

# Enhancing Trust of Supply Chain Using Blockchain Platform with Robust Data Model and Verification Mechanisms

KAIST

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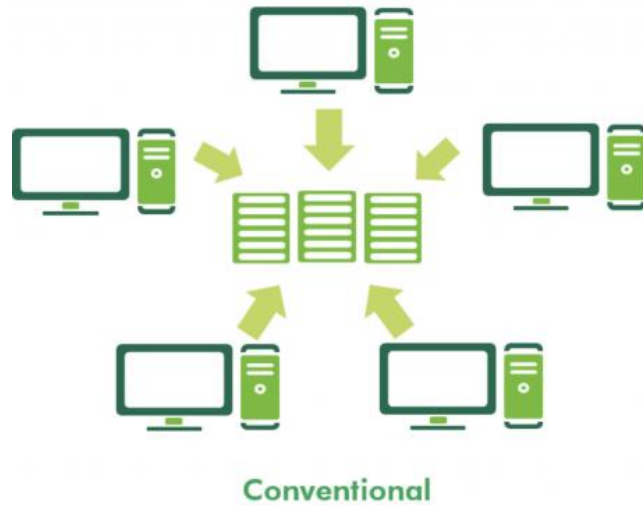
# Fipronil egg contamination (2017)



- Took long to identify where and how contamination started and spread out
- Raised questions about **visibility** of supply chains

# Rise of blockchain-based solutions

## Independent & Fragmented systems



- **Fragile** against data tampering
- Requires reconciliation of data → track & trace: **complex & time-consuming**

## Shared & Distributed systems



- **Robust** against data tampering (cryptography-based verification)
- Distributed consensus & smart contract-based automation → track & trace: **simple & fast** <sup>3</sup>

# Rise of blockchain-based solutions

## Conventional SCM system

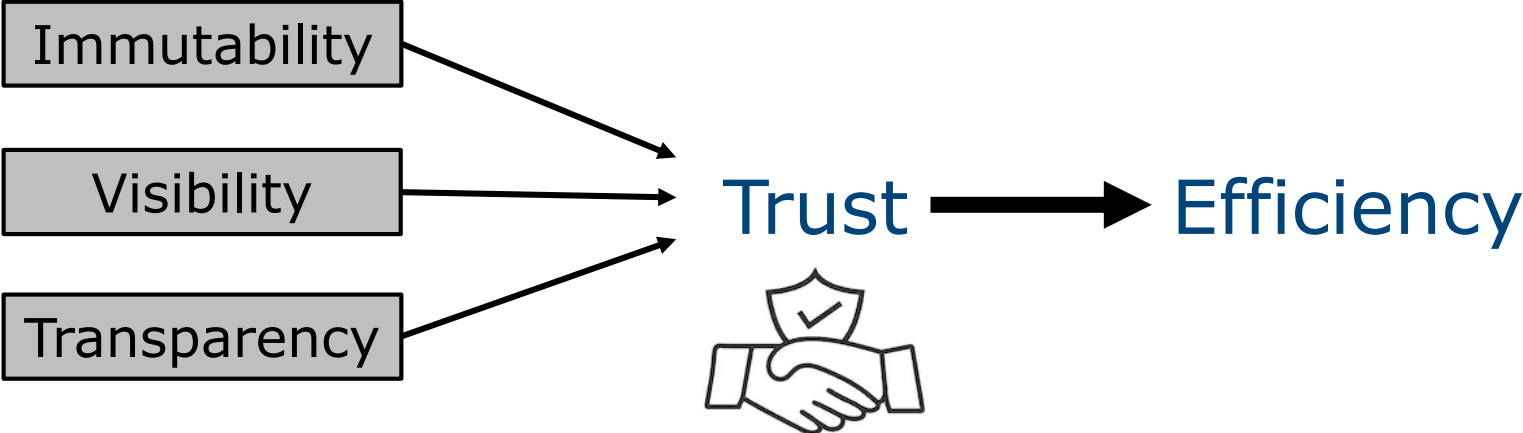
- Independent, fragmented ledgers
- Limited visibility
- Low availability
- Fragile to data tampering
- Costly traceability

