

# Building Autonomous Networks, One Step at a time (Standards, Research, Prototypes)

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## It' s always the Network Fault, right?

- And not the application?
- And not the server?
- And not the cloud?
- Or the end user environment?



New « network » definition ?

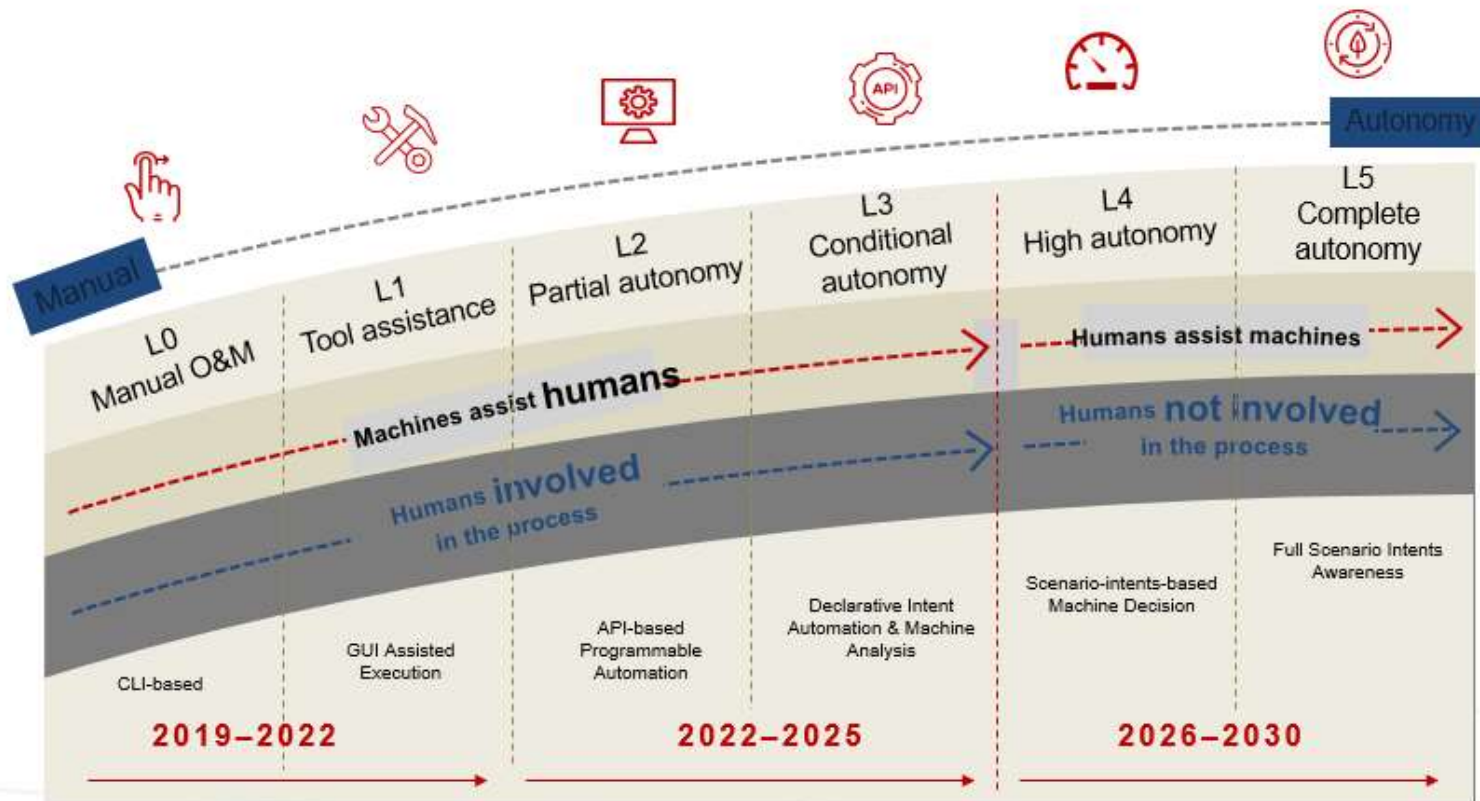
- « Is it my area? »
- The different silo views don't work any longer

