



# Machinery With Longevity - How Condition-Based Maintenance (CBM) Is Transforming Industries

Dr. Clifton Phua  
Director of Analytics  
NCS Digital

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# Agenda

- Introduction
- Condition-Based Maintenance (CBM)
- Escalator CBM
- Train CBM
- Conclusion

# NCS Data Scientist Team



**>30 Data Scientists**

Ph.D., Masters, Bachelors



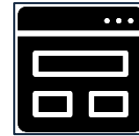
**Data Science Skills**

Anomaly detection, time series analysis, text analytics, optimisation etc



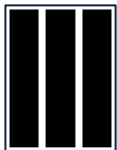
**Cross-Disciplinary Team**

Statistics, Machine Learning, Computer Science, Engineering, Business, Psychology



**Software Competencies**

R (e.g. H2O), Python (e.g. TensorFlow), SAS, SPSS, Watson



**Cross-Industry Projects**

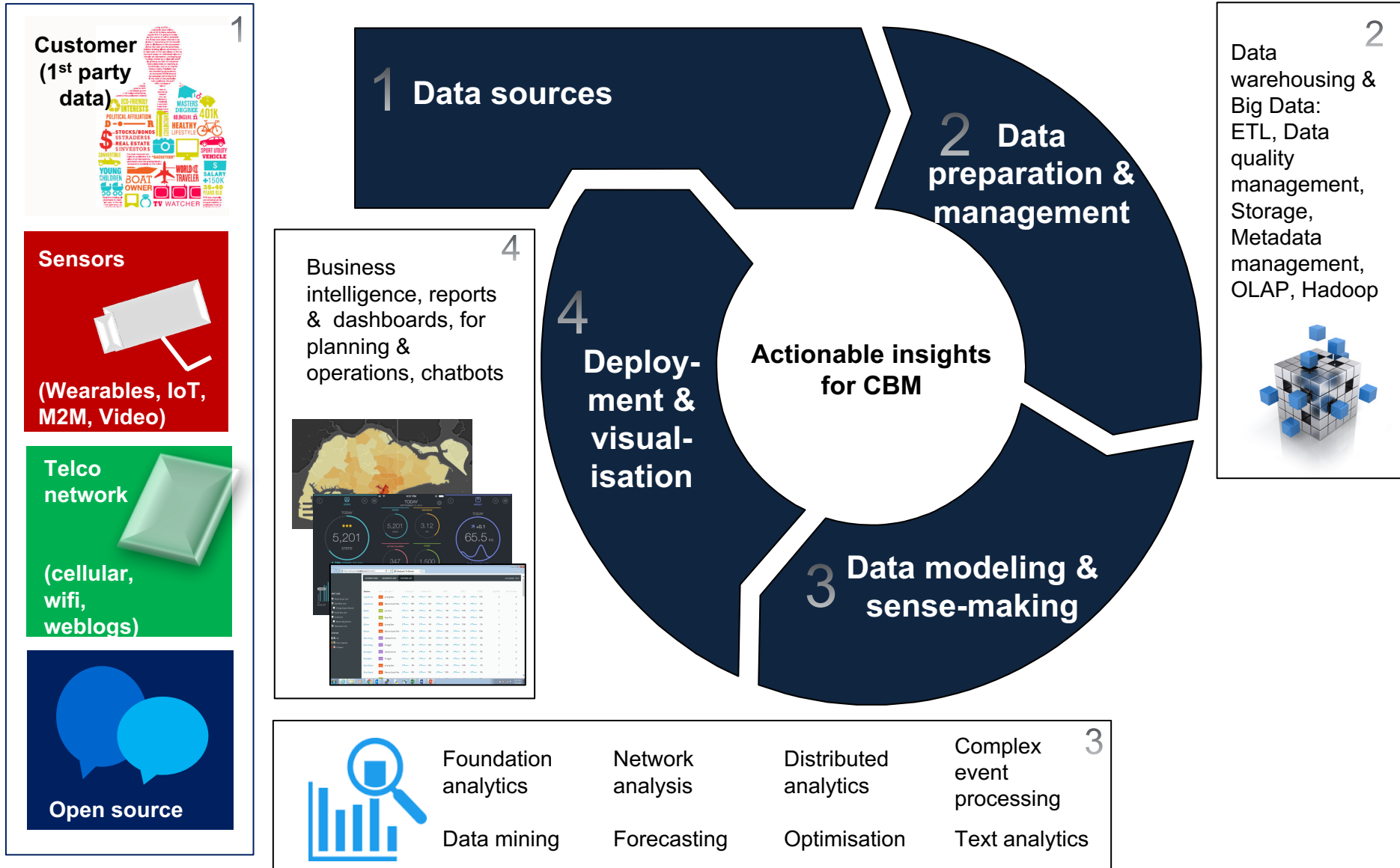
Transport, Defence, Public Safety, Education, Healthcare, Commercial, FSI etc



