



# Spatiotemporal Pattern Detection in Power Distribution Networks : From Data to Knowledge

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**EATON**

*Powering Business Worldwide*



# Flashback



## Major power outage hits New York, other large cities

Thursday, August 14, 2003 Posted: 11:45 PM EDT (0345 GMT)

**NEW YORK (CNN) -- Power began to flicker on late Thursday evening, hours after a major power outage struck simultaneously across dozens of cities in the eastern United States and Canada.**

The outage occurred quickly and rippled across a large area. Cities affected included New York, Cleveland, Ohio, Detroit, Michigan, and Toronto and Ottawa, Canada.

In just three minutes, starting at 4:10 p.m., 21 power plants shut down, according to Genscape, a company that monitors the output of power plants.



- ❑ Millions of houses affected
- ❑ Hundreds of flights canceled
- ❑ Nuclear power plants in two states shut down

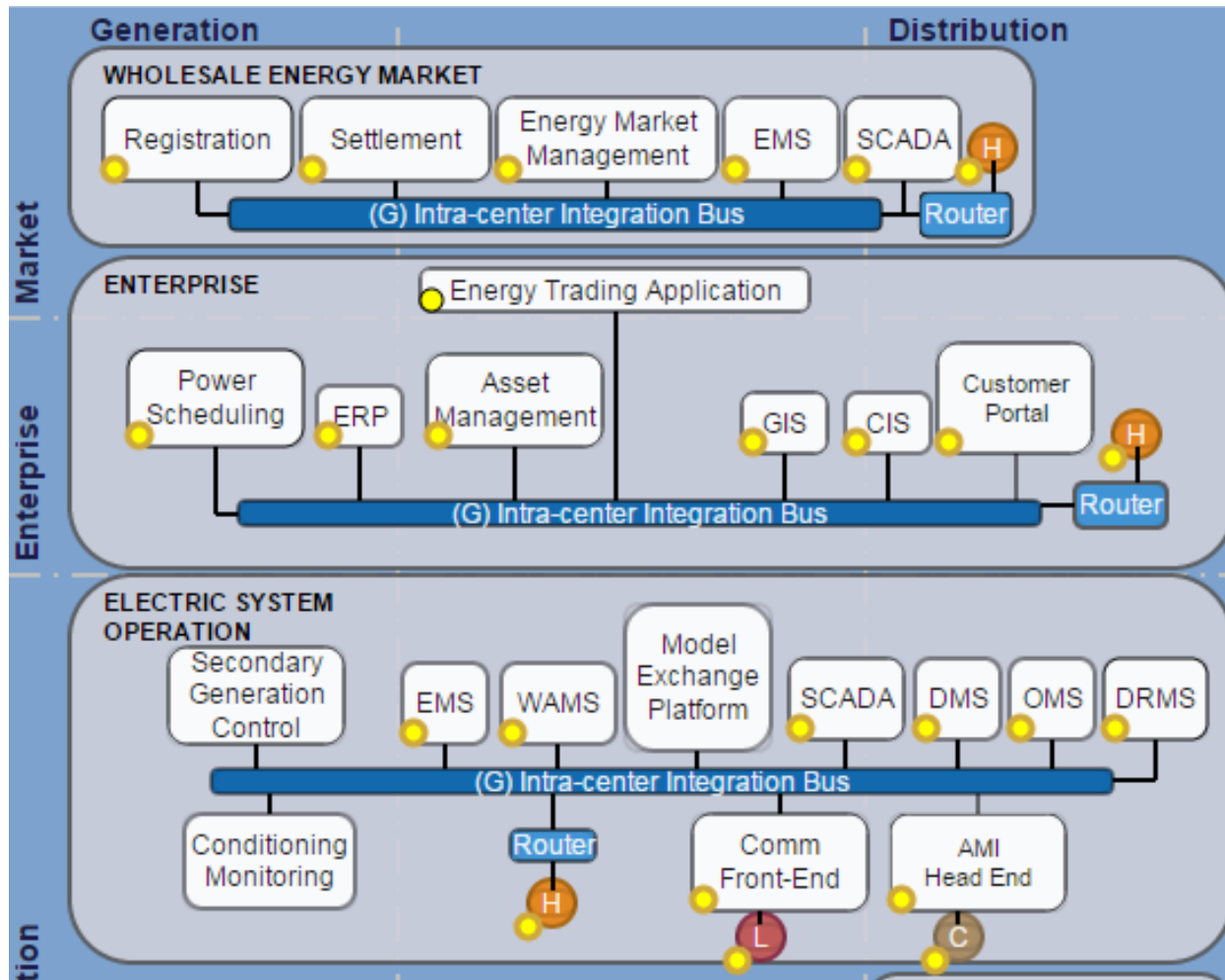
# Reasons

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## Electric Power Research Institute (EPRI) :

