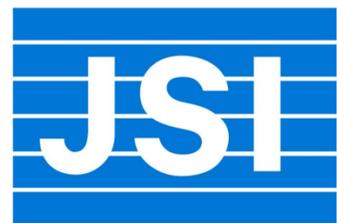




# Theory of Change & Theory of Action

for Strengthening of Healthcare Supply Chain through  
Artificial Intelligence



# Acronyms

**AI** - Artificial Intelligence

**ML** - Machine Learning

**TOC** - Theory of Change

**TOA** - Theory of Action

**RMNCH** - Reproductive, Maternal,  
Newborn and Child Health

**eLMIS** - Electronic Logistic  
Management Information System

**DHIS** - Demographic Health  
Information Survey

**GoT-HoMIS** - Government of  
Tanzania Hospital Management  
Systems

**IMPACT** - Information Mobilize for  
Performance Analysis and  
Continuous Transformation

**SOPs** - Standard Operating  
Procedures

**ROI** - Return on Investment

**TBS** - Tanzania Bureau of Standards

**TMDA** - Tanzania Medicines and  
Devices Authority

**BRELA** - Business Registration and  
Licensing Agency

**TRA** - Tanzania Revenue Authority

**PHLB** - Private Health Laboratories  
Board

**PORALG** - President's Office, Regional  
Administration and Local Government

**MOHCDGEC** - Ministry of health,  
Community Development, Gender,  
Elderly and Children

# AI for Supply Chains: TOC & TOA

With support from the Bill & Melinda Gates and ELMA Foundations and together with MOHCDGEC Tanzania, inSupply Health co-created a TOC & TOA with variety of partners:

- Theory of change (TOC) that includes the pre-conditions for effective use of AI to solve supply chain problems
- Theory of action (TOA) that includes practical ways to integrate, scale and sustain the technology in health supply chain systems



# TOC & TOA

## Theory of Change

### What is it?

Describes **outcomes and pre-conditions through which change comes** about for individuals, groups or communities.

### Questions it answers:

- **What** is the change?
- **Why** is the change occurring?

### Characteristics:

- Dynamic
- Evolving
- Theoretical

## Theory of Action

### What is it?

Articulates the **mechanisms through which the activities are being delivered**, e.g. through which type of actors and following what kind of processes.

### Questions it answers:

- **How** does the change occur?
- **Who** are the actors involved?

### Characteristics:

- Captures potential unknowns
- May have multiple layers
- Linked to the Theory of Change

# Why Do We Need a TOC & TOA?

**Enabling environment  
to support a AI/ML solutions**

**Empowered, skilled and motivated  
stakeholders to use AI/ML powered  
solutions**

**To have a responsive and integrated supply chain with prediction, automation and data  
visibility to ensure 100% health commodity availability**

## **ACCESS**

**Health commodities are available to all who  
need them**

## **EQUITY**

**Supply chains are optimised and responsive  
to needs of all population segments**

**END GOAL**

# Preconditions & Stages of Operationalizing AI/ML for Health & Supply Chains

## Change pathways for AI/ML solutions

Precondition	Definition
<b>DATA PRIVACY, ETHICS &amp; OWNERSHIP</b>	<b>Confidence and trust</b> in the data flows, technology and the people who are solution providers
<b>KNOWLEDGE &amp; SKILLS</b>	All the <b>competencies</b> needed to enable AI/ML for health supply chain
<b>PARTNERSHIPS</b>	The <b>agreements</b> that need to be in place to facilitate AI/ML use
<b>RESOURCES</b>	<b>Human and financial</b> resources that provide the means needed to follow through on AI/ML use.
<b>TECHNOLOGY</b>	The <b>tools and processes</b> that facilitate AI/ML use within health supply chain systems
<b>POLICY &amp; GUIDELINES</b>	International and national <b>policies and guidelines</b> that codify AI/ML use as a necessary strategy for achieving results.

## Stage of interventions

Stages	Definition
<b>INSTILL</b>	The actions or interventions that support <b>establishing the foundation</b> of a particular enabling environment in a specific jurisdiction and sub-group of people.
<b>SCALE</b>	The actions or interventions <b>to expand solutions</b> to new levels of the health system, new users or new geographies.
<b>SUSTAIN</b>	The actions or interventions that focus on macro, <b>system-level changes</b> that help permanently embed solutions across multiple levels of the health system, multiple geographies and multiple teams.

