

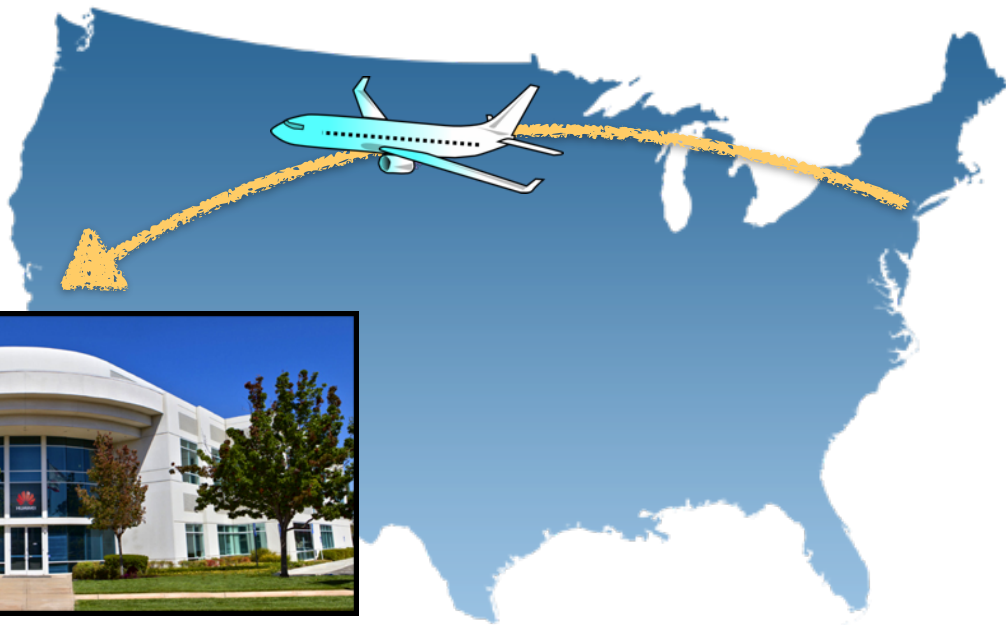
# Big Graph Analytics Engine

**Yinglong Xia**

6/23/2016



# Introduction



# Introduction



Huawei headquarters in Shenzhen, Guangdong, China

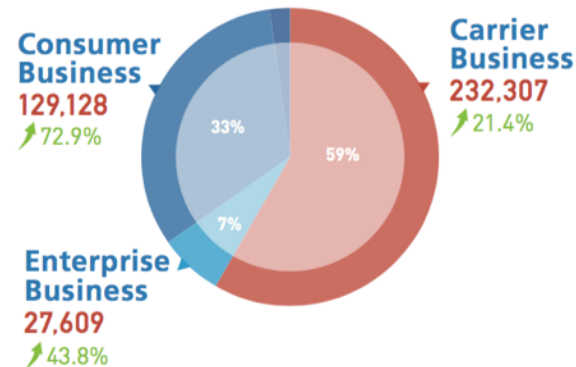
<b>Native name</b>	华为技术有限公司
<b>Type</b>	Private
<b>Industry</b>	Telecommunications equipment Networking equipment
<b>Founded</b>	1987; 29 years ago
<b>Founder</b>	Ren Zhengfei
<b>Headquarters</b>	Shenzhen, Guangdong, China
<b>Area served</b>	Worldwide
<b>Products</b>	Mobile and fixed broadband networks, consultancy and managed services, multimedia technology, smartphones, tablet computers, dongles

# Recent Growth



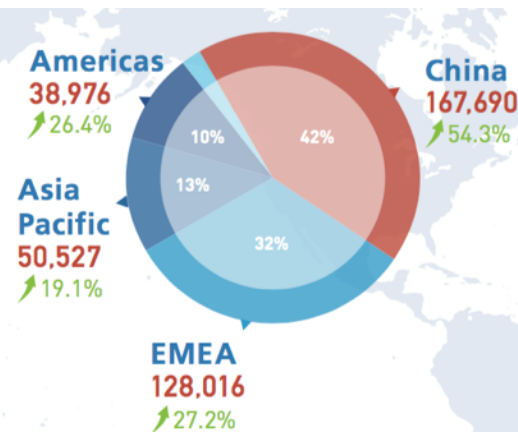
Revenue

CNY Million	2015	2014	YoY
Carrier Business	232,307	191,381	21.4%
Enterprise Business	27,609	19,201	43.8%
Consumer Business	129,128	74,688	72.9%
Others	5,965	2,927	103.8%
<b>Total</b>	<b>395,009</b>	<b>288,197</b>	<b>37.1%</b>



