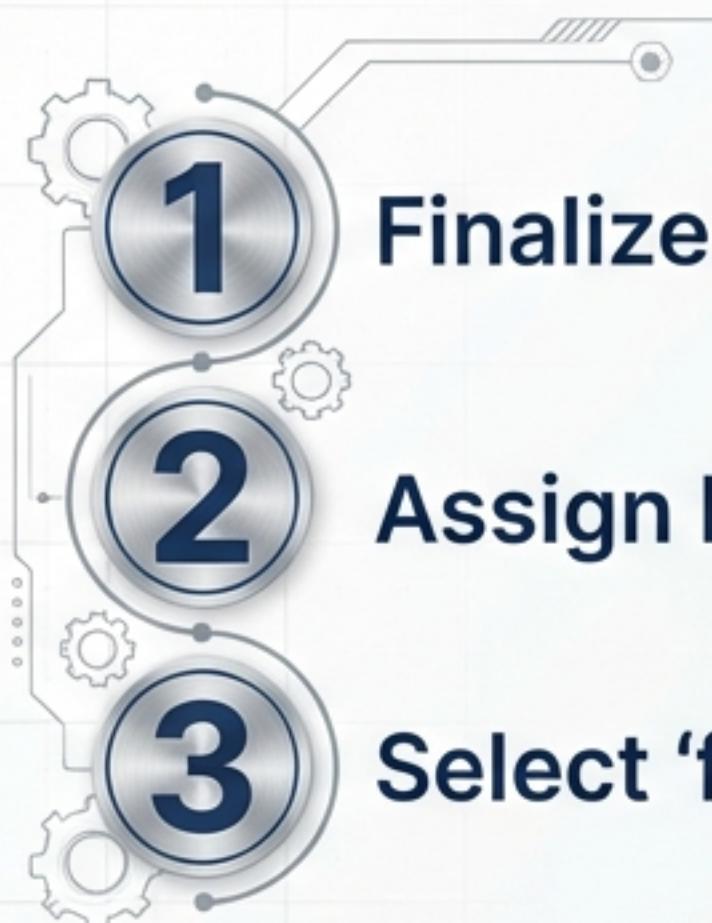
# Projected Business Impact & ROI



## ROI Drivers

- ✓ **Revenue Protection:** Preventing lost sales due to stockouts.
- ✓ **Cost Avoidance:** Reducing vendor chargebacks.
- ✓ **Efficiency:** Automating manual coordination.

# Path to Value: Next Steps



- 1 Finalize API access to ERP/WMS for historical data ingestion.**
- 2 Assign Data Stewards for Phase 1 Governance.**
- 3 Select 'frozen food' category for Phase 2 Pilot.**



## Thank You

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