VS

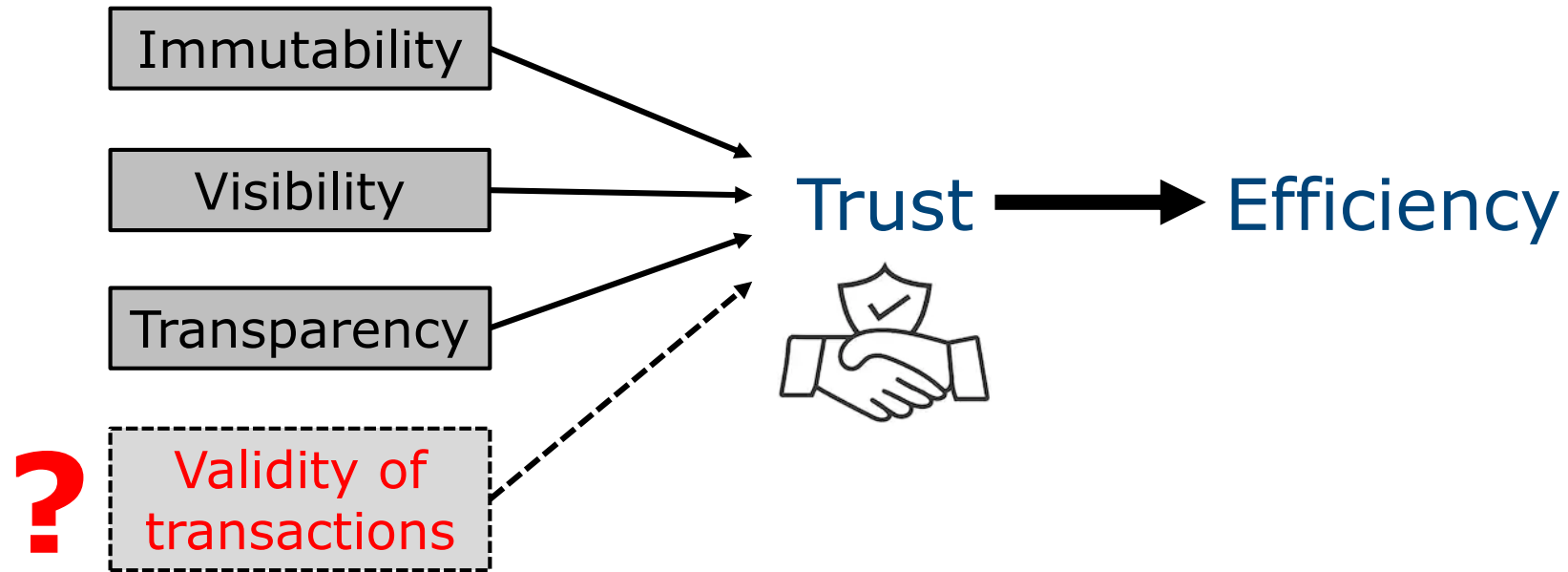
## Blockchain-based SCM system

- Shared ledgers
- Full visibility
- High availability
- Resilient to data tampering
- Cost-efficient traceability