## Networks are too Expensive to Operate

The (network) complexity (we loved) is (on the verge of) turning against us

- Business issue: ratio of OPEX/CAPEX
  - Automation is a compulsory transformation
  - Difficulty: multi-vendor, old/new devices, different capabilities
  - « if a feature can't be automated, it doesn't exist! »

# Autonomous Network Vision



# Autonomous (Driving) Network Vision: Where is Industry Today?

**Enterprise** => ?

- Primary focus: reduce IT costs

**Data Center** => 2.5? 3.1?

- Advantages: greenfield, clean topology, single vendor, reduced number of platforms/OS
- Therefore, ML/AI is applicable

**Cloud** => 3 or 3.5?

- Hyperscalers: "if we see a problem twice, we code it"
- Cloud native applications

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|--------------------|------------------------------------|--------------------------------------|---------------------------------|-------------------------------------|------------------------------|------------------------------|
| Execution          | P                                  | P/S                                  | S                               | S                                   | S                            | S                            |
| Awareness          | P                                  | P/S                                  | P/S                             | S                                   | S                            | S                            |
| Analysis           | P                                  | P                                    | P/S                             | P/S                                 | S                            | S                            |
| Decision           | P                                  | P                                    | P                               | P/S                                 | S                            | S                            |
| Intent/Experience* | P                                  | P                                    | P                               | P                                   | P/S                          | S                            |
| Applicability      | N/A                                | Select scenarios                     |                                 |                                     |                              | All scenarios                |

P : People (manual) ; S : Systems (autonomous)

**Service Provider** => 1.5?

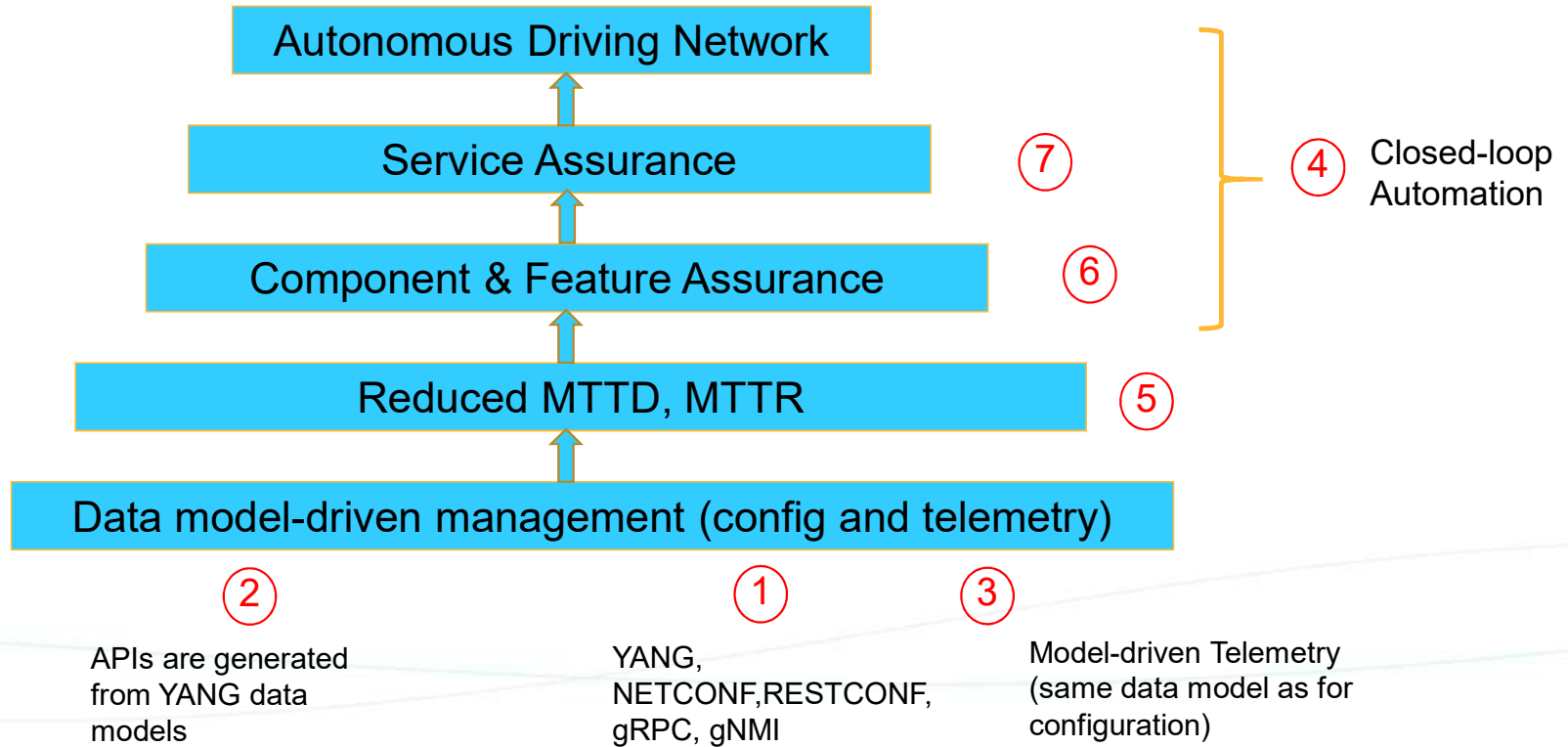
- Most complex scenarios: multi-vendor, old/new devices, silo organization, mixed of core, access, metro, cloud, DC, etc.