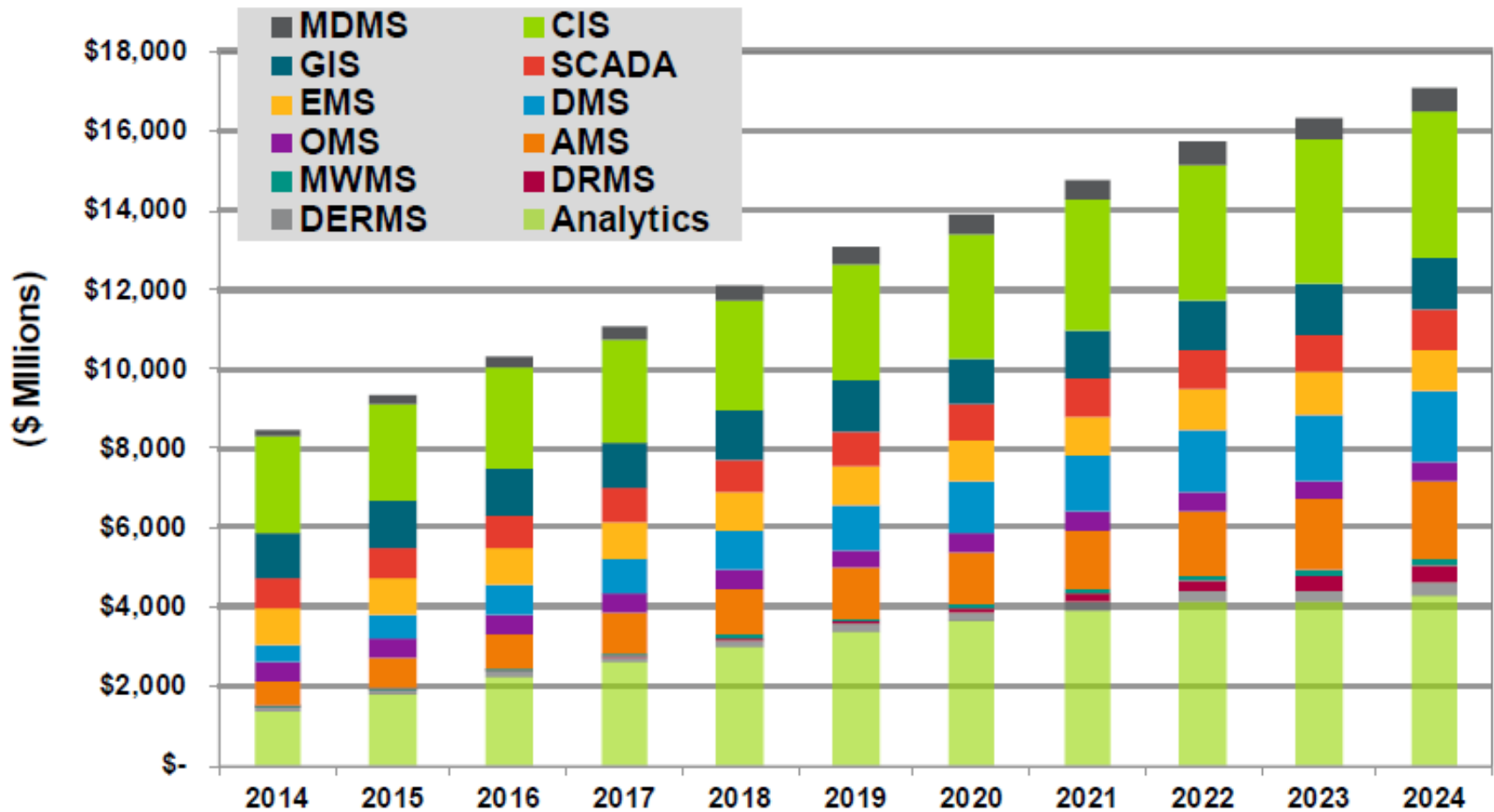
- ❑ Lack of real-time regional and interconnection-wide power flow models for anticipating changing flow patterns and the formation of new bottlenecks.
- ❑ Insufficient “visibility” of power flow conditions over the entire region, coupled with inadequate coordination, control and communication of the power system on a regional basis. That information is flowing from 27 distribution feeds, eight re-closure or safety switches and 4,192 transformers.
- ❑ Insufficient understanding of the potential impact on August 14, 2003 of new power flow patterns caused by increased wholesale power transfers resulting from industry restructuring.

