# GraphTwist: Fast Iterative Graph Computation with Two-tier Optimizations

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#### Big Graphs are Everywhere

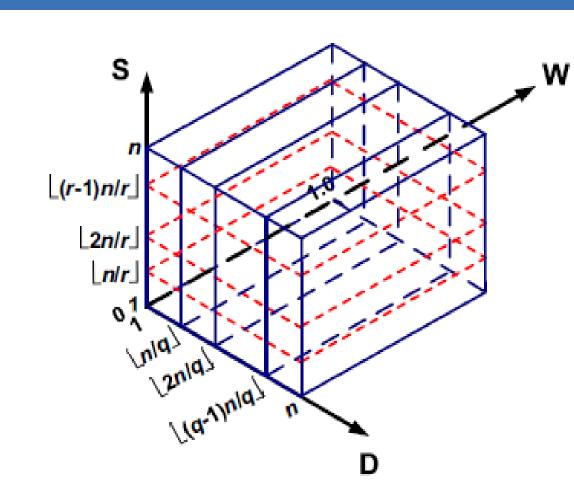
Popular graph datasets in current literature									
	n (vertices in millions)	m (edges in millions)	size						
AS-Skitter	1.7	11	142 MB						
LJ	4.8	69	337.2 MB						
USRD	24	58	586.7 MB						
BTC	165	773	5.3 GB						
WebUK	106	1877	8.6 GB						
Twitter	42	1470	24 GB						
YahooWeb	1413	6636	120 GB						

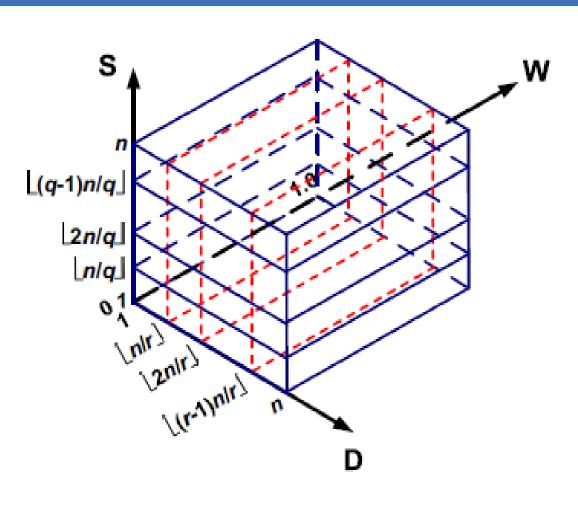
[Paul Burkhardt, Chris Waring 2013]

## Challenges of Big Graphs

- Graph size v.s. limited resource
- High-degree vertices
- Skewed vertex degree distribution
- Skewed edge weight distribution