*Adapted from Theory of Change/Theory of Action for Supply Chain Data Use developed by inSupply Health, JSI, VillageReach, and CHAI 2020.*

# Stakeholder/User Groups

Who is involved or affected by the Change?



**Patients**



**Healthcare  
Workers**



**Ministry Staff**



**Implementing  
Partners**



**Academic  
Institutions**



**AI Solution  
Providers**



**Public & Private  
Suppliers**



## Patient

Need	Preconditions	Instill	Scale and Sustain
<ul style="list-style-type: none"> <li>→ I need information on where to get quality and affordable medicine and healthcare services near me</li> </ul>	<p style="text-align: center;"><b>DATA PRIVACY, ETHICS &amp; OWNERSHIP</b></p>	<ul style="list-style-type: none"> <li>→ Community engagement on benefits of AI</li> </ul>	<ul style="list-style-type: none"> <li>→ Policies guiding AI powered Targeted Digitized information as part of patients &amp; community outreach/communication programs</li> </ul>
<ul style="list-style-type: none"> <li>→ I need to know when my clinic appointment is</li> </ul>	<p style="text-align: center;"><b>KNOWLEDGE &amp; SKILLS</b></p>	<ul style="list-style-type: none"> <li>→ Policies to safeguard patient data trust, privacy and ownership</li> </ul>	<ul style="list-style-type: none"> <li>→ Electronic Medical records (EMRs) with universal patient and services identifiers</li> </ul>
<ul style="list-style-type: none"> <li>→ I need instructions for using my medications (time, dosage etc.)</li> </ul>	<p style="text-align: center;"><b>PARTNERSHIPS</b></p>	<ul style="list-style-type: none"> <li>→ Development of AI powered chatbots for providing information to patients</li> </ul>	<ul style="list-style-type: none"> <li>→ Policies supporting e-Prescription information to be shared during dispensing/service delivery</li> </ul>
<ul style="list-style-type: none"> <li>→ I need information on health interventions e.g. vaccinations, RMNCH services</li> </ul>	<p style="text-align: center;"><b>BUSINESS MODELS &amp; RESOURCES</b></p>	<ul style="list-style-type: none"> <li>→ Push mobile messages for healthcare dispensed/ medicine use information, tailored to individual patients using AI</li> </ul>	<ul style="list-style-type: none"> <li>→ Integration platform of medicines and services available at public and private facilities</li> </ul>
<ul style="list-style-type: none"> <li>→ I need information on healthy living and preventive measures</li> </ul>	<p style="text-align: center;"><b>TECHNOLOGY</b></p>		<ul style="list-style-type: none"> <li>→ AI-powered wait time predictions</li> </ul>
	<p style="text-align: center;"><b>POLICY &amp; GUIDELINES</b></p>		

## Healthcare Worker



Need	Preconditions	Instill	Scale and Sustain
<ul style="list-style-type: none"> <li>→ I need to be able to anticipate surges in demand based on outbreaks, seasonal disease</li> <li>→ I need to understand stock status to prevent wastage</li> <li>→ I need my orders to be fulfilled on time and in full</li> <li>→ I need to proactively know the availability of funds to plan my commodity ordering better</li> <li>→ I need information about incoming patient immediately to serve my patients better</li> <li>→ I need to make accurate diagnosis and provide the right services</li> <li>→ I need to be able to trust the data I am generating</li> </ul>	<div style="background-color: #f47920; color: white; padding: 5px; text-align: center; font-weight: bold;">DATA PRIVACY, ETHICS &amp; OWNERSHIP</div> <div style="background-color: #1a3d54; color: white; padding: 5px; text-align: center; font-weight: bold;">KNOWLEDGE &amp; SKILLS</div> <div style="background-color: #3a6d8c; color: white; padding: 5px; text-align: center; font-weight: bold;">PARTNERSHIPS</div> <div style="background-color: #80c4c4; color: white; padding: 5px; text-align: center; font-weight: bold;">BUSINESS MODELS &amp; RESOURCES</div> <div style="background-color: #a0c4e0; color: white; padding: 5px; text-align: center; font-weight: bold;">TECHNOLOGY</div> <div style="background-color: #666666; color: white; padding: 5px; text-align: center; font-weight: bold;">POLICY &amp; GUIDELINES</div>	<ul style="list-style-type: none"> <li>→ Interoperability of systems for managing demand, supplies and funds</li> <li>→ Development of AI-powered forecasting algorithms</li> <li>→ Development of AI-powered clinical decision support algorithms</li> <li>→ Capacity building in proactive and preventive data use</li> <li>→ Revised SOPs in proactive stock analysis and data use</li> <li>→ AI-assisted alerts/reports on medicine expiration/traceability</li> </ul>	<ul style="list-style-type: none"> <li>→ Predictive analytics integrated in eLMIS</li> <li>→ Institutionalize Continuous Quality Improvement approaches for SC Problem Solving (IMPACT Teams)</li> <li>→ SMS/app based alerts features in health systems</li> <li>→ Systems with ability to determine expected clients and their medicines, health equipment, and services needed</li> <li>→ ML Skills incorporated in preservice training and continuous education plans</li> </ul>