# The IEC Smart Grid Standard Map



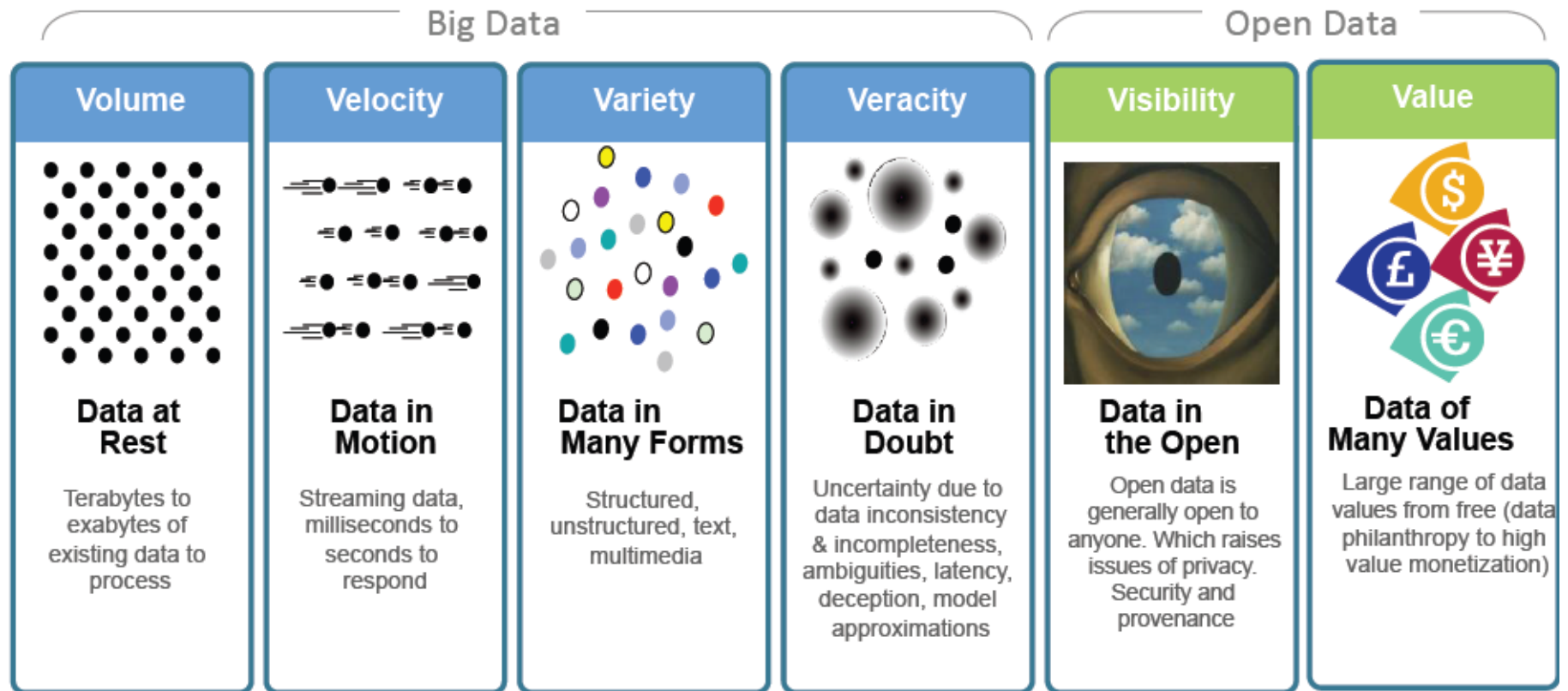
<http://smartgridstandardsmap.com/>

# Smart Grid IT Spending by Application, World Markets: 2014-2024



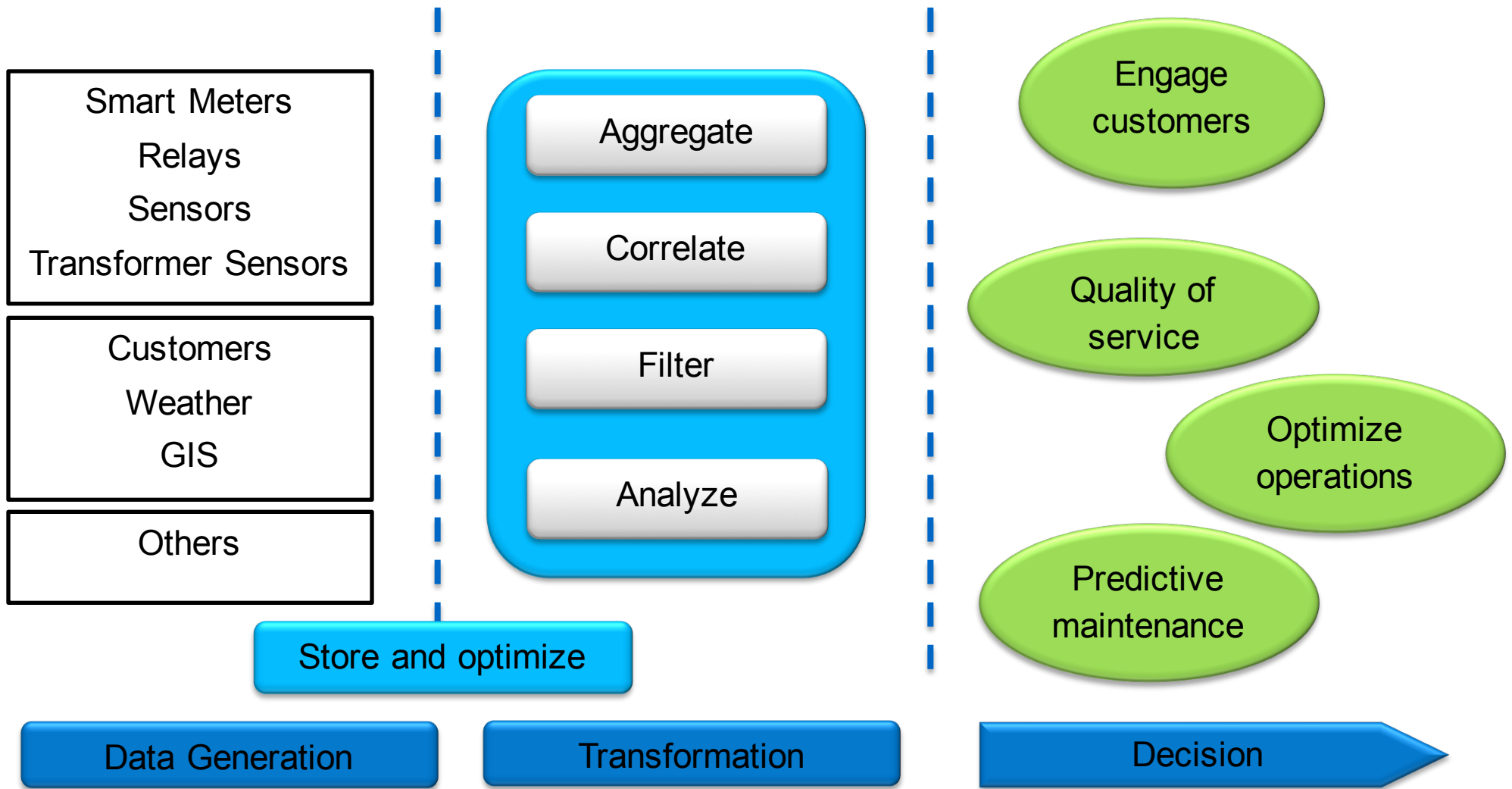
Source : Navigant Research Q4 2016

# What is « this » Big Data?



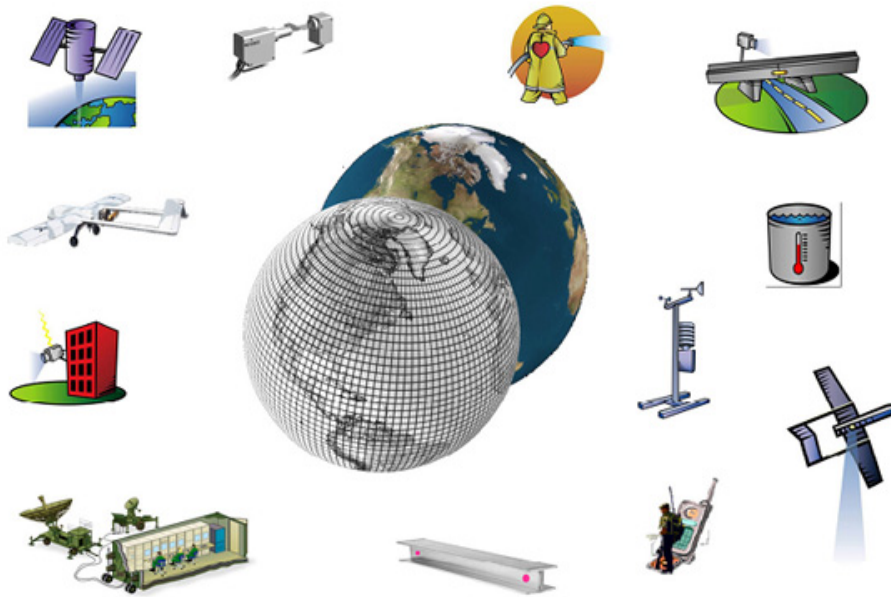
**‘Big data’** is defined by IBM as any data that cannot be captured, managed and/or processed using traditional data management components and techniques