**Consumer** => between 1.5 to 2?

- For point product
- Higher with cloud-based solutions

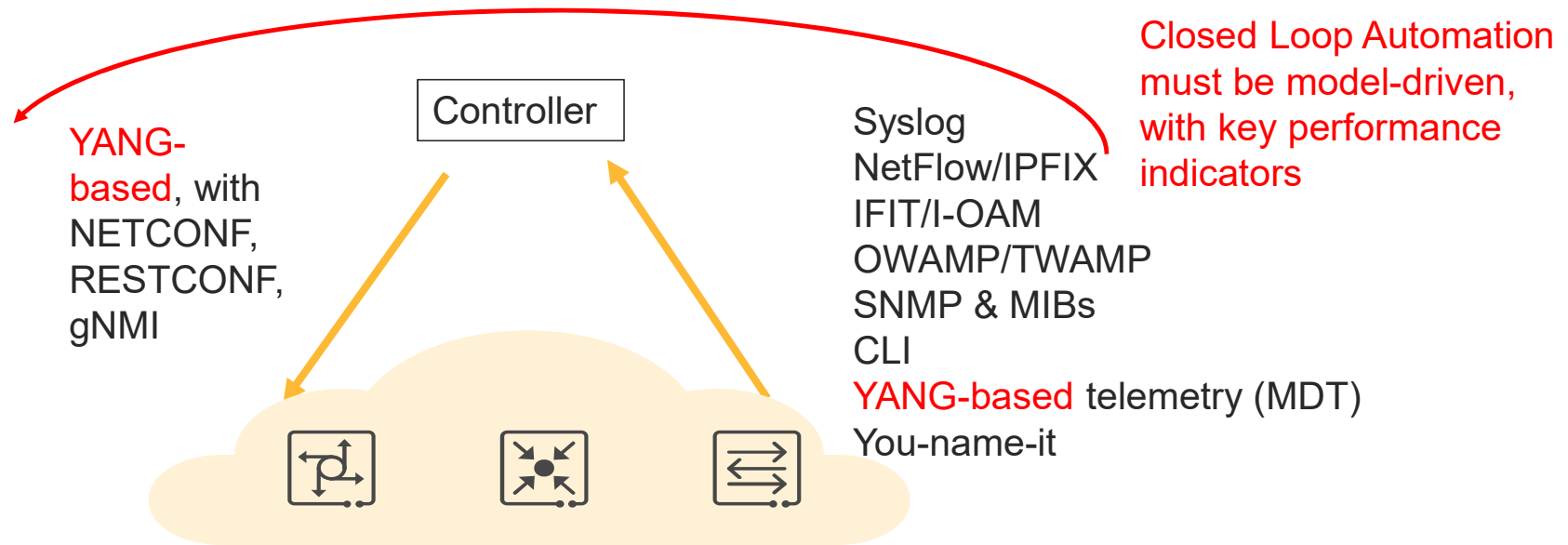
# How to Decompose the Autonomous Network Vision?