# Trust model of blockchain

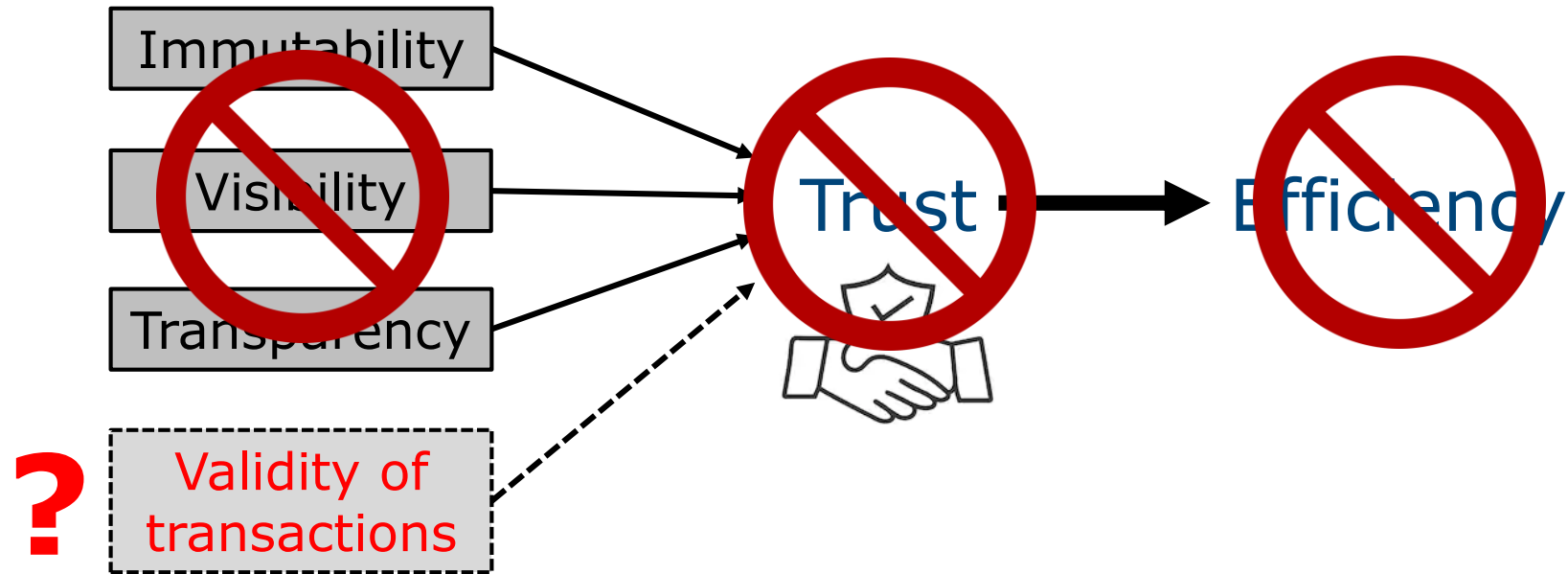


# What's often neglected



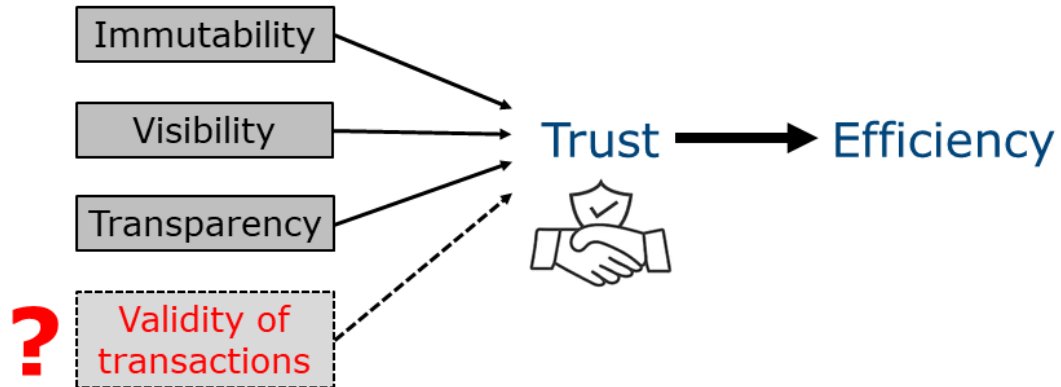
Question: What if **wrong data** is committed in blockchain?

# Without proper data verification



Then, almost all benefits of blockchain become **meaningless**

# Validity of transactions?



- (1) Programming language aspects of smart contracts  
- Actively studied (e.g. symbolic model checking – NDSS'18)
- (2) Transactions aligned with **business context**  
- No work up to date

Especially important for supply chain management (SCM) to be **robust against anomalous actions**