# Why Big Data?



# Data transformation: “event processing”

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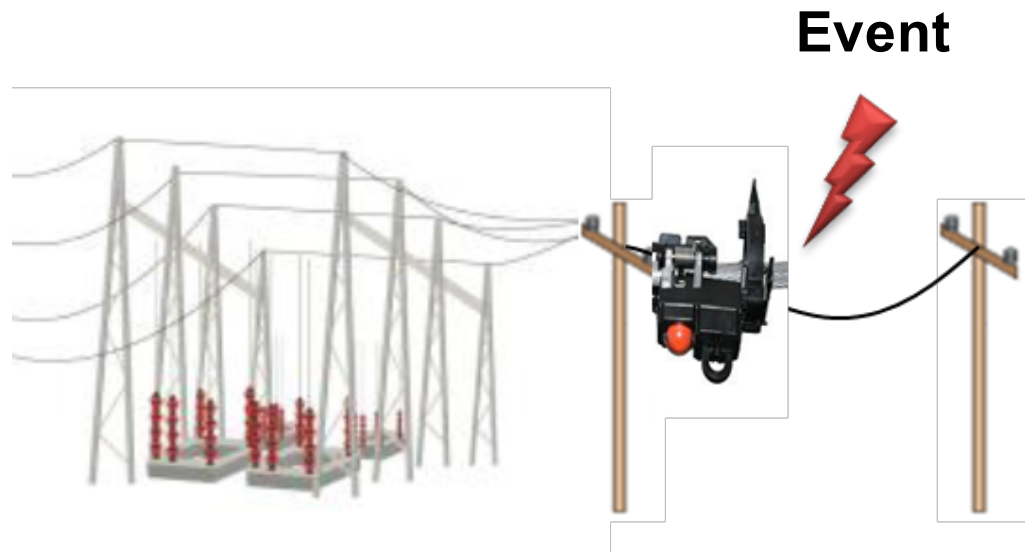
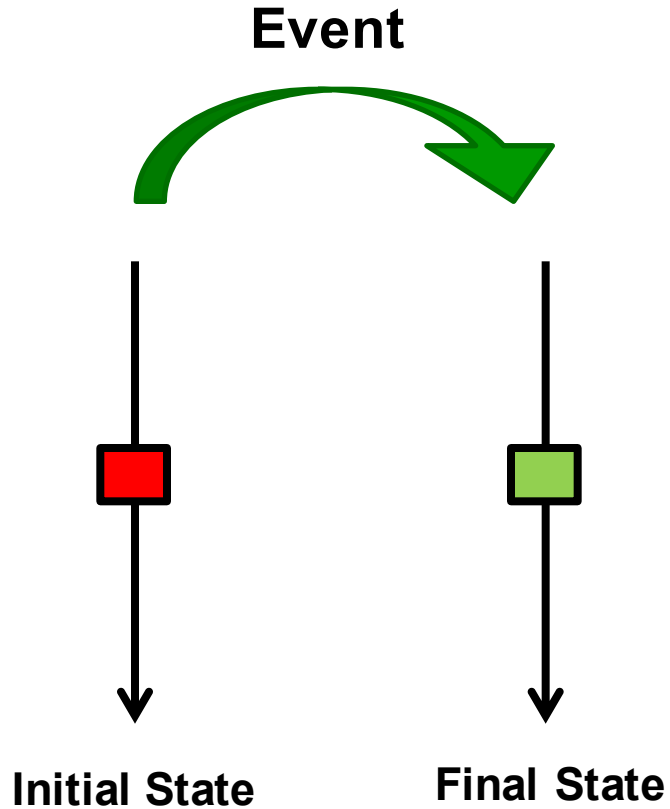
*Event processing stands for a set of techniques, languages and tools to collect, analyze and interpret event streams.*

- Speedy actions
- High volume of input events
- Analyze, decide and ACT!