## The Maslow Pyramid of Needs for ADN



3

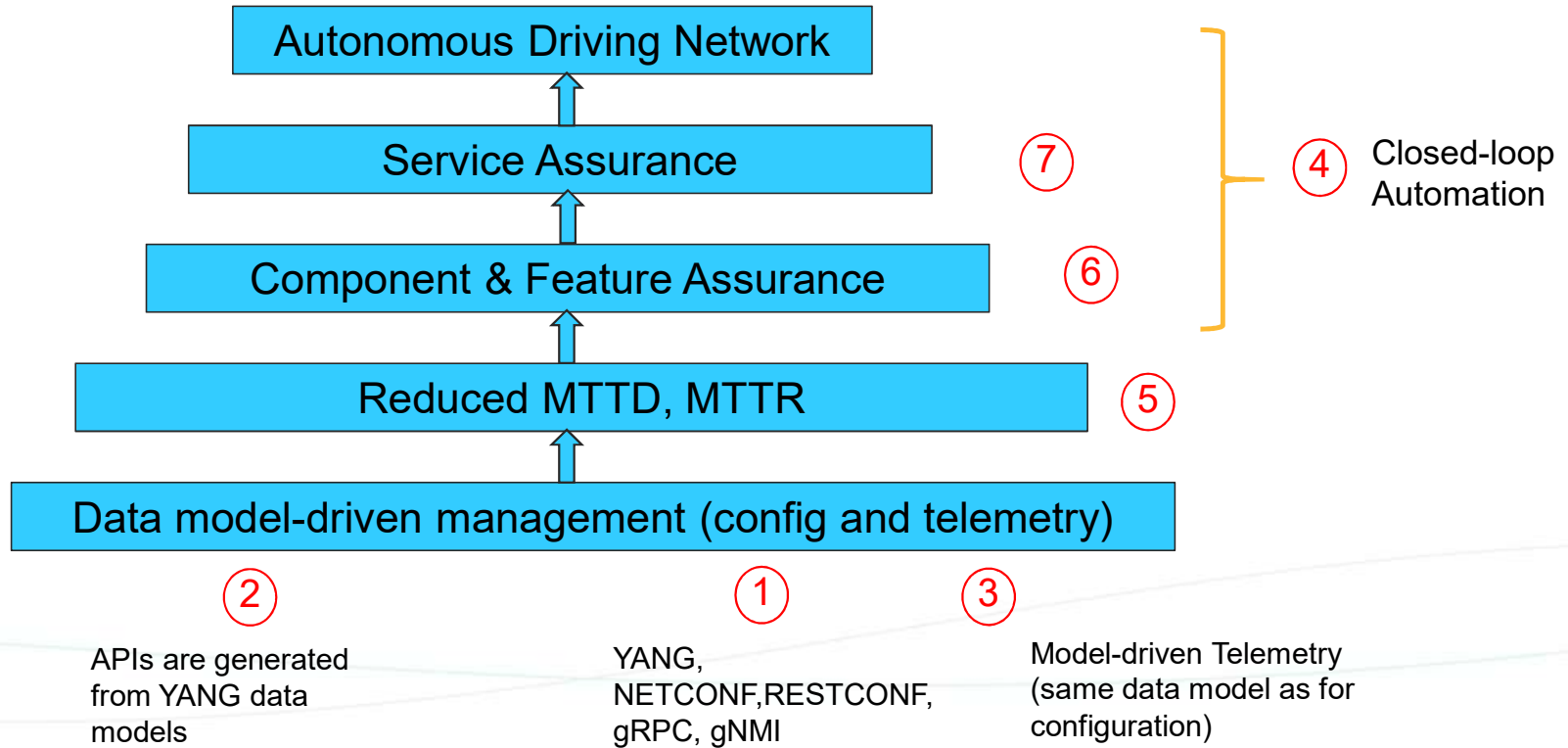
## Model-driven Telemetry



- Autonomous Networks (assurance) needs closed loop automation
- Closed loop automation needs model-driven telemetry ... since the configuration is done with YANG
- It's a question of (avoiding the mappings of different) data models

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## The Maslow Pyramid of Needs for ADN