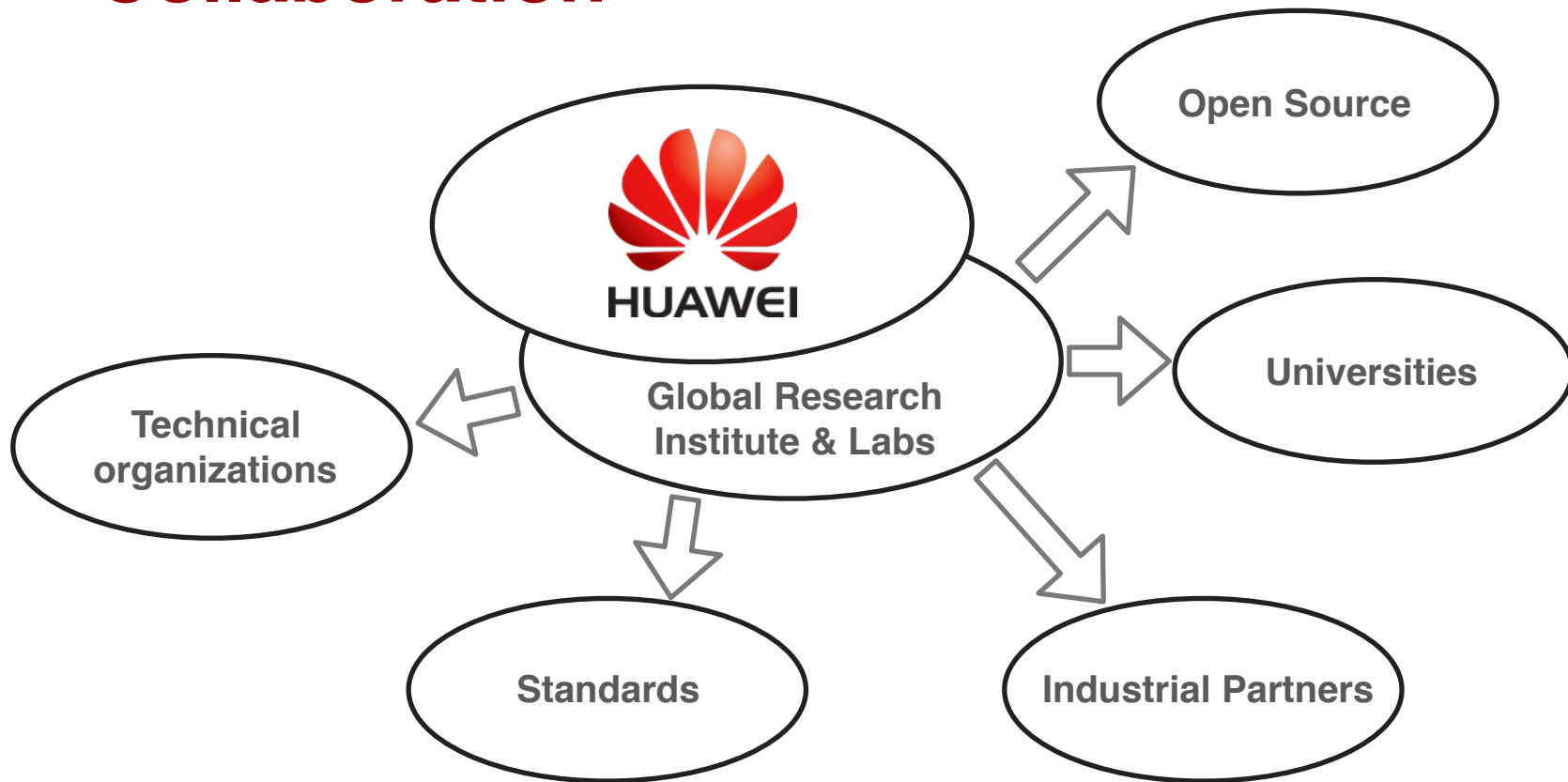
Net Profits

CNY Million	2015	2014	YoY
China	167,690	108,674	54.3%
EMEA	128,016	100,674	27.2%
Asia Pacific	50,527	42,409	19.1%
Americas	38,976	30,844	26.4%
Others	9,800	5,596	75.1%
<b>Total</b>	<b>395,009</b>	<b>288,197</b>	<b>37.1%</b>