# What is an Event?

- *“An Event is something that happens”*



# Events from a Smart Sensor

Signal	▲	Current Value	Previous Value	Scale	Offset	Reported	Last Update Time
BatteryVoltage	▼	0	0	0.001	0	<input checked="" type="checkbox"/>	
ChargeCircuitryEnabled	▼	0	0	1	0	<input checked="" type="checkbox"/>	
DeviceTemperature	▼	0	0	0.01	0	<input checked="" type="checkbox"/>	
Fault	▼	0	0	1	0	<input checked="" type="checkbox"/>	
MomentaryOutage24hCount	▼	0	0	1	0	<input checked="" type="checkbox"/>	
NominalCurrent	▼	0	0	1	0	<input checked="" type="checkbox"/>	
OverCurrent	▼	0	0	1	0	<input checked="" type="checkbox"/>	
PeakCurrent	▼	0	0	1	0	<input checked="" type="checkbox"/>	
Power	▼	0	0	1			
SampledCurrent	▼	0	0	1			

```

=>EVE 2 L
2 01/27/14 17:44:20.296 TRIG 100 0 59.99 1 2
eventInfo64=130353182602960000
eventTime=1390844660 296
eventAscii=01/27/14 17:44:20.296 +0
EVE 2 L

Relay ABC          Date: 01/27/14    Time: 17:44:20.296
Station XYZ

FID=SEL-351-7-R312-V0-Z005005-D20030714      CID=3057

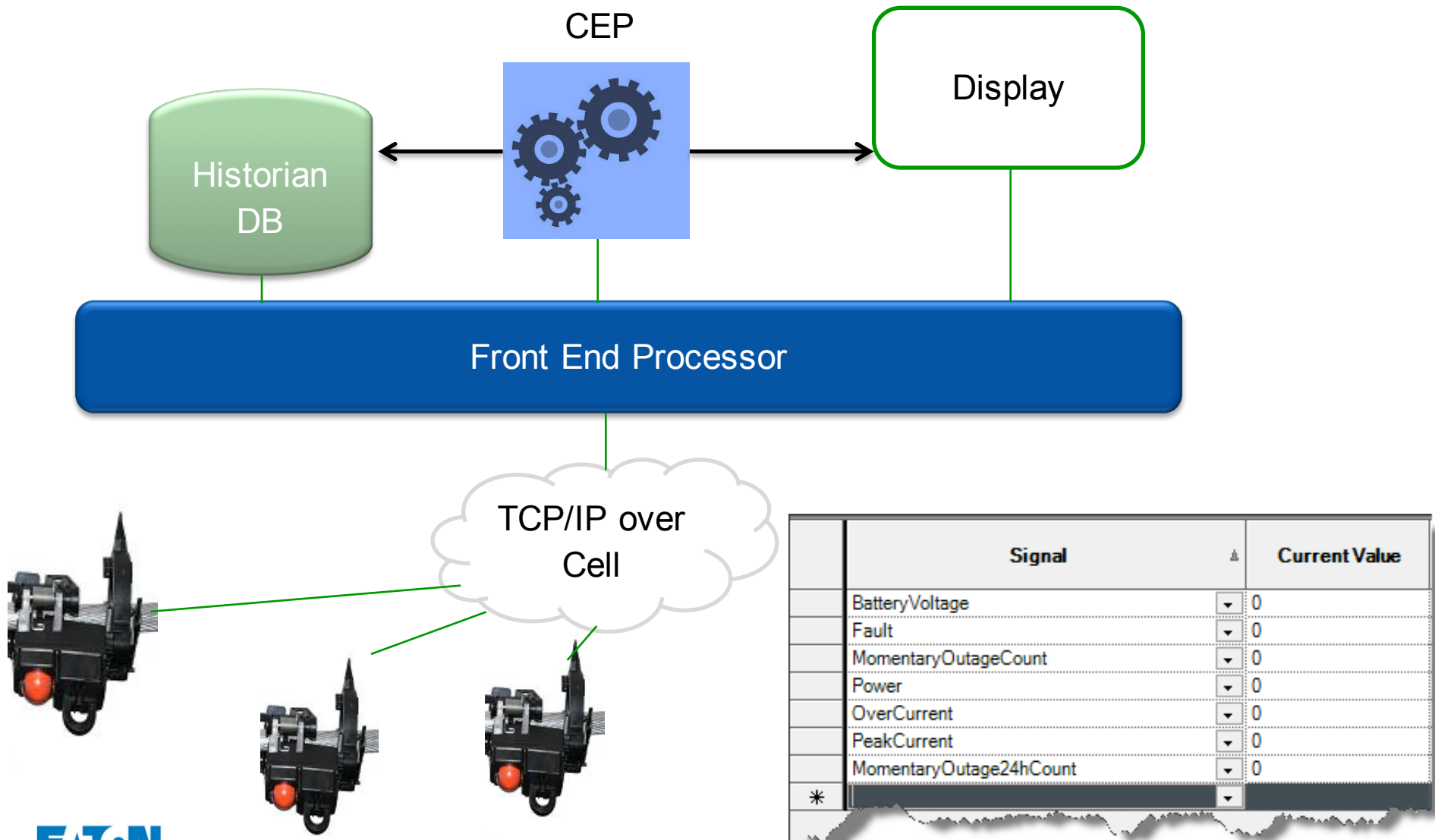
                                Out In
                                1357 135