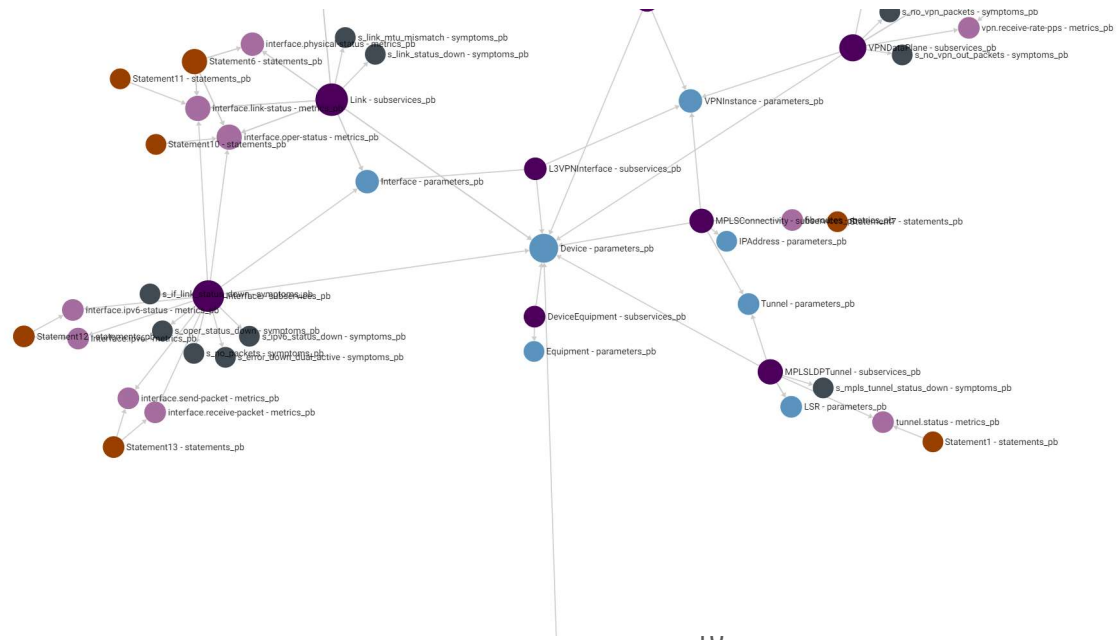




# Knowledge Graph and Digital Maps

- Generate subservice health score and symptoms and service inferred health
  - generated from the network info + domain knowledge
- Digital Maps (part of Digital Twin)
  - Filtered information from this knowledge graph (ex: physical view)
  - Filtered instances (ex: service view)

Digital Maps:  
6. ...  
5. Service SLA  
4. Service  
3. Overlay  
2. Underlay  
1. Physical



# Service Assurance for Intent-based Networking: Architecture

- ✓ Flexible architecture
  - › Physical and virtual devices
  - › Multi-vendor
  - › Multi-domains (interconnected)
- ✓ IETF specifications, with clear interfaces:
  - › Service Assurance for Intent-based Networking Architecture : [draft-ietf-opsawg-service-assurance-architecture](#)
  - › YANG Module for Service Assurance: [draft-ietf-opsawg-service-assurance-yang](#)
- ✓ Prototype
- ✓ Community:
  - › Opensource code (Liège university) & tools
  - › Working with operators

# Standards (IETF) and TMF Levels

| Autonomous Levels  | L0:<br>Manual<br>Operation &<br>Maintenance | L1:<br>Assisted<br>Operation &<br>Maintenance | L2:<br>Partial<br>Autonomous<br>Networks | L3:<br>Conditional<br>Autonomous<br>Networks | L4:<br>High<br>Autonomous<br>Networks | L5:<br>Full<br>Autonomous<br>Networks |
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Awareness: Required for L1+, Barrier for L3

### Per-node capability discovery

- YANG Modules describing Capabilities for Systems and Datastore Update Notifications, [RFC 9196](#)
  - YANG Instance Data File Format, [RFC 9195](#)
- => EXPOSING ROUTERS CAPABILITIES DURING DESIGN AND IMPLEMENTATION TIMES
- Per-Node Capabilities for Optimum Operational Data Collection , [draft-claise-netconf-metadata-for-collection-02](#)
- => NEED A GENERIC CAPABILITY DISCOVERY MECHANISM

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Awareness: Required for L1+, Barrier for L3  
 Execution: Required for L1+, Barrier for L2

Semantic versioning

- YANG Semantic Versioning, [draft-ietf-netmod-yang-semver](#)

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Awareness: Required for L1+, Barrier for L3 (??)