## Need

- I need to know demand from my customers well in advance to provide better customer care
- I need to be able to forecast and optimize stock levels across warehouses to minimize stock out and expiry
- I need efficient distribution systems to be able to deliver according to schedule
- I need to receive payments on time
- I need to receive accurate orders on time
- I need performance data from prime vendors and other 3rd party service providers to manage contracts
- I need to segment products based on consumptions and costs

## Preconditions

DATA PRIVACY, ETHICS & OWNERSHIP

KNOWLEDGE & SKILLS

PARTNERSHIPS

BUSINESS MODELS & RESOURCES

TECHNOLOGY

POLICY & GUIDELINES

## Instill

- Interoperability of systems for managing demand, supplies and funds
- Visibility of data between public, supplier, service delivery points and prime vendors
- Capacity building in proactive and preventive data use through continuous quality improvement
- Advocacy for on time funds disbursement using data predicting demand or stock outs
- AI-assisted operation alerts/ reports on medicine expiration/ traceability

## Scale and Sustain

- Predictive analytics (AI/ML) integrated in Warehouse management systems
- ML technology integrated in Distribution Management Systems
- ML Skills incorporated in preservice training and continuous education plans
- Framework contracts in place e.g. Prime vendors to facilitate order fulfilments
- Memorandum of understanding on funds disbursement and payment between suppliers, Health Facilities and MoH

## Public Supplier (Medical Stores)



## Private Suppliers



Need	Preconditions	Instill	Scale and Sustain
<ul style="list-style-type: none"> <li>→ I need to know stock position of my clients to plan well in advance</li> <li>→ I need to know real time stock levels across public and private suppliers for better planning</li> <li>→ I need to be able to offer competitive prices</li> <li>→ I need to have high order fulfilling rate to meet service level agreements to win tenders</li> <li>→ I need to know financial status of my customers and to receive payments on time</li> <li>→ I need to know the locations of my customers so as I can deliver on time</li> <li>→ I need to use data to maximize performance and profitability</li> </ul>	<div style="background-color: #f47920; color: white; padding: 5px; text-align: center; font-weight: bold;">DATA PRIVACY, ETHICS &amp; OWNERSHIP</div> <div style="background-color: #1a3d54; color: white; padding: 5px; text-align: center; font-weight: bold;">KNOWLEDGE &amp; SKILLS</div> <div style="background-color: #3a6d8c; color: white; padding: 5px; text-align: center; font-weight: bold;">PARTNERSHIPS</div> <div style="background-color: #66c2cc; color: white; padding: 5px; text-align: center; font-weight: bold;">BUSINESS MODELS &amp; RESOURCES</div> <div style="background-color: #a0c4e0; color: white; padding: 5px; text-align: center; font-weight: bold;">TECHNOLOGY</div> <div style="background-color: #7f7f7f; color: white; padding: 5px; text-align: center; font-weight: bold;">POLICY &amp; GUIDELINES</div>	<ul style="list-style-type: none"> <li>→ Prioritizing integration of systems for visibility of data across service delivery points, private and public suppliers.</li> <li>→ Integration of other systems such as TBS, TMDA, Brela, TRA, PHLB to show legitimacy of the supplier</li> <li>→ Updated geo-location of all service delivery points</li> <li>→ Data analytics to support performance based of tendering/contracting</li> <li>→ Training on predictive and proactive data use culture, and continuous quality improvement</li> </ul>	<ul style="list-style-type: none"> <li>→ MoU for Data transparency between public suppliers, private suppliers and service delivery points</li> <li>→ Framework contracts in place e.g. Prime vendors to facilitate order fulfilments</li> <li>→ Predictive analytics(AI/ML) in inventory management systems</li> <li>→ National and Global quality management standards to include AI/ML components</li> </ul>