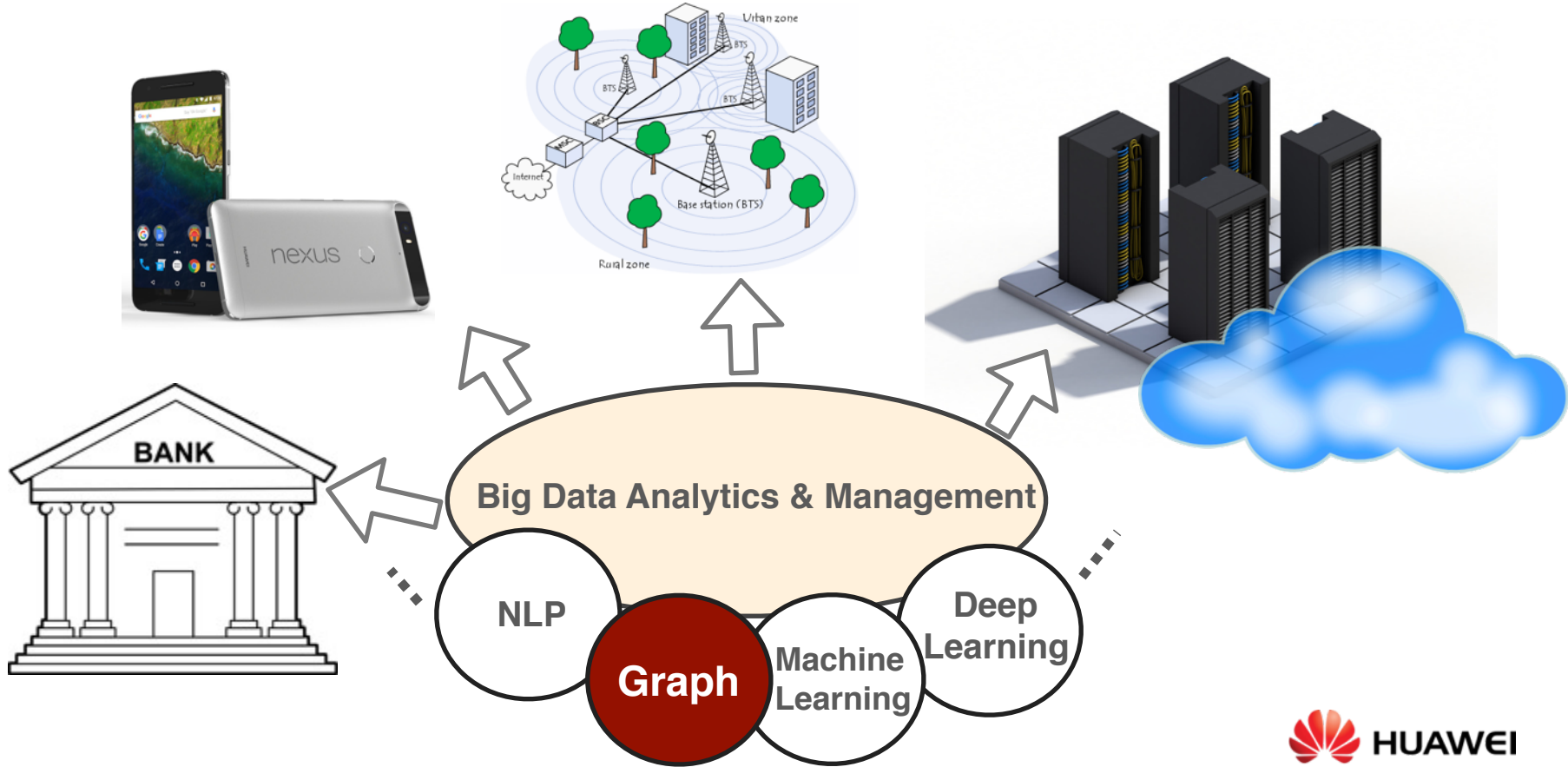


Cash flow  
from  
operating  
activities

# Collaboration



# Graph Analytics for Smart Big Data



# Graph in ONOS

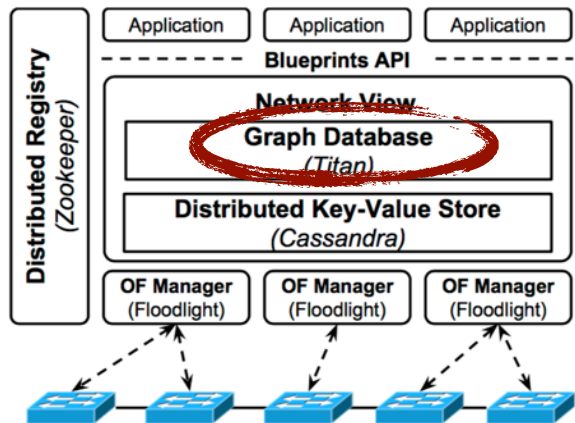


Figure 2: Prototype 1 Architecture

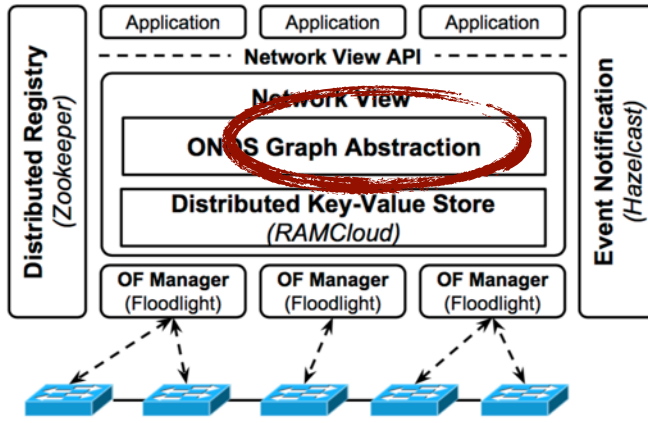
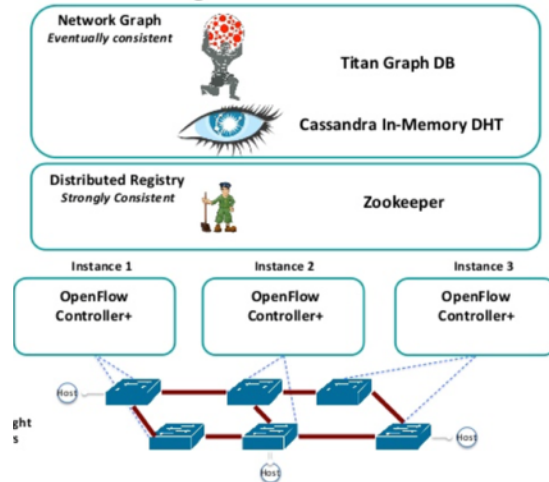