### Modeling a Graph as a 3D Cube





(a) In-edge Cube (b) Out-edge Cube

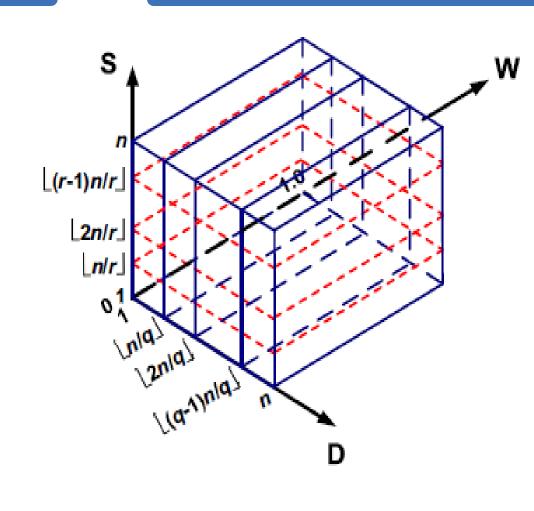
#### Real-world Big Graphs

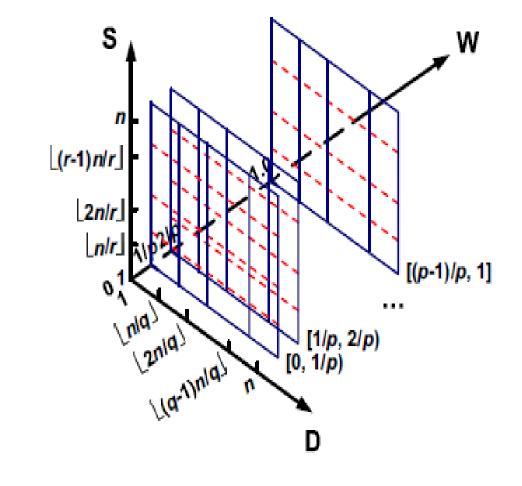
Graph	Type	#Vertices	#Edges	AvgDeg	MaxIn	MaxOut
Yahoo	directed	1.4B	6.6B	4.7	7.6M	$2.5\mathrm{K}$
uk-union	directed	133.6M	$5.5\mathrm{B}$	41.22	6.4M	22.4K
uk-2007-05	directed	105.9M	3.7B	35.31	975.4K	15.4K
Twitter	directed	41.7M	1.5B	35.25	770.1K	3.0M
Facebook	undirected	5.2M	47.2M	18.04	1.1K	1.1K
DBLPS	undirected	1.3M	32.0M	40.67	1.7K	1.7K
DBLPM	undirected	0.96M	10.1M	21.12	1.0K	1.0K
Last.fm	undirected	2.5M	42.8M	34.23	33.2K	33.2K

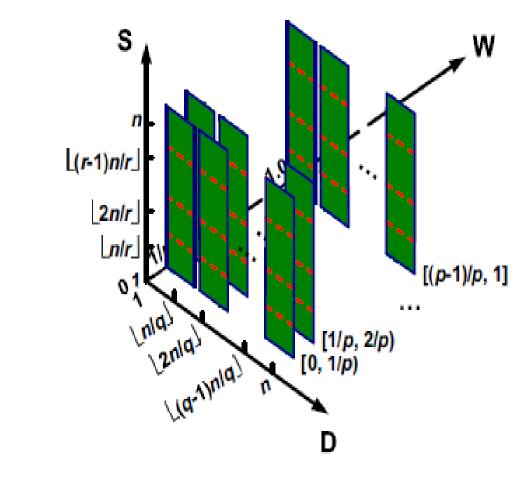
### **Challenges of Graph Processing Systems**

- Diverse types of processed graphs
- Different kinds of graph applications
- Random access
- Workload imbalance
- Exploring graph utility-aware pruning