## Ministry of Health



Need	Preconditions	Instill	Scale and Sustain
<ul style="list-style-type: none"> <li>→ I need performance data to manage public suppliers and outsourced vendors based on contracts</li> <li>→ I need to triangulate information from different systems to overcome data quality issues.</li> <li>→ I need to analyse data to uncover root cause of factors causing challenges or bringing success</li> <li>→ I need to know the total cost of ownership for proposed AI solutions</li> <li>→ I need to predict and prevent loss due to wastage</li> <li>→ I need to track free and subsidized health commodities</li> <li>→ I need to predict annual needs</li> <li>→ I need to eliminate the need of calling lower levels for reports</li> <li>→ I need AI awareness to all people at all levels</li> <li>→ I need to have data and predictions at my fingertips to advocate effectively</li> </ul>	<div style="background-color: #f47920; color: white; padding: 5px; text-align: center; font-weight: bold;">DATA PRIVACY, ETHICS &amp; OWNERSHIP</div> <div style="background-color: #1a3d54; color: white; padding: 5px; text-align: center; font-weight: bold;">KNOWLEDGE &amp; SKILLS</div> <div style="background-color: #3a6d8c; color: white; padding: 5px; text-align: center; font-weight: bold;">PARTNERSHIPS</div> <div style="background-color: #66c2cc; color: white; padding: 5px; text-align: center; font-weight: bold;">BUSINESS MODELS &amp; RESOURCES</div> <div style="background-color: #a0c4e0; color: white; padding: 5px; text-align: center; font-weight: bold;">TECHNOLOGY</div> <div style="background-color: #667777; color: white; padding: 5px; text-align: center; font-weight: bold;">POLICY &amp; GUIDELINES</div>	<ul style="list-style-type: none"> <li>→ Formative evaluation for need and acceptability of AI</li> <li>→ Adopt global guidance on use of AI in health sector</li> <li>→ Leadership sensitization on benefit of AI</li> <li>→ AI insights integrated in routine data use meeting</li> <li>→ AI solution co-created and tested in small scale in current systems</li> <li>→ Development of a total cost of ownership for proposed AI solutions</li> <li>→ AI skills outsourced while building local capacity</li> <li>→ Link data source</li> <li>→ Verify reliability of data from the models</li> </ul>	<ul style="list-style-type: none"> <li>→ Data science skills as part of preservice training and in service continuous education)</li> <li>→ AI powered Decision-support analytics integrated in systems</li> <li>→ Developed solutions can be adapt to changes or expansion.</li> <li>→ Monitoring Evaluation and Learning</li> <li>→ Costs included in budgets including ICT Infrastructure</li> <li>→ AI staffing optimization</li> <li>→ AI to work in different environment and scenarios</li> <li>→ National Policy with clear path of AI data security and privacy</li> <li>→ I need the technology to work at all levels</li> </ul>