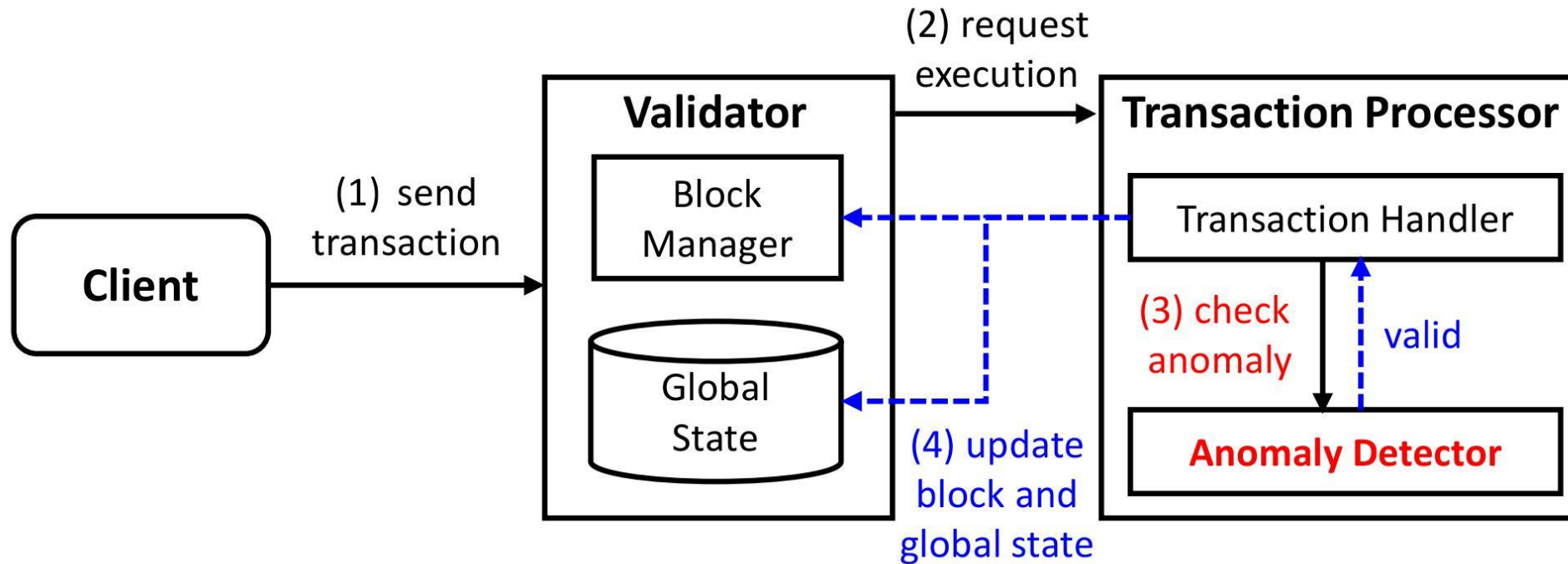
# Goal

- **Anomaly detection:** Filtering of transactions that are inconsistent with existing business context
- **Goal:** Propose a blockchain platform for SCM that has anomaly detection layer to filter anomalous transactions
  - Robust data model
  - Verification mechanisms

# Outline

- Motivation and goals
- **System overview**
- Data model
- Verification of business logic
- Implementation and evaluation