                                Vdc Freq 246A 246
Currents (Amps Pri)           Voltages (kV Pri)
IA  IB  IC  IN  IG  VAB  VBC  VCA  VS
[1]
-0.31 -0.14 -0.40 -0.00 -0.84 0.000 0.000 0.000 0.000 0 60.00 ....
-0.25 -0.37 -0.04 0.05 -0.66 0.000 0.000 0.000 -0.003 -0 60.00 ....
0.62 0.18 0.14 -0.01 0.95 -0.003 0.000 0.003 -0.003 -0 60.00 ....
-0.23 0.02 0.30 -0.05 0.09 -0.003 0.000 0.003 0.000 0 60.00*....

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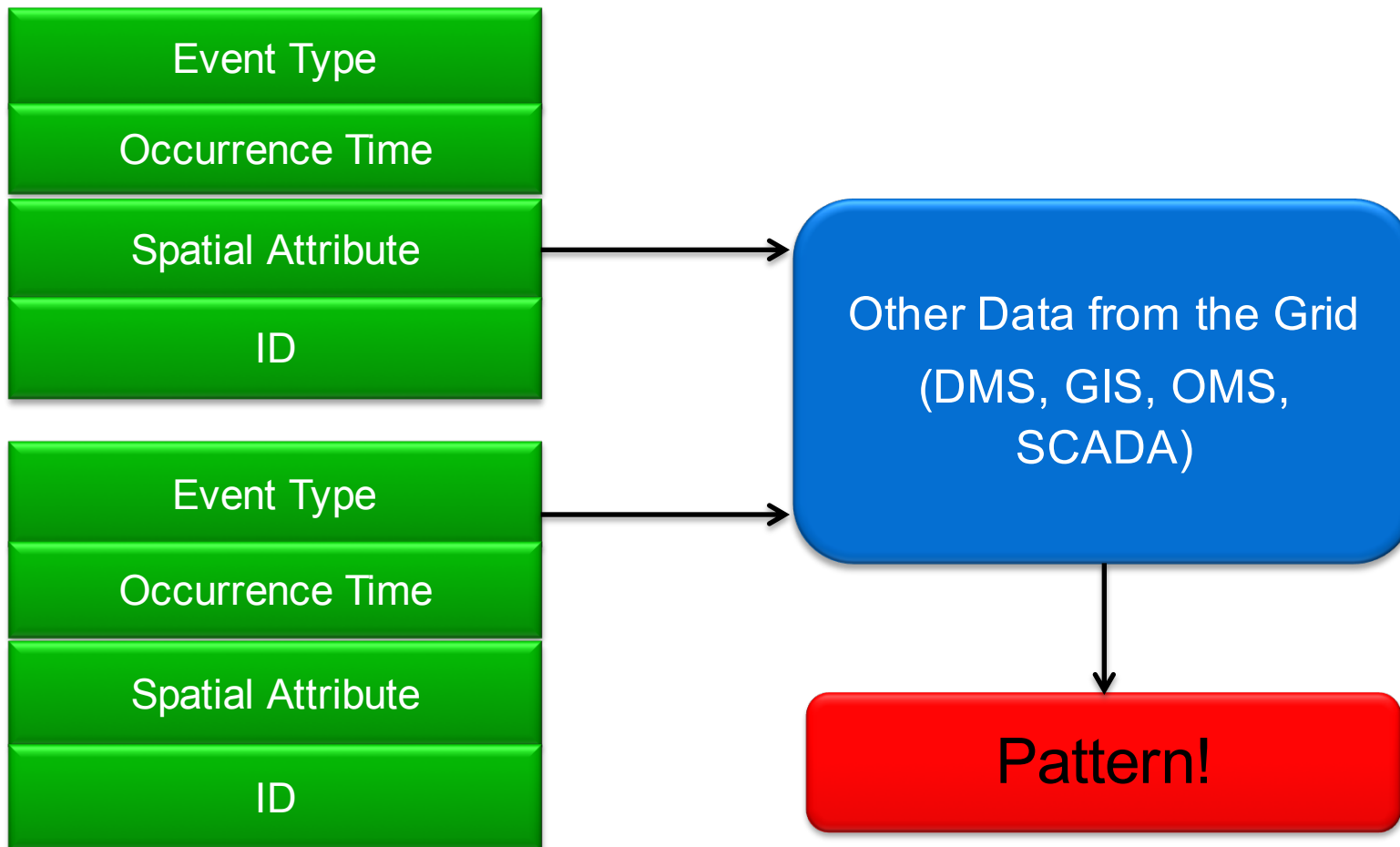


- Source : Yukon Grid Advisor

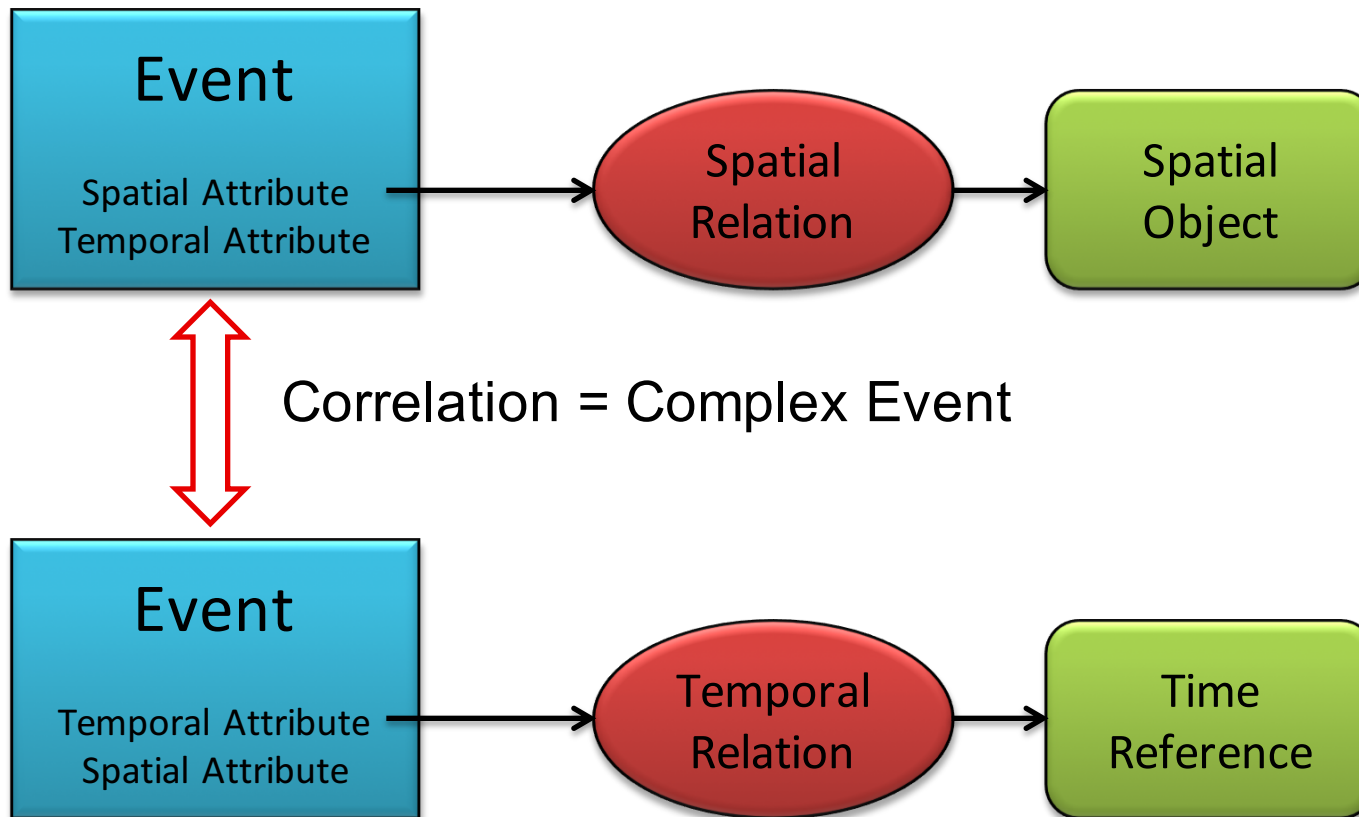
# CEP on Fault Current Indicator



# Event Representation

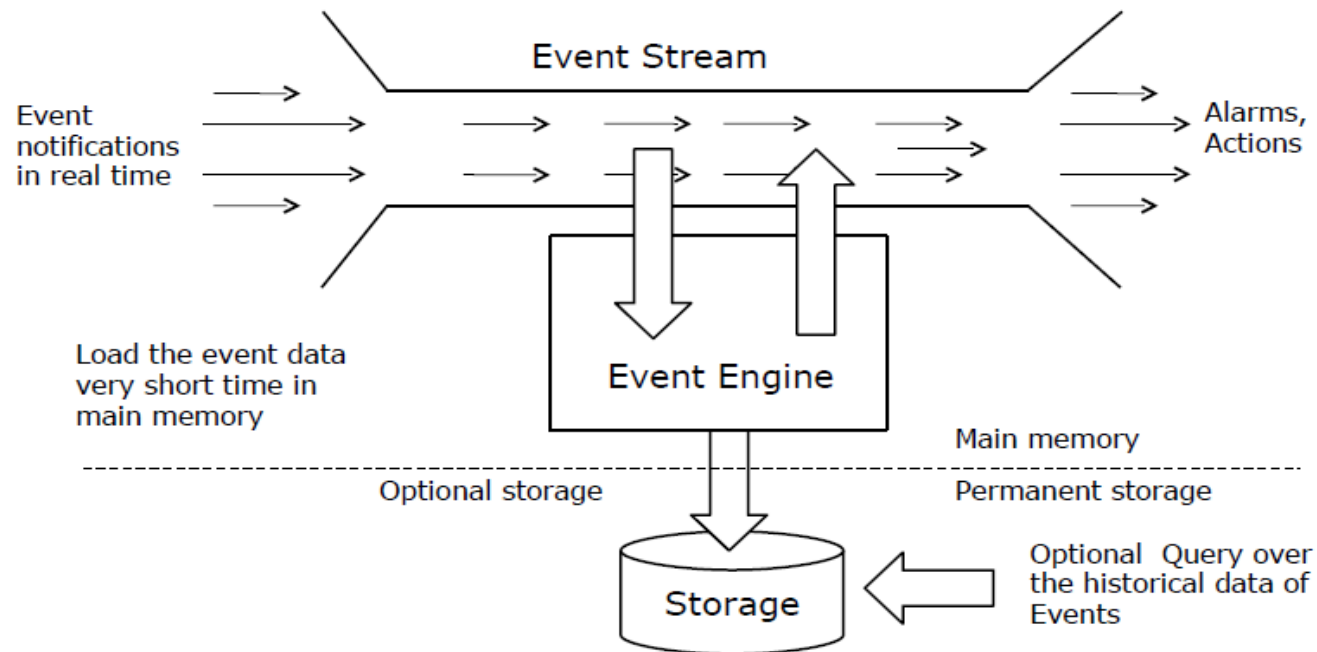


# Patterns : complex event processing

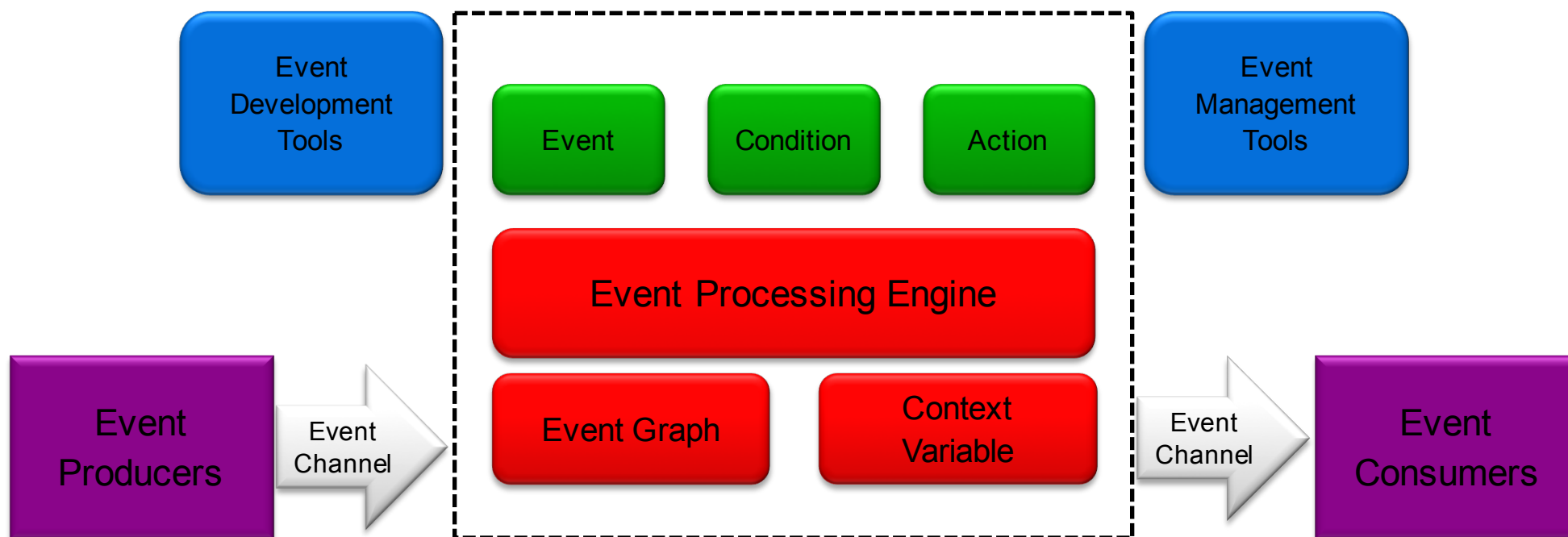


# What is Complex Event Processing

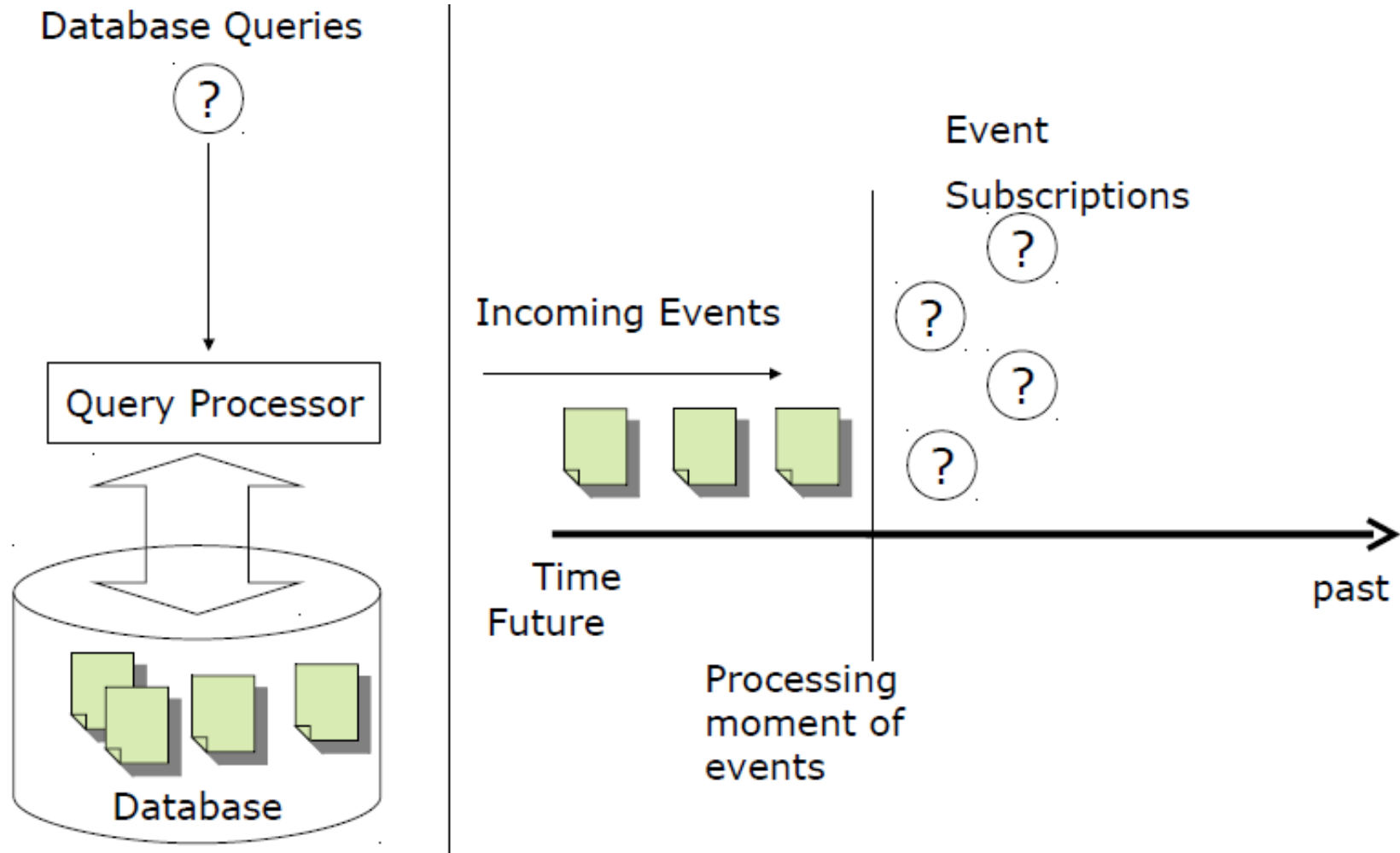
- Initially designed for finance industry in early 2000
- Definition and detection of patterns from a stream of events



# CEP: Typical Architecture



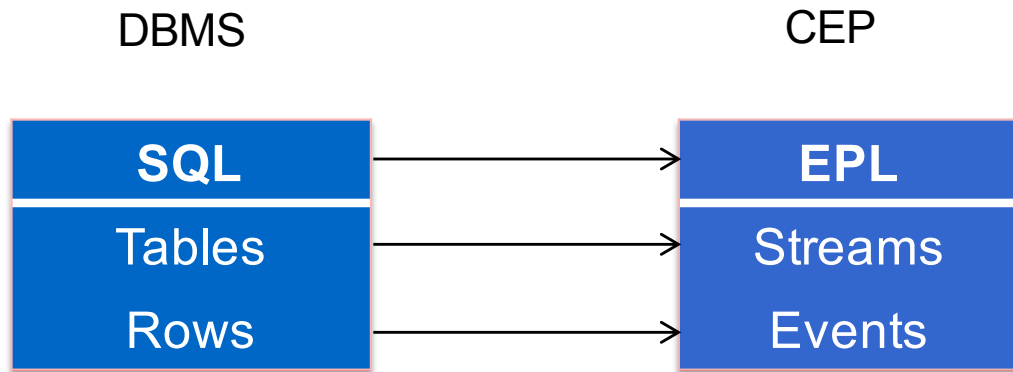
# CEP VS DB



- From Store Now, Query Later, to Query **Continuously!**