**Completed Meaningful / Iconic Projects**

Since January 2015

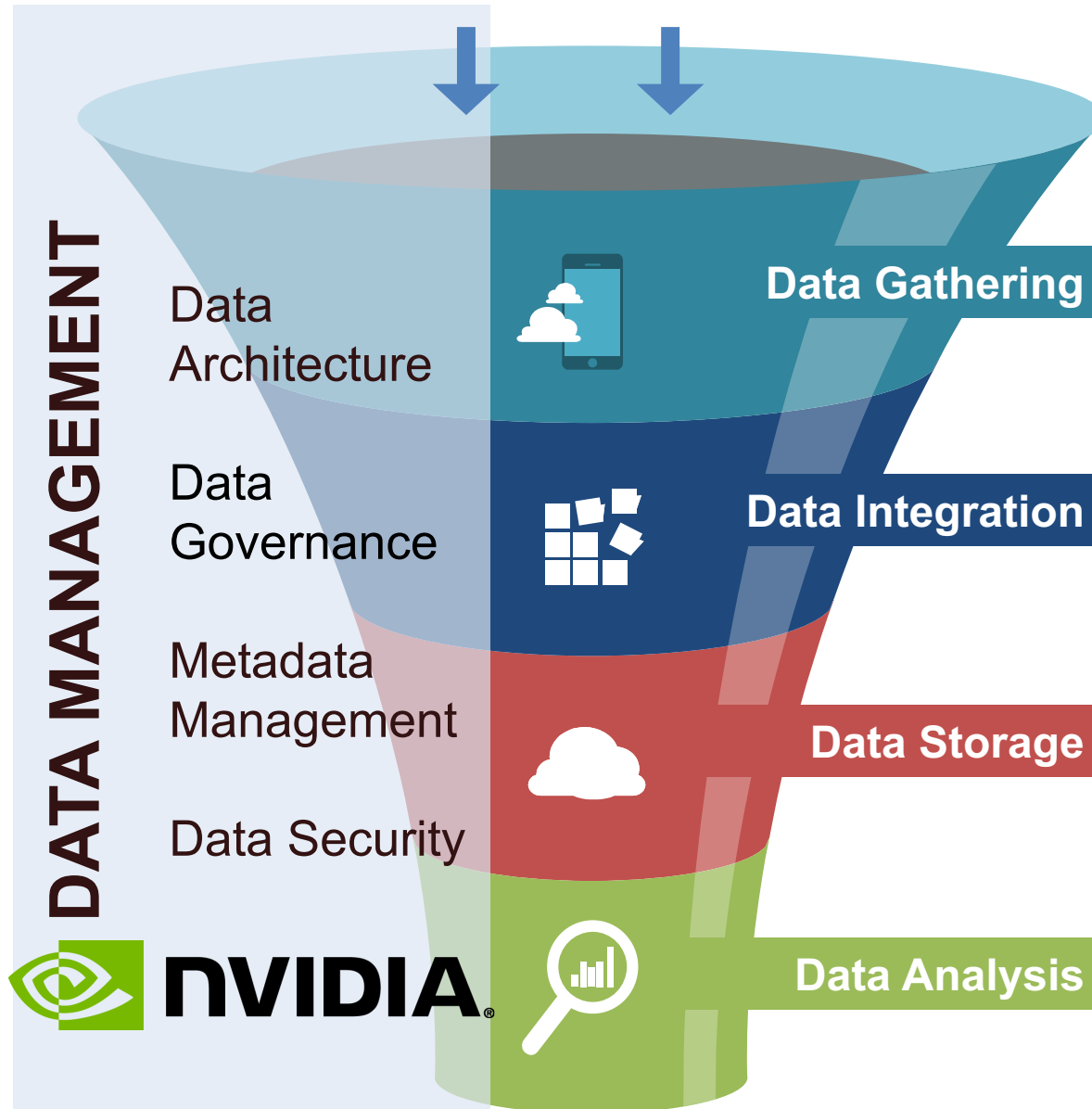
# NCS End-to-End Data Science Coverage





## Condition-Based Maintenance (CBM)

# CBM Platform





## Escalator CBM

# Escalator Maintenance Challenges

- Frequent escalator incidents
  - Breakdowns or service interruptions
  - Trapped or even injured passengers
- Escalator data availability issues
  - Sensor data collected in near real-time but belongs to third party
  - Escalator fault and bio data are augmented with building-related data
- Escalator design complexity and significant resource constraints