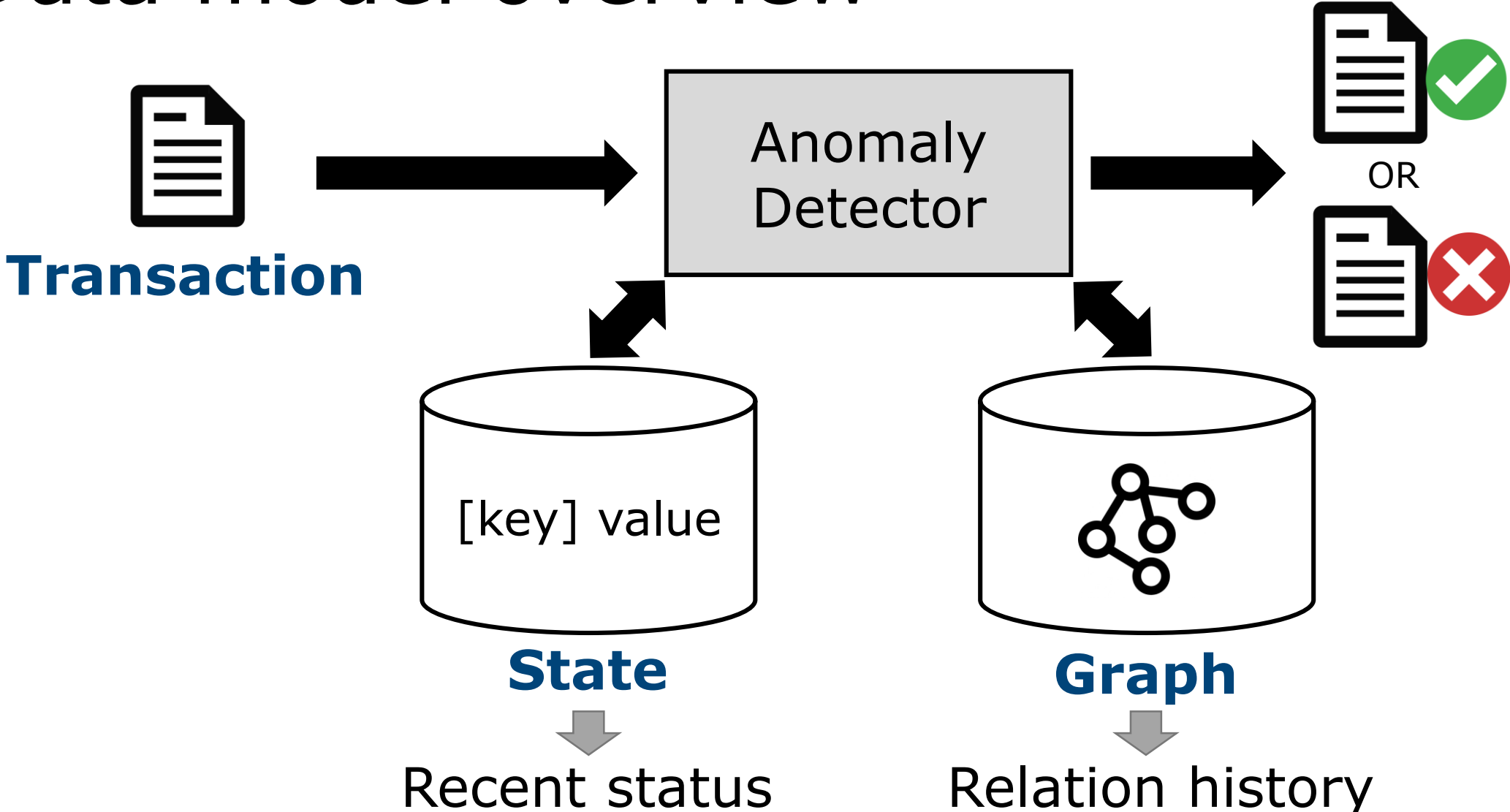
# System overview



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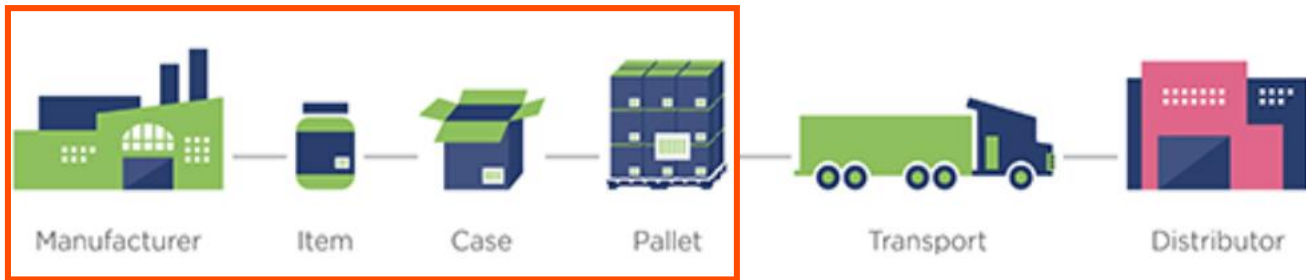
# Data model overview



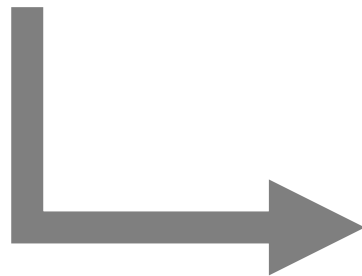
# Transaction model

- Transaction: supply chain **event**

**EPCIS STANDARD**  
**What:** Identifiers of associated items  
**When:** Time of an event  
**Where:** Location of an event  
**Why:** business step



An event



Transaction

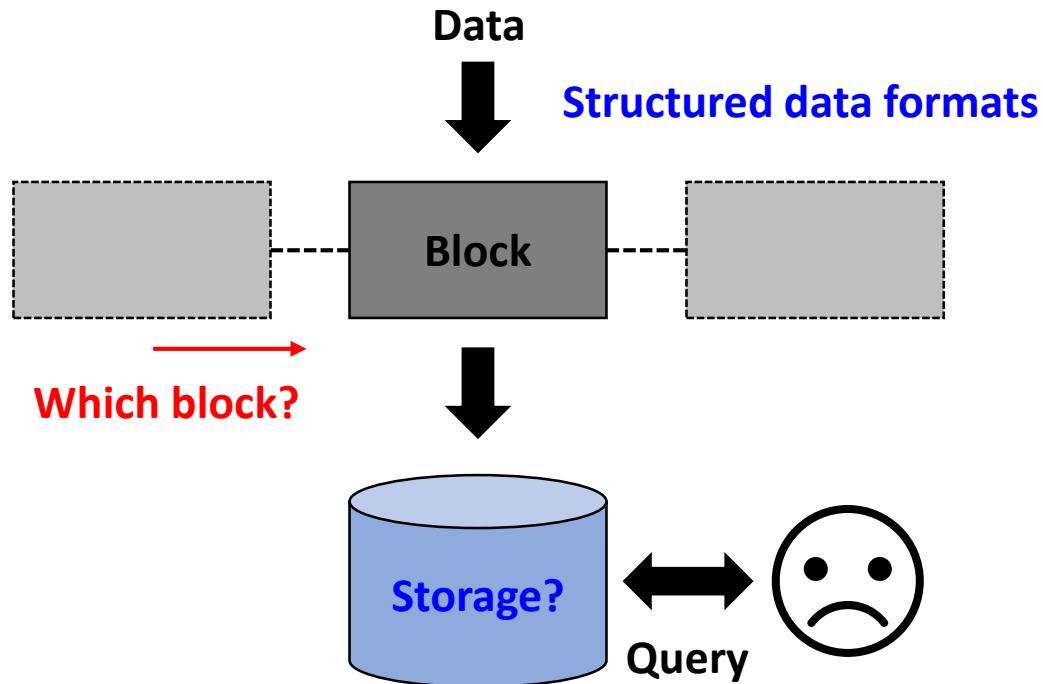
<b>Tx header</b>	<b>Header signature</b>
<b>Payload</b>	
<b>Event_type:</b> aggregation	
<b>Product_in:</b> identifier_strawberry (sgtin)	
<b>Product_out:</b> identifier_pallet (sscc)	
<b>Timestamp:</b> 2019-04-09T13:30:10	
<b>Location:</b> identifier_factory (sgln)	
<b>Bizstep:</b> loading	