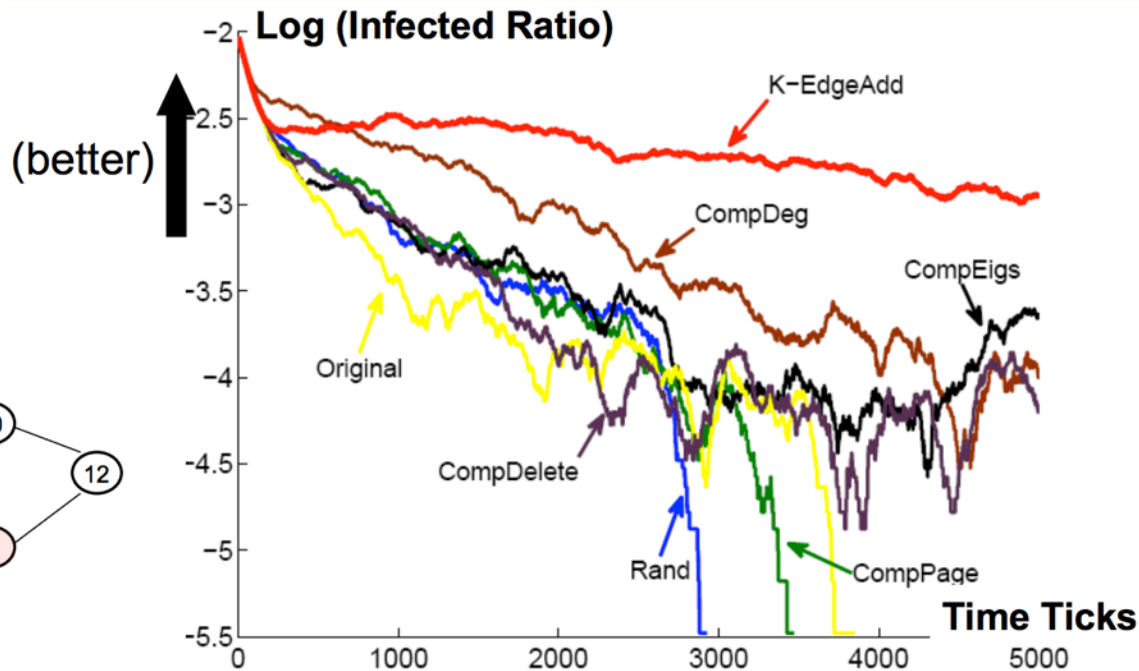
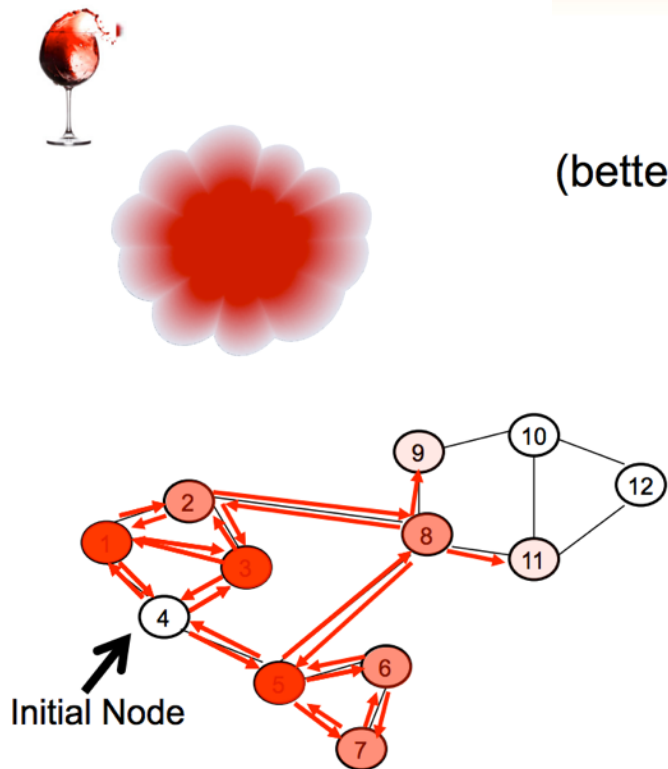
Figure 3: Prototype 2 Architecture

## ONOS High Level Architecture



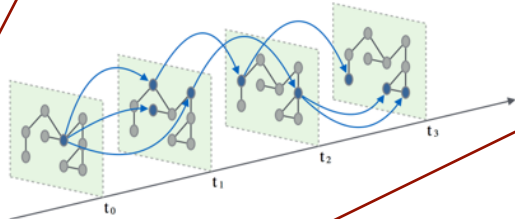
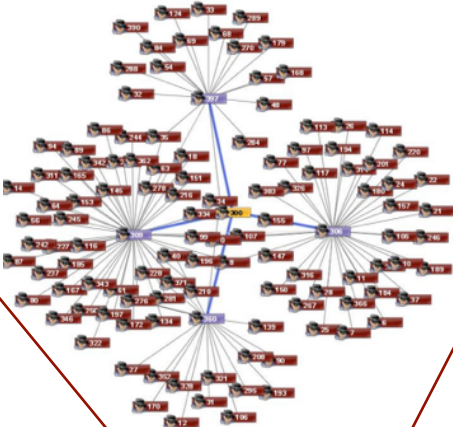
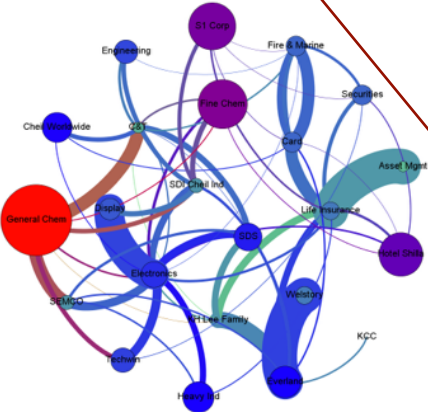
HotSDN'2014