## Academic Institutions



Need	Preconditions	Instill	Scale and Sustain
<ul style="list-style-type: none"> <li>→ I need to understand where there are gaps in knowledge or practice so we can participate in research to fill those gaps</li> <li>→ I need to access to relevant and good quality data for teaching and research</li> <li>→ I need access to quality data to develop case studies for teaching, research &amp; consultancy</li> <li>→ I need skills development for academic staff and students</li> <li>→ Strengthening AI curriculum</li> <li>→ I need exposure to challenge driven AI special projects for students</li> </ul>	<div style="background-color: #f47920; color: white; padding: 5px; text-align: center; font-weight: bold;">DATA PRIVACY, ETHICS &amp; OWNERSHIP</div> <div style="background-color: #1a3d54; color: white; padding: 5px; text-align: center; font-weight: bold;">KNOWLEDGE &amp; SKILLS</div> <div style="background-color: #3a6d8c; color: white; padding: 5px; text-align: center; font-weight: bold;">PARTNERSHIPS</div> <div style="background-color: #76c7c7; color: white; padding: 5px; text-align: center; font-weight: bold;">BUSINESS MODELS &amp; RESOURCES</div> <div style="background-color: #a0c0d0; color: white; padding: 5px; text-align: center; font-weight: bold;">TECHNOLOGY</div> <div style="background-color: #667777; color: white; padding: 5px; text-align: center; font-weight: bold;">POLICY &amp; GUIDELINES</div>	<ul style="list-style-type: none"> <li>→ Advocacy and awareness promoting by involving Commission of Science &amp; Technology</li> <li>→ Partnership with data owners to provide problem areas and data for graduates to do research</li> <li>→ Curriculum development for professionals and academic programs on how to use AI</li> <li>→ Internships and Practicums through partnerships with Implementing Partners to ensure AI is applied cost-effectively in practice</li> <li>→ Infrastructure to support AI learning</li> </ul>	<ul style="list-style-type: none"> <li>→ Research agenda that is built with data owners and ministries</li> <li>→ Partnership with solution providers to provide ongoing technical assistance to MoH</li> <li>→ Research agenda that is built with data owners &amp; ministries</li> <li>→ Partnership with solution provide ongoing technical assistance to MoH</li> <li>→ Establishing AI student clubs/forums</li> <li>→ Institutionazine the AI agenda in academic plans and budget</li> </ul>

# AI Solution Developer/ Engineer



## Implementing Partner



Need	Preconditions	Instill	Scale and Sustain
<ul style="list-style-type: none"> <li>→ I need to access to supply chain systems</li> <li>→ I need to be able to analyse data to give them information</li> <li>→ I need ready to use information for decision making</li> <li>→ I need to be able to understand how best to provide assistance and capacity support for interpreting data and making practical decisions with predictions</li> <li>→ I need to support adaptation of processes/SOPs to reflect changes in data use and decision making with AI/ML</li> </ul>	<div style="background-color: #f47920; color: white; padding: 5px; text-align: center; font-weight: bold;">DATA PRIVACY, ETHICS &amp; OWNERSHIP</div> <div style="background-color: #1a3d54; color: white; padding: 5px; text-align: center; font-weight: bold;">KNOWLEDGE &amp; SKILLS</div> <div style="background-color: #3a6d8c; color: white; padding: 5px; text-align: center; font-weight: bold;">PARTNERSHIPS</div> <div style="background-color: #76c7c7; color: white; padding: 5px; text-align: center; font-weight: bold;">BUSINESS MODELS &amp; RESOURCES</div> <div style="background-color: #a0c0d0; color: white; padding: 5px; text-align: center; font-weight: bold;">TECHNOLOGY</div> <div style="background-color: #667777; color: white; padding: 5px; text-align: center; font-weight: bold;">POLICY &amp; GUIDELINES</div>	<ul style="list-style-type: none"> <li>→ Build algorithm with current system</li> <li>→ Should have access to system</li> <li>→ Extend system(s) visibility to enable intervention and support from Implementing Partners</li> </ul>	<ul style="list-style-type: none"> <li>→ Solution to adopt changes or expansion</li> <li>→ Capacity building beyond MoH (Academia, Local government and private institutions etc.)</li> </ul>

## PORALG



- I need easy accessibility and real-time data insights to provide to different levels e.g. Ministry, subnational etc.
- I need track status of medical equipments, medicine and non-medicine supplies
- I need to predict loss due to imminent wastage or expiry
- I need to predict annual needs
- I need to integrate data from LMIS, DHIS2, Got HOMIS and others
- I need to eliminate the need for me to call lower levels for reports
- I need to know cost implementation of AI
- I need flag to report data quality issues
- I need to analyze data and provide report
- I need system to function at operational level e.g. MoH, Regional & District Medical Officers, Health Facilities Incharges
- I need to ensure scalability to other beyond SC

### DATA PRIVACY, ETHICS & OWNERSHIP

### KNOWLEDGE & SKILLS

### PARTNERSHIPS

### BUSINESS MODELS & RESOURCES

### TECHNOLOGY

### POLICY & GUIDELINES

- Link existing systems
- Policy to guide path to keep clear path of AI and data security
- Conduct formative evaluation for need and acceptability of this technology experts and developers
- Awareness and readiness to adopt AI
- Share experience from other countries/regions benefits from AI

- Information Communication Technology (ICT ) infrastructures and devices at all levels
- Reliable internet connectivity
- Tech skills and experts
- AI to work in different environment or scenario