

Advanced analytics and predictive modeling in pharma supply chain

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Global Supply Chain Excellence



Our History 1781 – 1979



1781

COMPANY FOUNDED

Chobei Takeda I sets up his business in Osaka

1871

INTERNATIONAL TRADE

Takeda pioneers in the importation of western medicines

1895

PRODUCTION

Pharmaceutical manufacturing begins in Takeda's factory

1915

OSAKA FACTORY

Opens as "Takeda Pharmaceutical Manufacturing Plant"

1946

HIKARI FACTORY

Opens in Yamaguchi prefecture

1951

INTERNATIONAL BUSINESS

Starts with North and Central America and Asia



2008

MILLENNIUM PHARMACEUTICALS

acquisition enhances innovation in oncology

2011

NYCOMED AQUISITION

expands Takeda's global footprint into more than 70 countries worldwide

2018

NEW YORK STOCK EXCHANGE LISTING

The only pharmaceutical company listed on both the TSE and the NYSE

SHONAN HEALTH INNOVATION PARK

opens as the first pharma-led open innovation ecosystem in Japan

TAKEDA GLOBAL HEADQUARTERS

opens in Tokyo, providing an environment that supports diverse workstyles

2019

SHIRE ACQUISITION

makes Takeda a global biopharmaceutical leader with a presence in approximately 80 countries

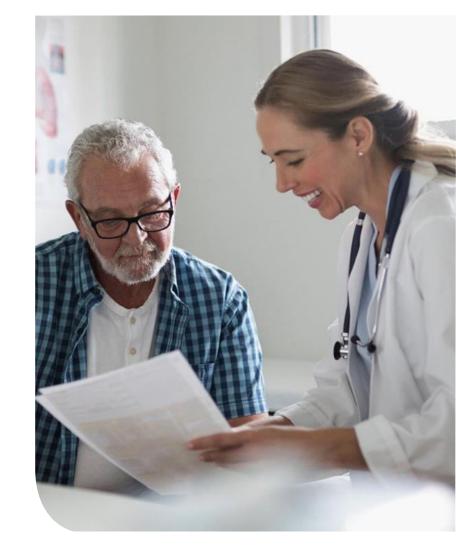
Takeda's Corporate Philosophy



PURPOSE	Better Health for People, Brighter Future for the World
VISION	Discover and deliver life-transforming treatments, guided by our commitment to patients, our people and the planet
VALUES	Patient-Trust-Reputation-Business, in that order Our values of Takeda-ism incorporate Integrity, Fairness, Honesty, and Perseverance, with Integrity at the core. We bring our values of Takeda-ism to life through actions based on Patient-Trust-Reputation-Business, in that order, symbolized by the four waterfalls.

PATIENT Responsibly translate science into highly innovative, life-changing medicines and vaccines. Accelerate access to improve lives worldwide. PEOPLE Create an exceptional people experience. PLANET Protect our planet.

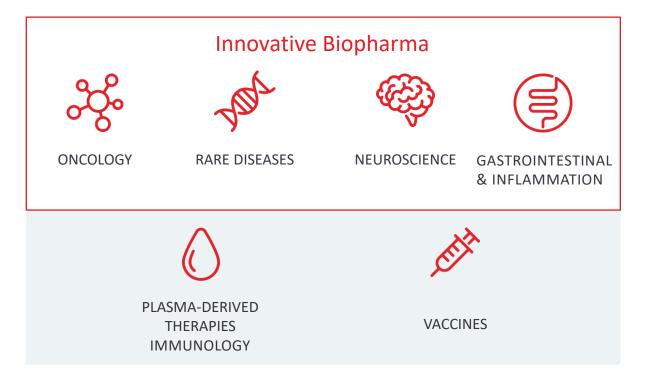
Unleash the power of data and digital.



R&D Focus & Engine



We are a patient driven, science first R&D organization. We combine our focus on core therapeutic areas with cutting edge technology. We work across four innovative biopharma areas and two business priorities.