# Topology Impact on Information Propagation

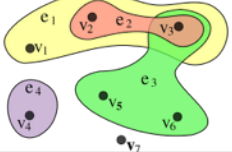
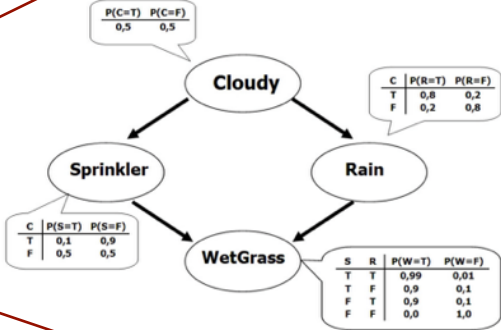
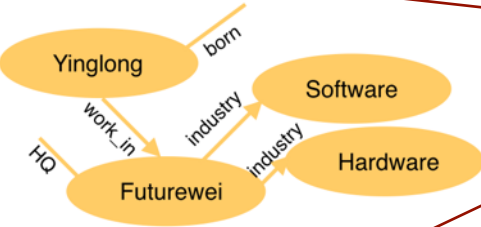




# Explore the Variety in Graph Analytics



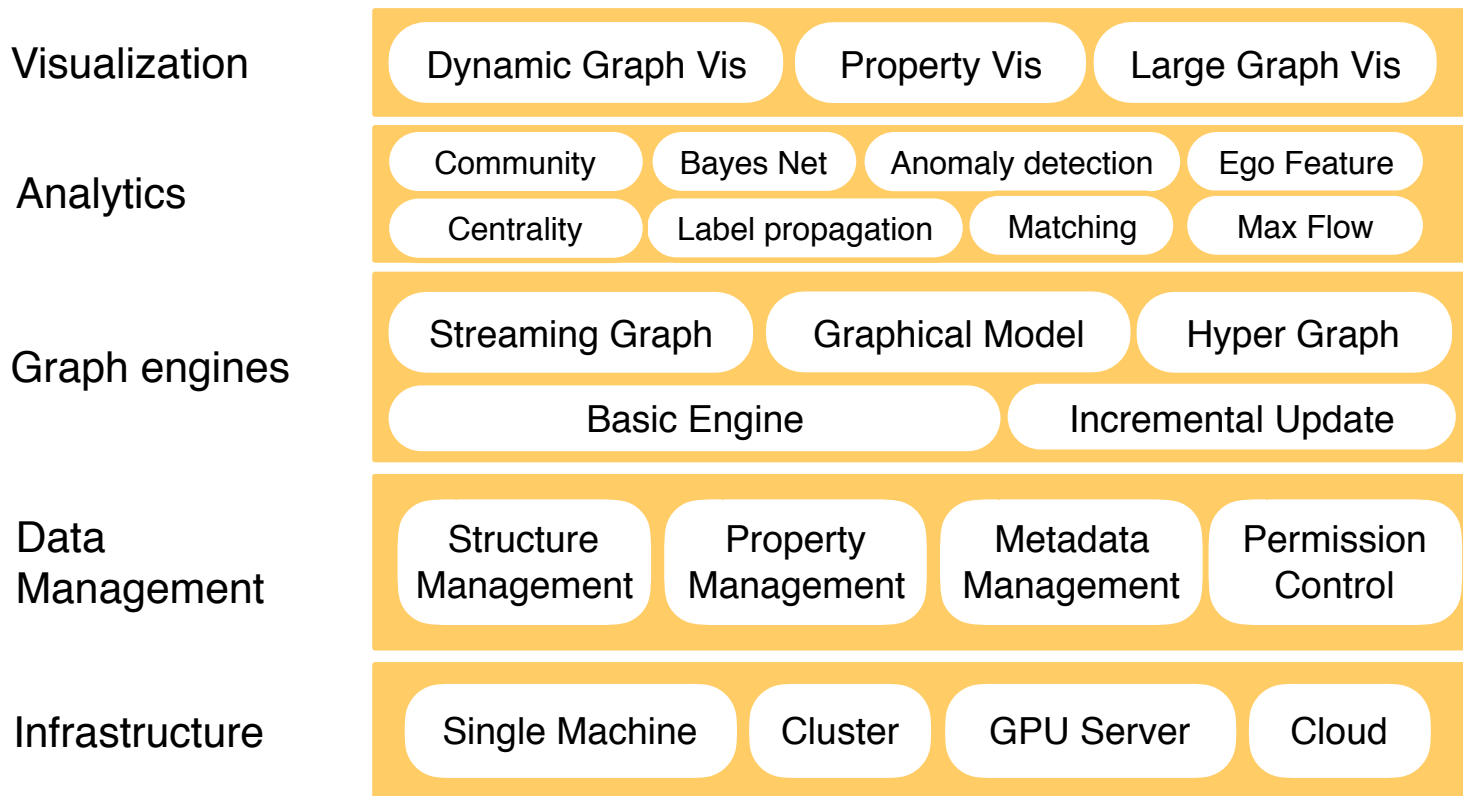
**Graph**



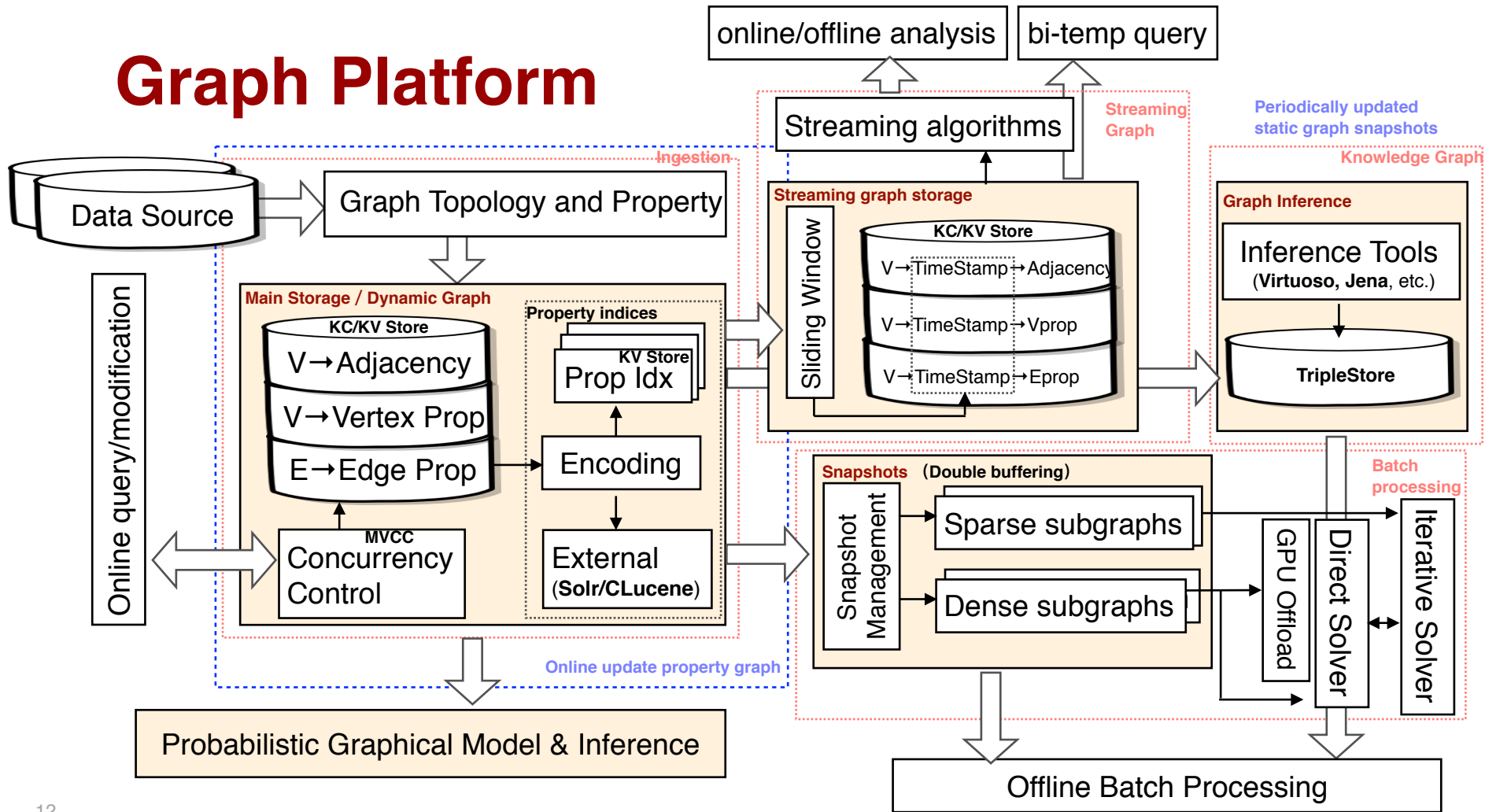
# Challenges

- **Very large scale graphs for analysis**
  - 10B~1000B in terms of the number of vertices
  - a few hundreds of properties, static and dynamic
  - distributed communication introduces additional overhead
- **Irregularity in graph data access**
  - Low data locality results in high disk/communication IO overhead
  - Data access patterns are diverse among graph analysis algorithms
- **Near real-time requirement**
  - Incorporate with incremental graph updates
  - Approximate query & analysis should be considered
- **Efficiency and productivity to balance**

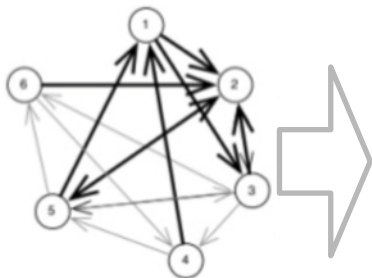
# Graph Platform for Smart Big Data



# Graph Platform



# Unified Graph Data Access Patterns



Iteration  $i$

	shard 1 (1, 2)	shard 2 (3,4)	shard 3 (5,6)																																																									