# State model

- **State**: current status of an item in supply chain
  - Key-value store built with addressable radix Merkle tree
  - Example
    - Key: identifier of a box of strawberries
    - Value: a tuple ("2019-09-26-10:30", identifier of a farm, "produced", "object event")

# Limits of blockchain data model

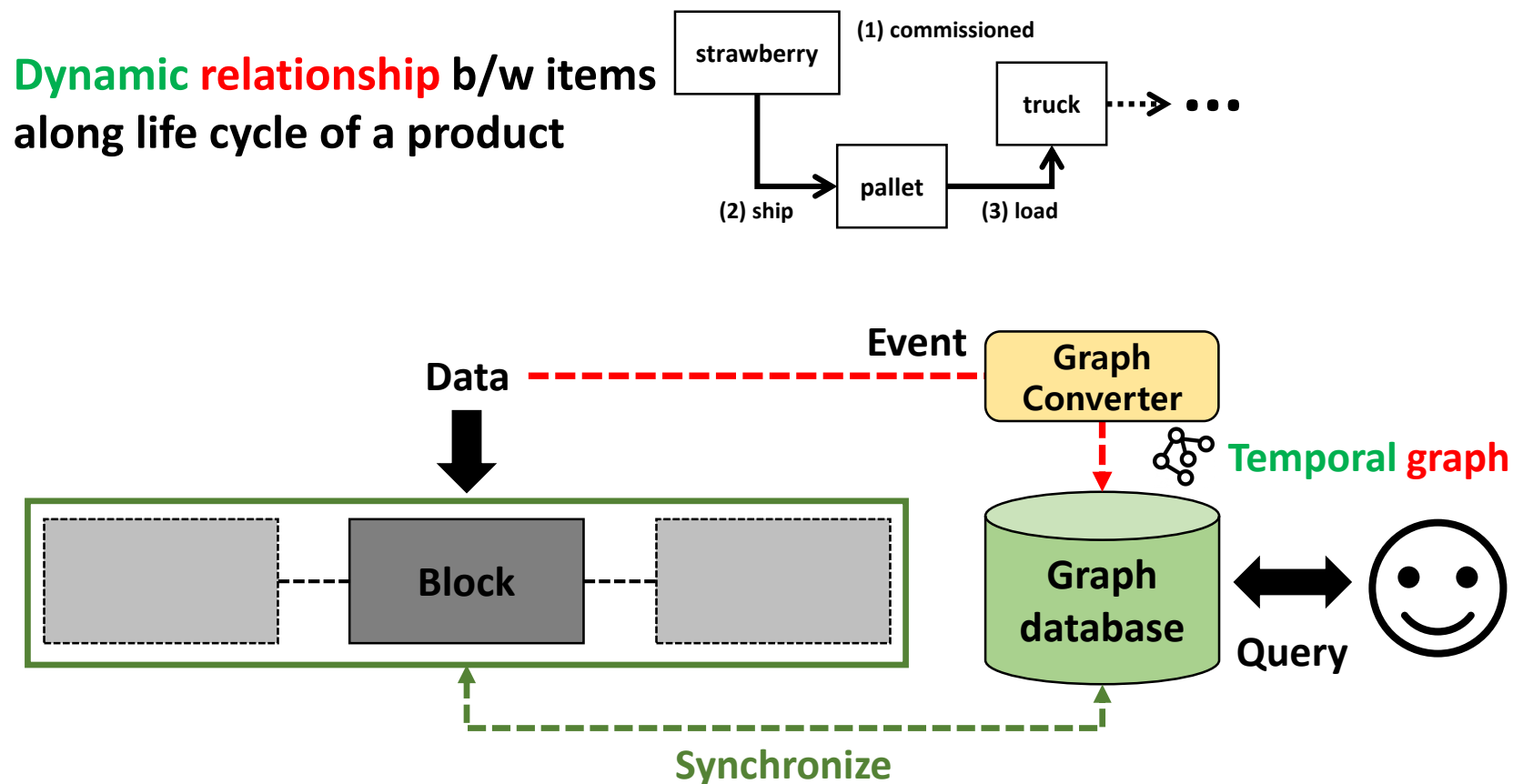
- Current blockchain data model is not adequate for **searching data**