Takeda Global Network



1781COMPAN FOUNDE

OPERATE FROM 5 REGIONS

- Japan
- U.S.A.
- Europe & Canada (EUCAN)
- Growth & Emerging Markets (GEM)
- China

PRESENCE: APPROX. IN COUNTRIES



Global Takeda Inventory Performance Management journey



2019

Shire Acquisition / Harmonization

Shire acquisition completed, ERP* and KPI* harmonization started

Performance Dialogue, targets based on external benchmark and growth

2020

One Stop Shop Dashboard

One Stop Shop reporting, selfservice, user friendly, more automated 2022

Advanced Reporting Insights and Analytics

Fully connected with Planning System,
Inventory Optimization, Advanced Analytics

– KPI correlation

2019

Supply Chain top level reporting

Supply Chain Inventory Reporting per OPU*/Brand, is available with limited details and no self-service/user friendly access to users

2021

E2E Integrated One Stop Shop Dashboard

E2E Global Takeda Inventory

Performance Management –

including perpetual inventory and

financial data – one source of truth

2023

Forward Looking Predictive Analytics

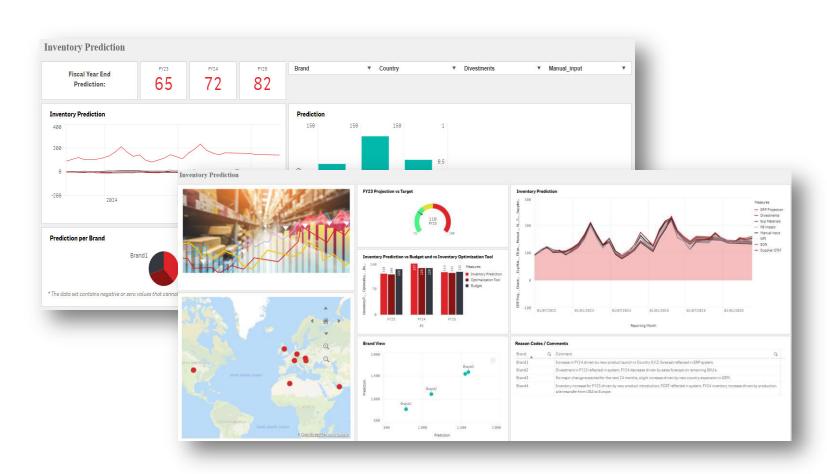
Inventory Prediction model

Predictive analytics, machine learning, Artificial Intelligence

*KPI – Key Performance Indicator ERP – Enterprise Resource Planning OPU – Operating Unit (e.g. Division)

Forward looking approach – Inventory Prediction Mockup





Value proposition:

- Used by Supply Chain and Finance community
- Performance dialogues with Operating Units and Regions
- Year End planning, Financial planning
- Identify opportunities for inventory optimalization
- Warehouse capacity planning
- Manufacturing capacity planning
- Future alerts , inventory ageing and slow movers projection

Forward looking approach - Inventory Prediction Data Processing





ERP* + Planning system Projection

KPI* correlation elements (FA,FB*, production yield...)

Financial journeys

Manual adjustments

Artificial Intelligence Tool

Outcome: Based on best model Inventory Prediction

Outcome - > compare with Budget / multi-echelon inventory optimalization tool result Visualization

Compare with Budget / multiechelon inventory optimalization tool result

*ERP - Enterprise Resource Planning

KPI – Key Performance Indicator

FA – Forecast Accuracy / FB – Forecast Bias

Forward looking approach - Takeda Inventory Projection Footprint



One Stop Shop Dashboard

Projection and ERP*
Consumption

Prediction Factors
FA / FB*
Supply Alert
Launch
Manual Input

Inventory Optimalization Tool Safety stock Projection

- Automated data flow
- Data available for everyone
- More data granularity
- Monthly Performance
 Dialogues to understand trends
- Secondary KPI tracking

ERP System

*ERP - Enterprise Resource Planning

FA – Forecast Accuracy / FB – Forecast Bias

Forward looking approach – Inventory Prediction





Challenges...

- Data consistency: different key figures in planning system, the business process not always aligned
- Communication: if they change something in process, lack of communication
- Data architecture, connection establishment
- Planning levels in planning system (material type / Bill Of Material)
- Organizational challenges, change management

... vs Opportunities......

- External Artificial Intelligence tool
- Unlimited further used cases
- Supply Chain Planning, Manufacturing capacity planning, Procurement, Warehouse Management, Transportation planning
- Financial planning: MRP planning, Year end closing,
 Budget planning



THANK YOU!