step 1	<table border="1"> <thead> <tr><th>src</th><th>dst</th><th>value</th></tr> </thead> <tbody> <tr><td>1</td><td>2</td><td>0.3</td></tr> <tr><td>3</td><td>2</td><td>0.2</td></tr> <tr><td>4</td><td>1</td><td>1.4</td></tr> <tr><td>5</td><td>1</td><td>0.5</td></tr> <tr><td>6</td><td>2</td><td>0.6</td></tr> <tr><td>2</td><td>2</td><td>0.8</td></tr> </tbody> </table>	src	dst	value	1	2	0.3	3	2	0.2	4	1	1.4	5	1	0.5	6	2	0.6	2	2	0.8	<table border="1"> <thead> <tr><th>src</th><th>dst</th><th>value</th></tr> </thead> <tbody> <tr><td>1</td><td>3</td><td>0.4</td></tr> <tr><td>2</td><td>3</td><td>0.3</td></tr> <tr><td>3</td><td>4</td><td>0.8</td></tr> <tr><td>5</td><td>3</td><td>0.2</td></tr> <tr><td>6</td><td>4</td><td>1.9</td></tr> </tbody> </table>	src	dst	value	1	3	0.4	2	3	0.3	3	4	0.8	5	3	0.2	6	4	1.9	<table border="1"> <thead> <tr><th>src</th><th>dst</th><th>value</th></tr> </thead> <tbody> <tr><td>2</td><td>5</td><td>0.6</td></tr> <tr><td>3</td><td>5</td><td>0.9</td></tr> <tr><td>4</td><td>6</td><td>1.2</td></tr> <tr><td>5</td><td>5</td><td>0.3</td></tr> <tr><td>6</td><td>6</td><td>1.1</td></tr> </tbody> </table>	src	dst	value	2	5	0.6	3	5	0.9	4	6	1.2	5	5	0.3	6	6	1.1
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observation on PSW data access patterns inspires highly efficient sharding representation