### **Hierarchical Graph Parallel Abstractions**







- (a) In-edge Cube
- (b) In-edge Slice

GraphLab GraphChi

X-Stream

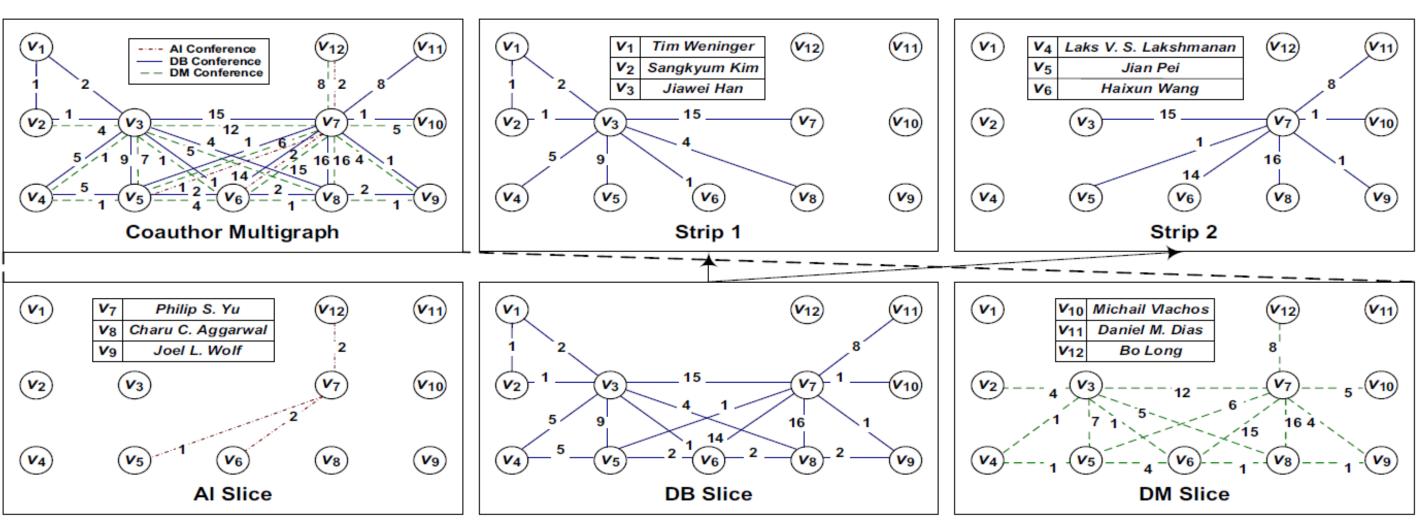
GraphTwist

GraphTwist-SP GraphTwist-CP GraphTwist-DP

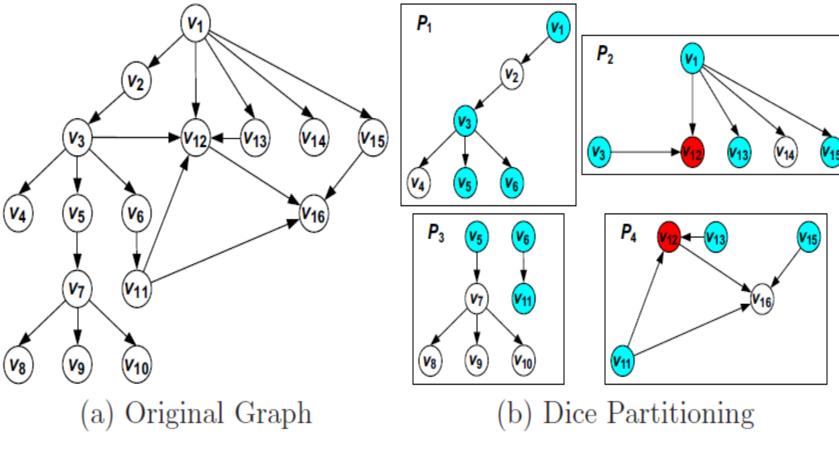
(c) Efficiency

(c) In-edge Strip

# Slice Partitioning and Strip Partitioning



## **Dice Partitioning**



**Experimental Evaluation** 

GraphChi
GraphTwist-SP
GraphTwist-CP
GraphTwist-DP

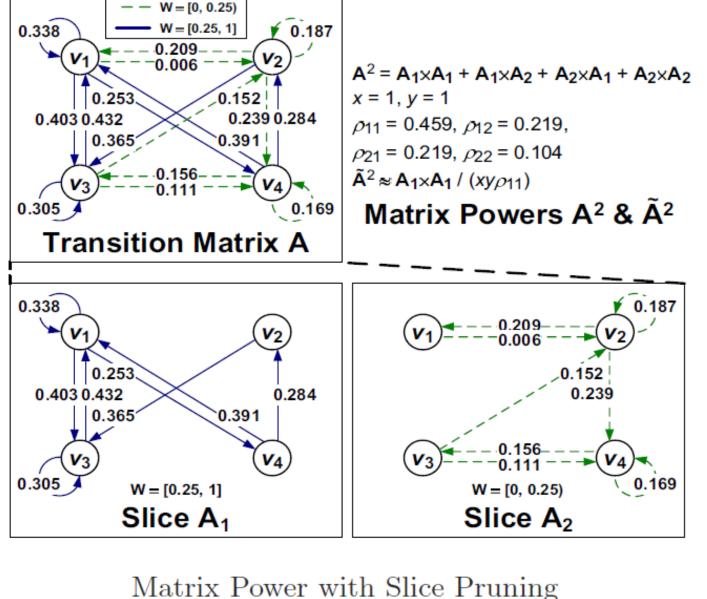
(b) Throughput

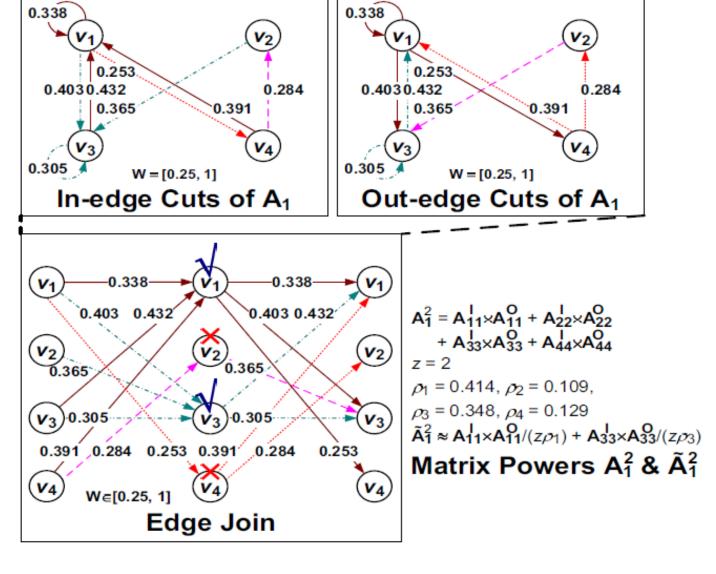
PageRank on Four Real Simple Graphs

GraphTwist

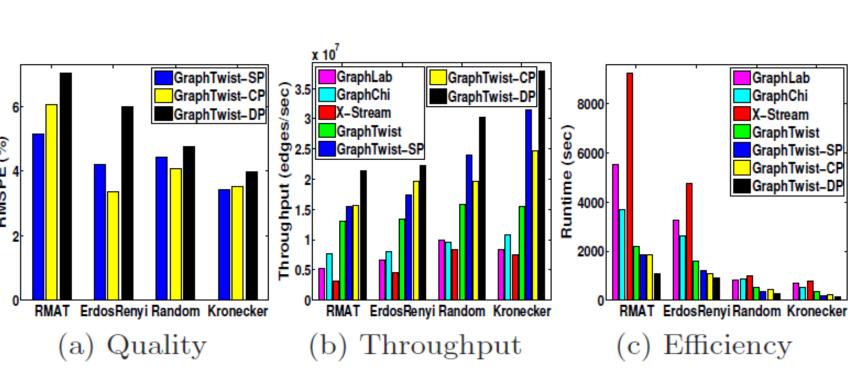
_	Vertex Table	Edge Table			Vertex Map			
5	P <sub>1</sub> SVP <sub>1</sub> : V <sub>1</sub> V <sub>2</sub> V <sub>3</sub> DVP <sub>1</sub> : V <sub>2</sub> V <sub>3</sub> V <sub>4</sub> V <sub>5</sub> V <sub>6</sub> P <sub>2</sub> SVP <sub>1</sub> : V <sub>1</sub> V <sub>2</sub> V <sub>3</sub> DVP <sub>3</sub> : V <sub>12</sub> V <sub>13</sub> V <sub>14</sub> V <sub>15</sub> V <sub>16</sub>	P <sub>1</sub> (V <sub>1</sub> , V <sub>2</sub> ) (V <sub>2</sub> , V <sub>3</sub> ) (V <sub>3</sub> , V <sub>4</sub> ) (V <sub>3</sub> , V <sub>5</sub> ) (V <sub>3</sub> , V <sub>6</sub> )	P <sub>2</sub> (V <sub>1</sub> , V <sub>12</sub> ) (V <sub>1</sub> , V <sub>13</sub> ) (V <sub>1</sub> , V <sub>14</sub> ) (V <sub>1</sub> , V <sub>15</sub> ) (V <sub>3</sub> , V <sub>12</sub> )	V <sub>1</sub> V <sub>2</sub> V <sub>3</sub> V <sub>4</sub> V <sub>5</sub> V <sub>6</sub> V <sub>7</sub> V <sub>8</sub>	P1 P1 P1 P1 P1 P3 P3	Out-edge P1, P2 P1 P1, P2 P3 P3 P3		
	P <sub>3</sub> SVP <sub>2</sub> : V <sub>5</sub> V <sub>6</sub> V <sub>7</sub> DVP <sub>2</sub> : V <sub>7</sub> V <sub>8</sub> V <sub>9</sub> V <sub>10</sub> V <sub>11</sub> P <sub>4</sub> SVP <sub>3</sub> : V <sub>11</sub> V <sub>12</sub> V <sub>13</sub> V <sub>15</sub> DVP <sub>3</sub> : V <sub>12</sub> V <sub>13</sub> V <sub>14</sub> V <sub>15</sub> V <sub>16</sub>	P <sub>3</sub> (V <sub>5</sub> , V <sub>7</sub> ) (V <sub>6</sub> , V <sub>11</sub> ) (V <sub>7</sub> , V <sub>8</sub> ) (V <sub>7</sub> , V <sub>9</sub> ) (V <sub>7</sub> , V <sub>10</sub> )	P <sub>4</sub> (V <sub>11</sub> , V <sub>12</sub> ) (V <sub>11</sub> , V <sub>16</sub> ) (V <sub>12</sub> , V <sub>16</sub> ) (V <sub>13</sub> , V <sub>12</sub> ) (V <sub>15</sub> , V <sub>16</sub> )	V <sub>9</sub> V <sub>10</sub> V <sub>11</sub> V <sub>12</sub> V <sub>13</sub> V <sub>14</sub> V <sub>15</sub> V <sub>16</sub>	P <sub>3</sub> P <sub>3</sub> P <sub>3</sub> P <sub>2</sub> , P <sub>4</sub> P <sub>2</sub> P <sub>2</sub> P <sub>2</sub>	P <sub>4</sub> P <sub>4</sub> P <sub>4</sub> P <sub>4</sub>		