Streaming counters with UDP notification

- [draft-ietf-netconf-udp-notif](#)

Subscription to Distributed Notificaitons

- [draft-ietf-netconf-distributed-notif](#)

Awareness: Required for L1+, Barrier for L3  
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- YANG Instance Data File Format, [draft-ietf-netmod-yang-instance-file-format-08](#)
- Per-Node Capabilities for Optimum Operational Data Collection , [draft-claise-netconf-metadata-for-collection-01](#)

=> NEED A GENERIC DISCOVERY MECHANISM

# Standards (IETF)

Expression language for operation workflow, data lake query, and actionable symptoms

Analysis: Required for L2+, Barrier for L4  
 Decision: Required for L3+, Barrier for L4  
 Intent/Experience: Required for L1+, Barrier for L4

**Intent Assurance**

- Service Assurance for Intent-based Networking Architecture, [draft-ietf-opsawg-service-assurance-architecture](#)
- YANG Module for Service Assurance, [draft-ietf-opsawg-service-assurance-yang](#)

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 Decision: Required for L3+, Barrier for L4  
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Awareness: Required for L1+, Barrier for L3 (??)

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=> NEED A GENERIC DISCOVERY MECHANISM



# More Visibility: Data Plane (IPFIX), Control Plane (BMP), Management Plane (YANG)

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- **SRv6 IPFIX Information Elements,**  
[draft-tgraf-opsawg-ipfix-srv6-srh-02](#)  
=> DATA PLANE VISIBILITY
- **BMP YANG module**  
[draft-cptb-grow-bmp-yang](#)  
=> CONTROL PLANE VISIBILITY

**Data manifest for Contextualized Telemetry Data**  
[draft-claise-opsawg-collected-data-manifest-02](#),  
=> HOW THE DATA WERE ACTUALLY MEASURED  
USEFULL IN ORDER TO TAKE A DECISION

# Where is ML/AI in this ADN Story?

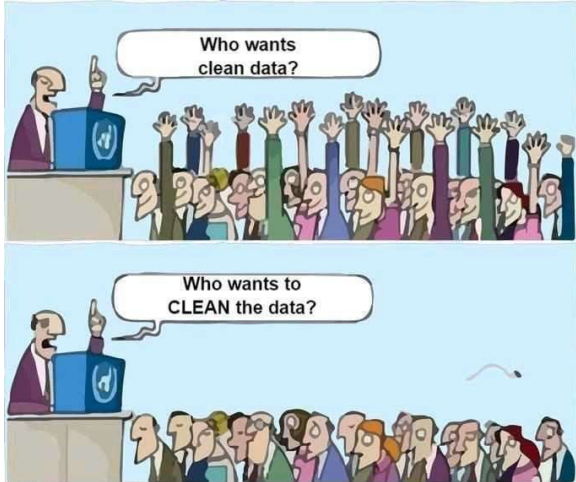
## Problem 1: Getting data

- Data scientist needs data
- A lot of data
- Real time data
- High frequency data

This is not easy to stream all counters & state from networks ... and to process them close to real-time

## Problem 2: clean data

- Clear semantic
- Labeled data



## Problem 3: no intent context

- “Spent 2 years doing ML/AI for assurance and we need to start again with structured data to model the network. It cannot be achieved without intent context”  
=> Unsupervised learning helps but is not sufficient!
- “We looked at IBM Watson: these are the best ML/AI tools but it doesn’t apply to telcos”