	1	2	3	4	5	6
1		0.3	0.4			
2			0.3			0.6
3		0.2		0.8	0.9	1.2
4	1.4					0.3
5	0.5	0.6	0.2			1.1
6		0.8		1.9		

# Construct Edge-set Flows

	1	2	3	4	5	6
1		0.3	0.4			
2			0.3		0.6	
3		0.2		0.8	0.9	1.2
4	1.4				0.3	
5	0.5	0.6	0.2			1.1
6		0.8		1.9		



	1	2	3	4	5	6
3		0.2		0.8	0.9	1.2
5	0.5	0.6	0.2			1.1
1		0.3	0.4			
2			0.3		0.6	
4	1.4				0.3	
6		0.8		1.9		

row permutation



	1	2	3	4	5	6
3		0.2		0.8	0.9	1.2
5	0.5	0.6	0.2			1.1
1		0.3	0.4			
2			0.3		0.6	
4	1.4				0.3	
6		0.8		1.9		

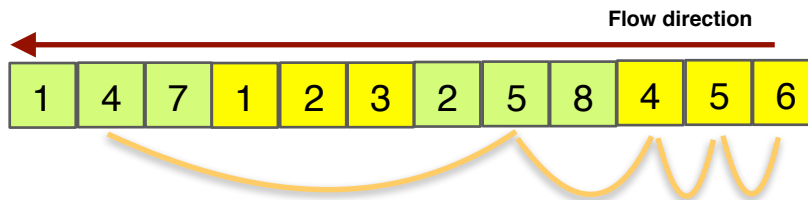
Physical edge-sets



	1	2	3	4	5	6
1	0.3	0.4				
2		0.3		0.6		
3	0.2		0.8	0.9	1.2	
4	1.4				0.3	
5	0.5	0.6	0.2			1.1
6		0.8		1.9		

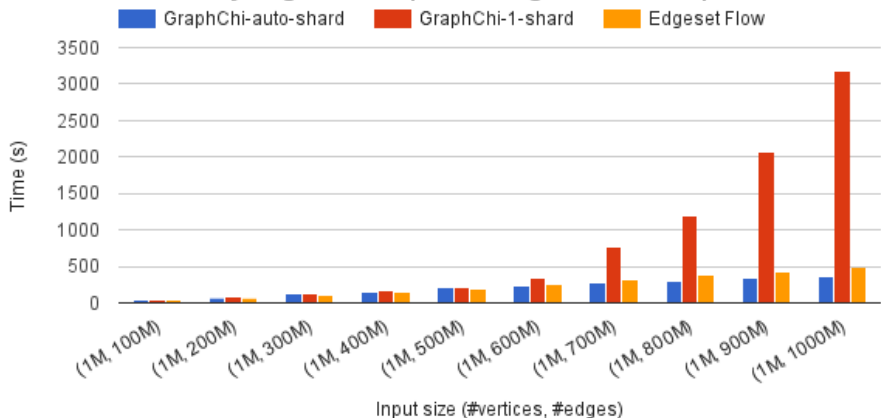


1	2	3
4	5	6
7	8	9



# Preliminary Experiments - Preproc.

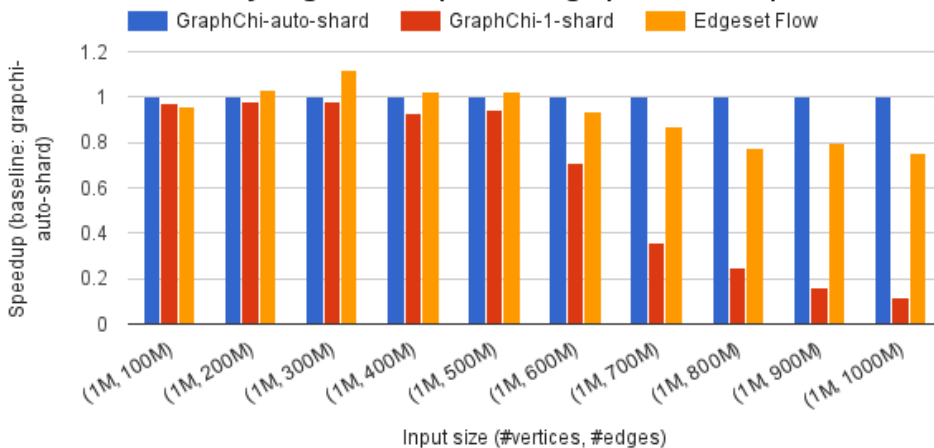
### In-memory Pagerank Preprocessing Time v.s. Graphchi



## Graph Ingestion/Preprocessing Time

Create the data in our format

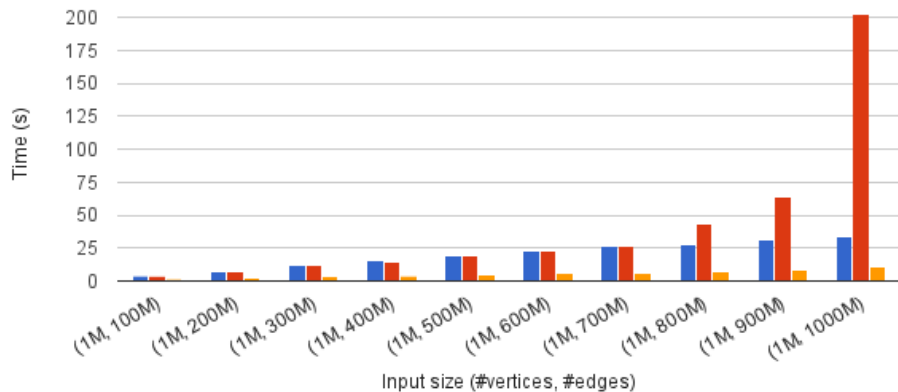
### In-memory Pagerank Preprocessing Speed v.s. Graphchi