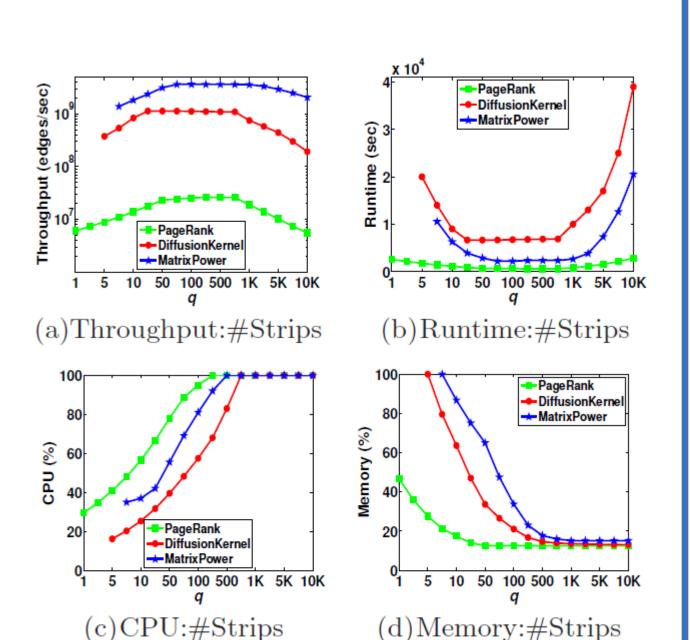
# Slice Pruning and Cut Pruning





Matrix Power with Cut Pruning





Impact of #Strips

PageRank on Four Synthetic Simple Graphs

Intel Science & Technology Center for Cloud Computing







GraphTwist\_CP

(a) Quality

GraphTwist\_DP





UNIVERSITY of WASHINGTON

(d) Memory: #Strips