# CEP VS DBMS : turning DB upside down



# Event Pattern Language

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- A sample pattern that alerts on each IBM stock tick with a price greater than 80 and within the next 60 seconds:

“every StockTickEvent(symbol=“Etn”, price>80)  
where timer:within(60 seconds)”

- A sample pattern that alerts when event A occurs, followed by either event B or event C:

“A -> ( B or C )”

# Some Examples (ESPER EPL)

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- Outage Management System
  - **Every** OverCurrentEvent (Type1) -> OverCurrentEvent (Type2)  
**where** **Near**(OverCurrentEvent (Type1).Location,  
OverCurrentEvent (Type2).Location)
- ADMS (FLISR)
  - **Every** RecloserOpenEvent(Recloser1)->  
(RecloserOpenEvent(Recloser2) **where** Near(Recloser1.location,  
Recloser2.location)
- Substation
  - **Every** TransformerRelayOpen(Device="Dev001") **where**  
**timer:within**(60 seconds)

# CEP: How Smart a Utility Grid is?

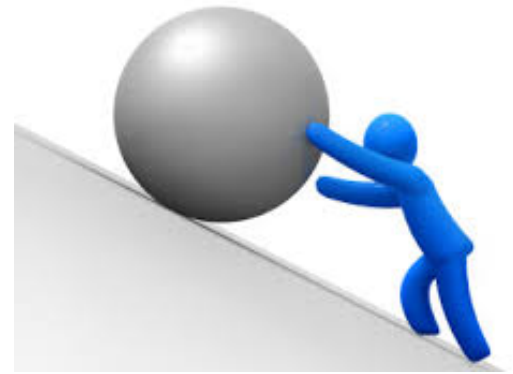
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- It can detect there was a power outage in one neighborhood 30 minutes before the first resident called the utility.
- Number of customer-voltage complaints — about either surges or drops — went from 50 to zero.
- It can identify a transformer that was overloaded and needed to be replaced — before it got fried.
- In the past, the utility knew to replace transformers when they blew and lights went out.

# CEP and Big Data: Challenges and Opportunities

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- Integration of various data sources from different departments
  - Static vs Dynamic
  - Security
  - More sensors/equipments
  - Configuration and Management
- Who will use these analytics patterns
  - Operation groups
  - Planning groups
  - Asset Management



# CEP and Big Data

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- Ownership: Where these applications will stand? (OT vs IT, or both)
- Yet another large software integration project!
- Applications: predictive maintenance, situation awareness, enhanced FLISR algorithms

# Questions?

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