# Graph data model

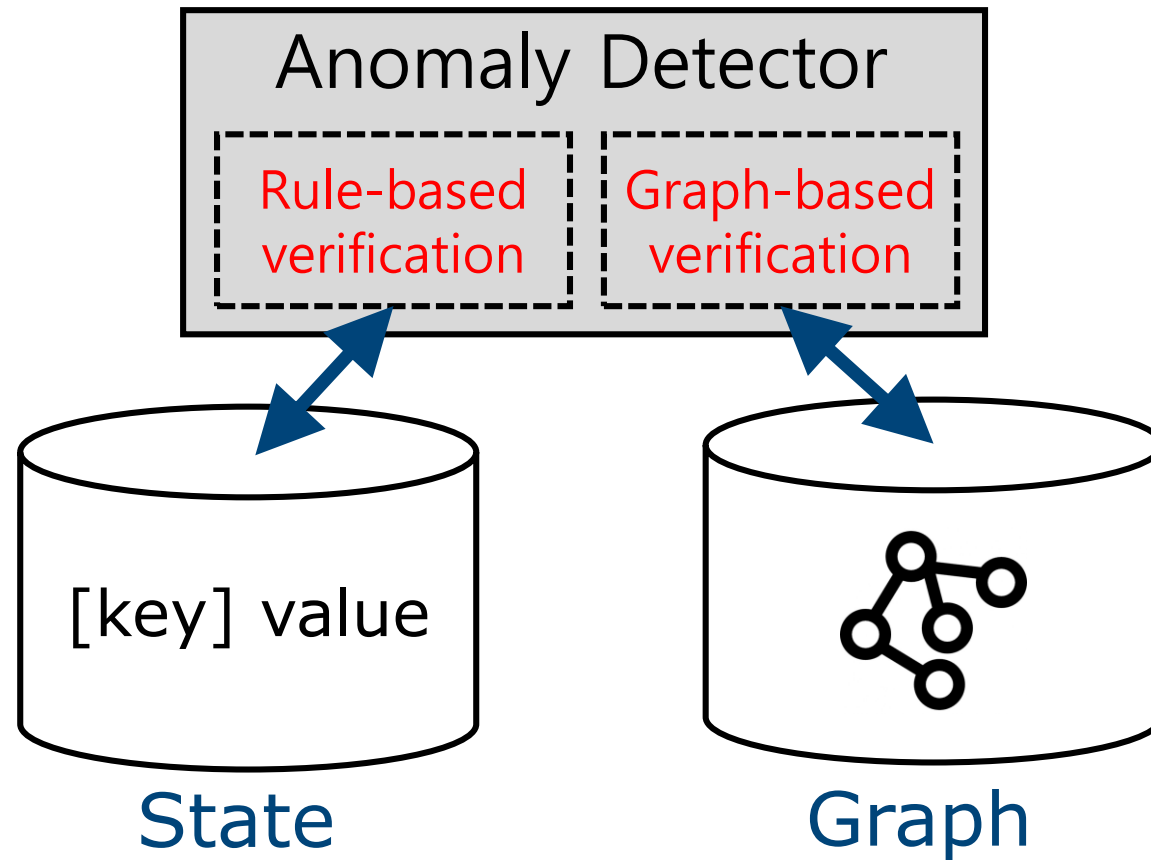
- Main features of supply chain data



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# Verification model overview



# Verification models

- Concept of **consistency conditions** in supply chain borrowed from [Ilic et al., 2009]

- **Rule-based** verification

- Velocity consistency
- Dwell-time consistency



## **Straightforward solution**

1. Configure *threshold* information
2. Inspect **state** to check if the current data is consistent with the *threshold*