# Full ML/AI Power on top Assurance Graph and Expert Knowledge

Input 1: Getting data

Input 2: clean data

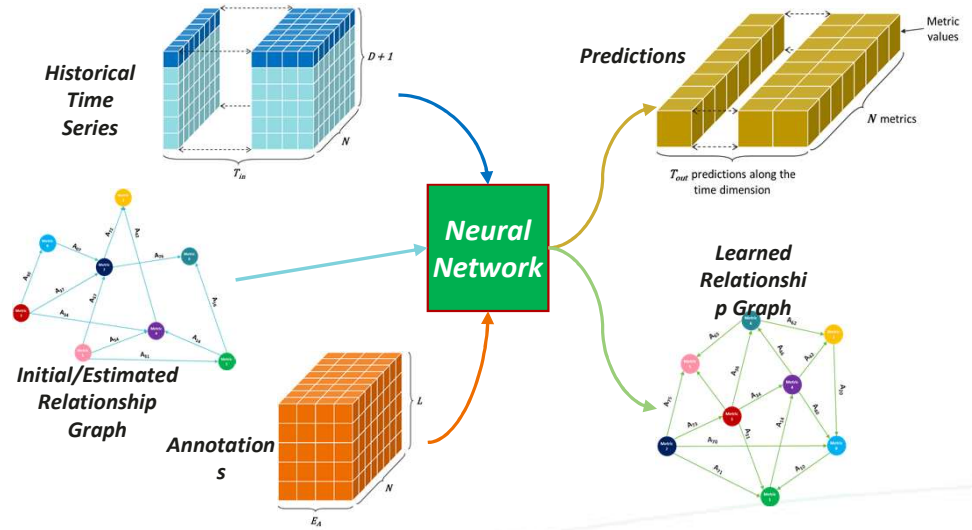
Problem 3: intent context

Key metrics to look at, per subservice type, with a clear semantic (based on YANG modules)

Assurance graph

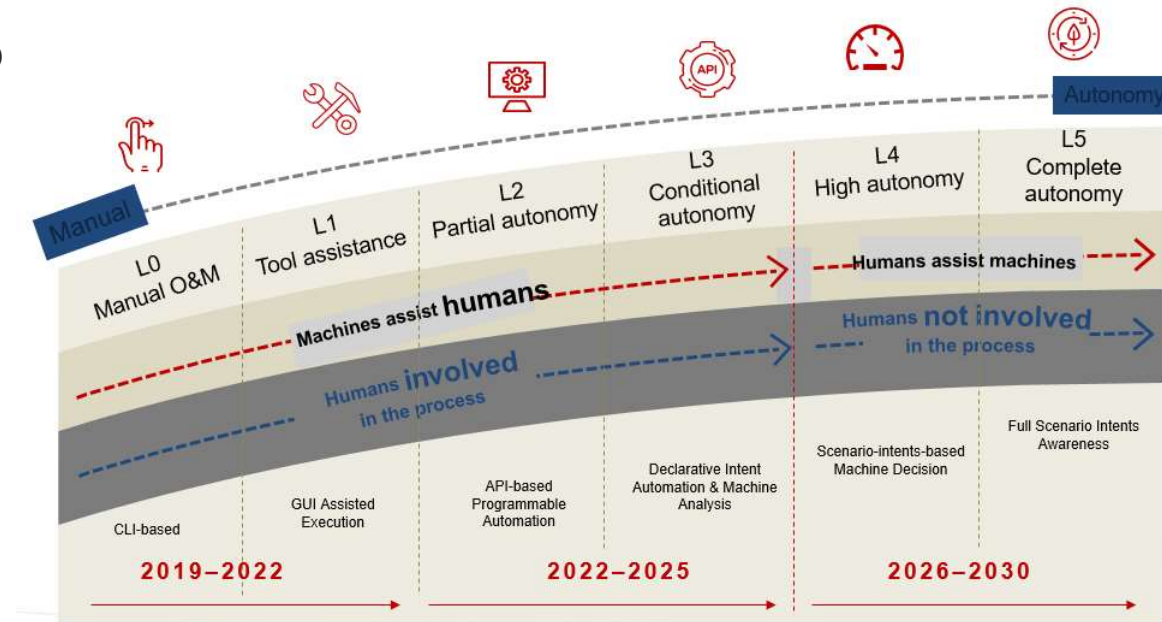
Help create or improve the expert knowledge:

1. Discover new impacting KPI for a subservice health
2. Combined with the real SLA measurements, deduce the weight/impact of each KPI in a subservice expression
3. Anomaly score based on the feature in the time series
4. Learn an initial relationship graph
5. Unsupervised learning might provide interesting symptoms



# Conclusions

- How to simplify operations? How to make our equipments/products easier to manage?
- Decomposing the ADN vision into:
  - Research & Prototype
  - Standard
  - Product Implementation
- Starting with the Service Assurance for Intent-based Networking architecture
- Contact me
  - For interesting research topics
  - For more details





Thank You.