## Train CBM

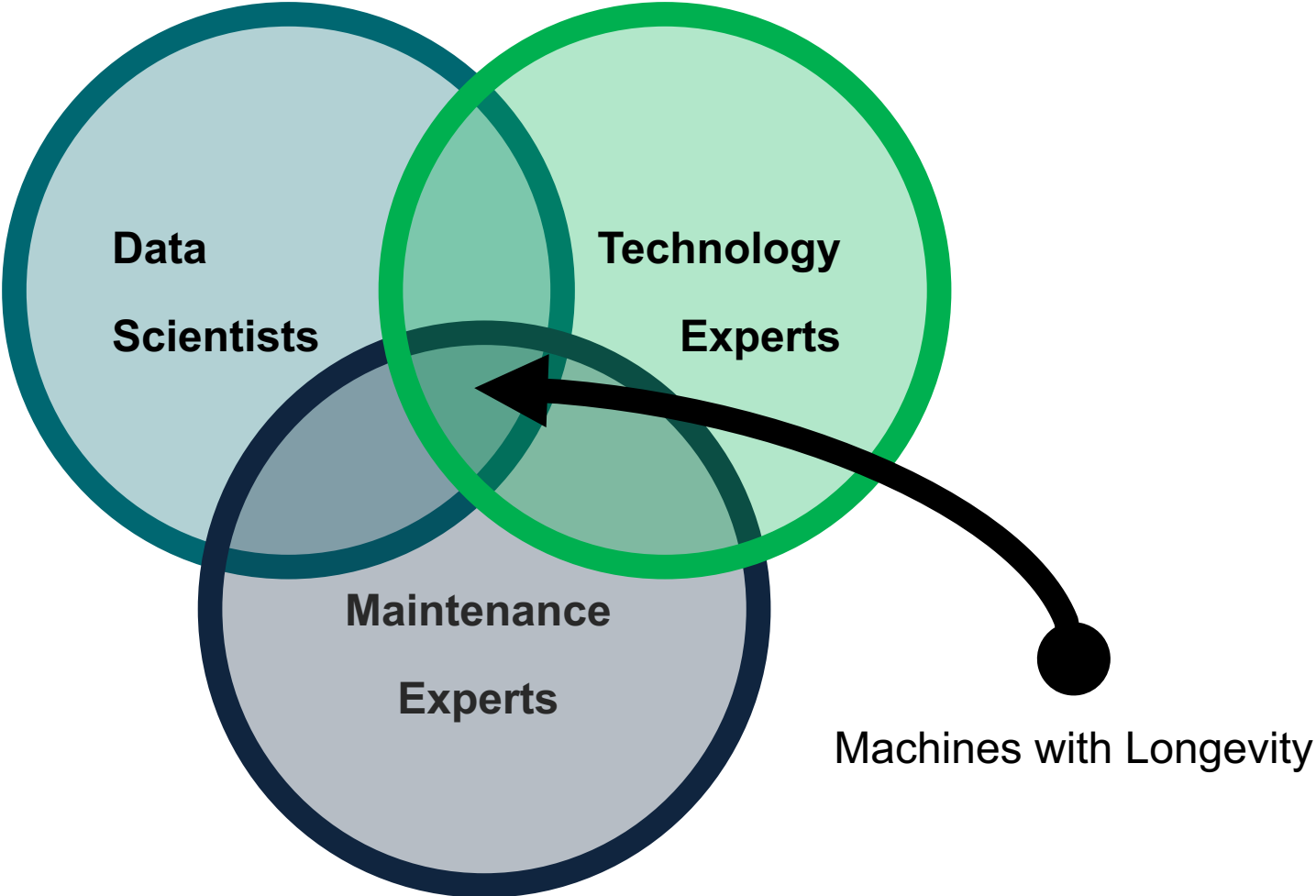
# Rolling Stock Maintenance Challenges

- Minimal capabilities for real-time monitoring of rolling stock
  - Currently doing breakdown maintenance (which is reactive) and preventive maintenance (which is limited by maintenance schedule)
  - Sensor data transmission may be an issue
- Difficulty to troubleshoot issues due to rolling stock design complexity
  - Multiple train variants
  - Not sure if diagnostic, fault and workshop data is all available and of good quality
- Significant resource constraints
  - High rolling stock utilization
  - Maintenance crew and depot unavailability
  - Spare part unavailability

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# How to be Successful in CBM?





# Questions?

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[clifton@ncs.com.sg](mailto:clifton@ncs.com.sg)

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 **ncs**  
making IT happen