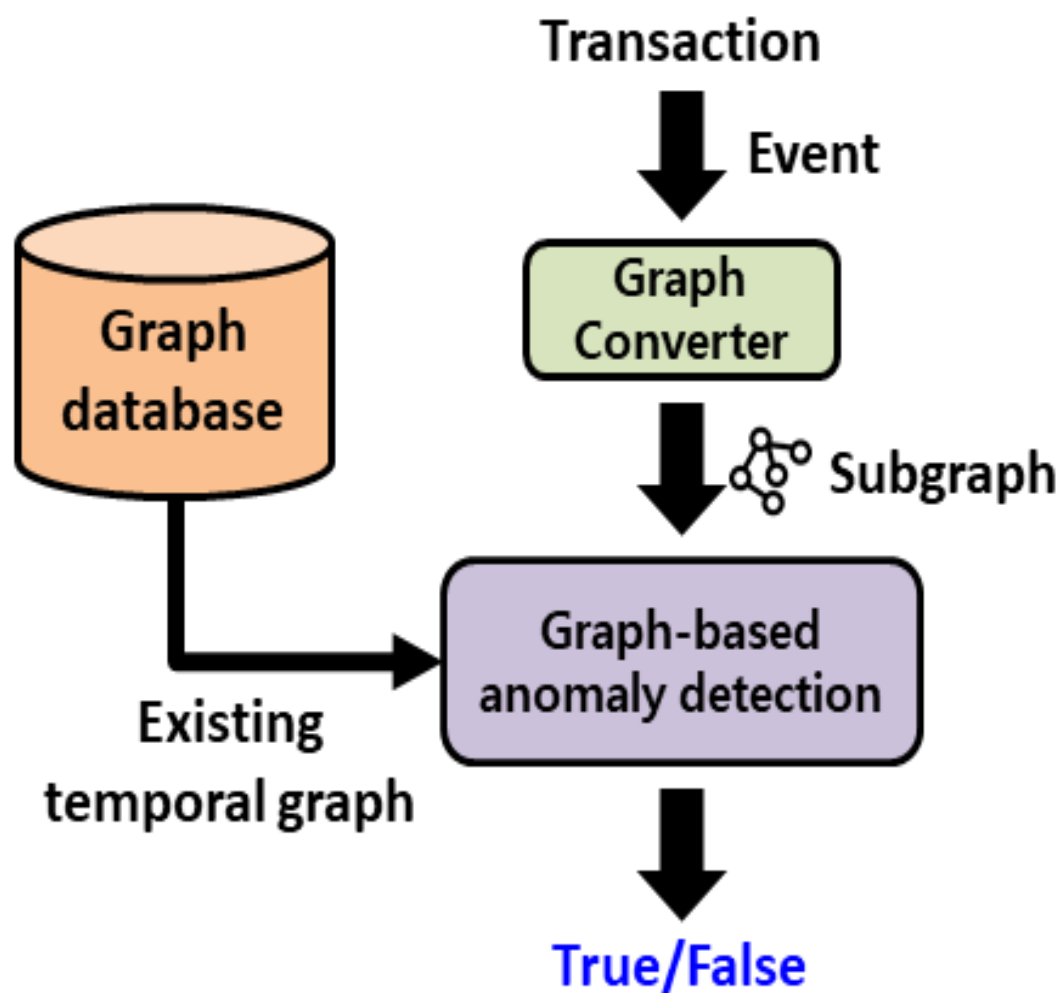
- **Graph-based** verification

- Lifecycle consistency



**Nontrivial!**

# Graph-based verification



## Lifecycle consistency

- Check that **pairwise business steps** are accurately coupled
- Steps:
  - Convert an event to a subgraph
  - Find a matching vertices, traverse through predecessors, and verify the **ordering** sequences

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# Implementation and Evaluation

- Hyperledger Sawtooth
  - Transaction processor that handles **anomaly detection**

- For graph processing, **RDFLib** is used

- RDF object generator, serializer (turtle), and persistence database

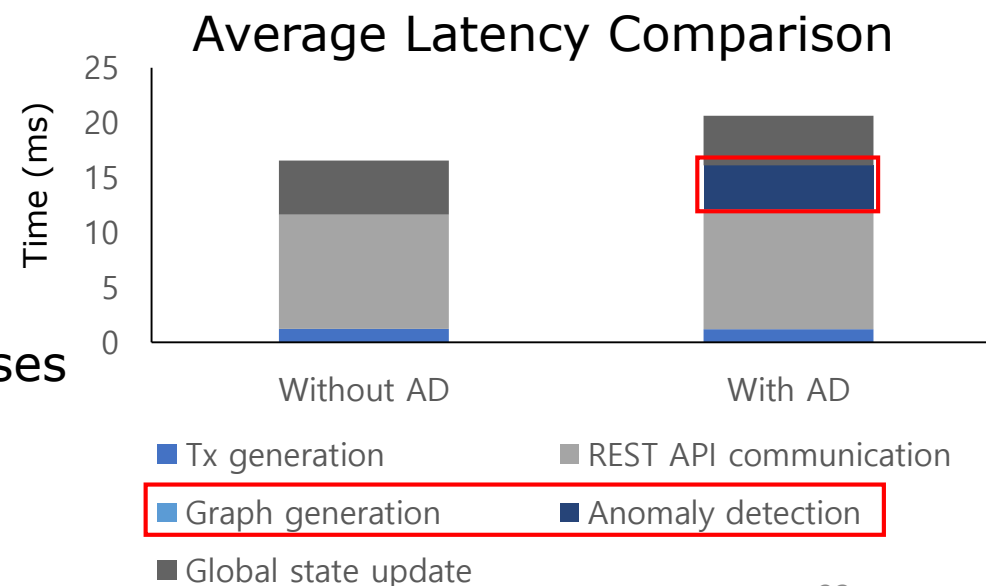
- Scenario-based simulation

- Correctness

- Showed deserialized states and transaction processor logs for both normal and abnormal cases

- Performance overheads

- Compared average latency



# Summary

- Blockchain-based SCM is gaining attentions
- Our focus: robust data model + verification methods
- Data model based on real-world business standards tailored for blockchain
- Anomaly detection with rule-based and graph-based approaches