# Preliminary Experiments - Comp.

### In-memory Pagerank Computation Time v.s. Graphchi

GraphChi-auto-shard GraphChi-1-shard Edgeset Flow

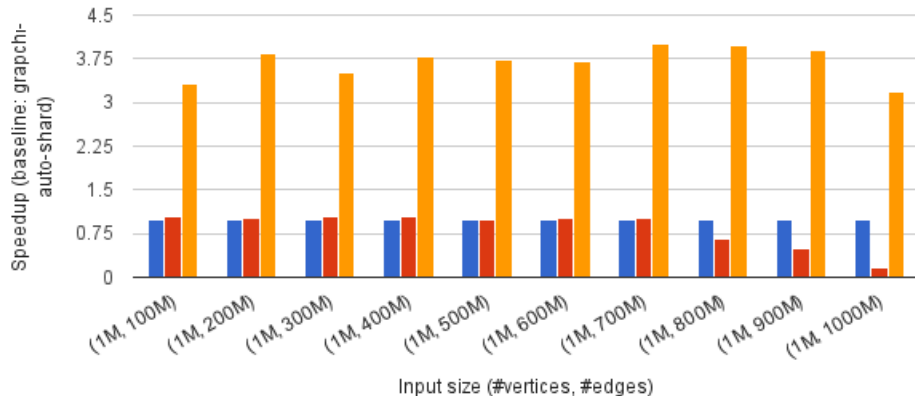


Decent speedup achieved w/ or w/o loading time

## PageRank w/o Loading Time

### In-memory Pagerank Computation Speed v.s. Graphchi

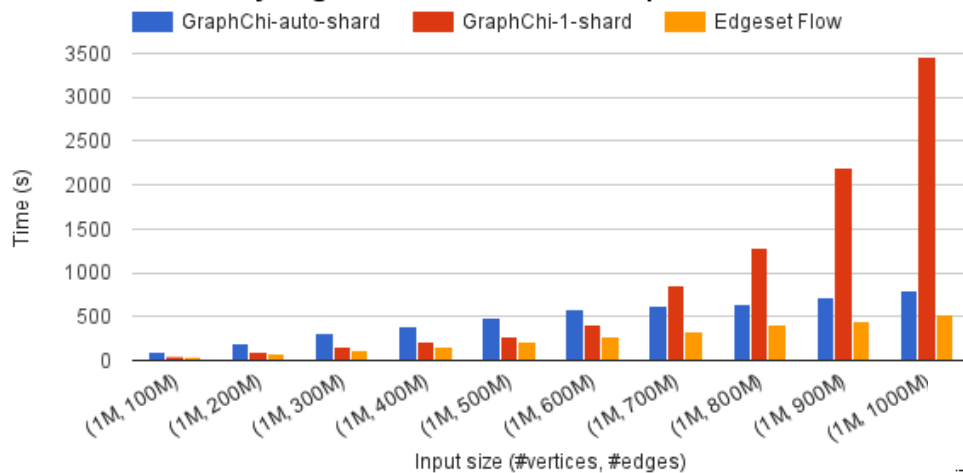
GraphChi-auto-shard GraphChi-1-shard Edgeset Flow





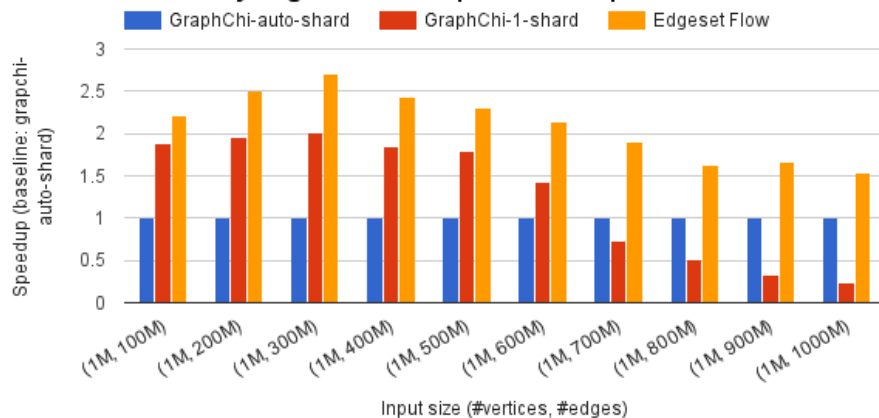
# Preliminary Experiments

## In-memory Pagerank Total Time v.s. Graphchi



## PageRank Total Time

## In-memory Pagerank Total Speed v.s. Graphchi



# Conclusion

- **Many big data problems involve links among a lot of entities, naturally represented as a graph**
- **Property graph is highly expressive**
- **Industry is looking for graph/graphical model engines for complex network analysis, streaming graph, probabilistic graphical models, and RDF graph computing**
- **Efficiency is the key in many industry graph analysis systems, especially when the data volume is big**
- **Eventually, the graph engine should serve for AI Business systems**

# Thanks

**Yinglong Xia**

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