

# What Skills Matter in Data Quality?

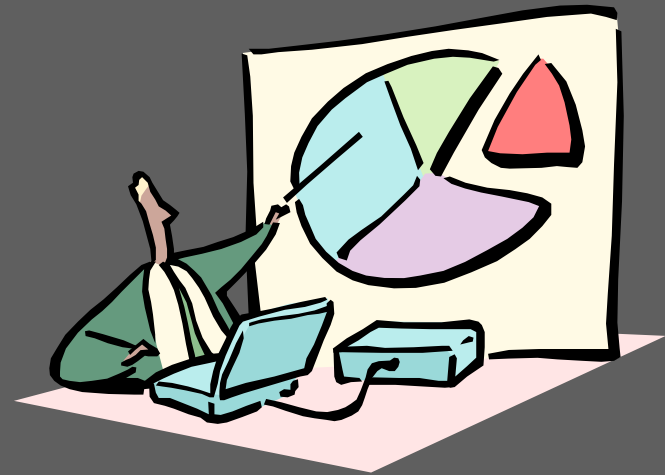
## Research Team

**WooYoung Chung**  
Case Western Reserve University

**Craig Fisher**  
Marist College

**Yang Lee**  
Northeastern University

**Richard Wang**  
MIT & U.C. Berkeley



## Presentation

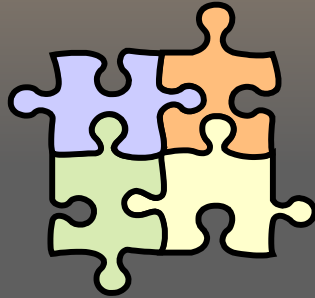
The 7<sup>th</sup> International Conference  
on Information Quality

November 10, 2002

# Presentation Roadmap

## Challenge:

DQ/IQ is an interdisciplinary field.



1. How should we conceptualize the DQ skills?
2. How do different sets of DQ skills complement one another?
3. What areas of DQ need more research and education?

## ⇒ Conceptual Framework

- General System Systems Theory
- Classification of DQ skills
- Literature Review

## ⇒ Exploratory Survey Study

- The skills survey at the 6<sup>th</sup> ICIQ
- Preliminary Findings
- Conclusions

# General Systems Theory

<u>Boulding (1956)</u> General Systems Theory	<u>Chaffee (1985)</u> Classification of Business strategies	<u>Morgan (1986)</u> Classification of organizational theories	<u>DQ/IQ</u> Classification of DQ/IQ research and skills
Mechanical System (levels 1-3) Ex.: physics, economics	Linear Strategies Classic management theory, MBO	The machine metaphor	Technical (analytic) capabilities
Open Systems (levels 4-6) Ex.: biology, botany	Adaptive Strategies Contingency theory, OIP	The organism metaphor	Adaptive Capabilities
Human Systems (levels 7-9) Ex: sociology, anthropology	Interpretive Strategies Symbol management, social meanings	The brain metaphor	Interpretive Capabilities

# Research Examples

## Classification

## Examples

### Technical Capabilities

Bohm and Jacopini, 1966; Chen, 1976; Coad and Yourdon, 1991; Codd, 1970; Dijkstra, 1968; Gane and Sarson, 1979

Ballou and Pazer, 1985, 1995

### Adaptive Capabilities

Adams, Nelson, and Todd, 1992; Davis, Bagozzi, and Warshaw, 1989; Mathieson, 1991; Taylor and Todd, 1995

Baroudi, Olsen, and Ives, 1986; Chin and Newsted, 1995

Brancheau and Wetherbe, 1990; Moore and Benbasat, 1991

DeLone and McLean, 1992; Seddon, 1997

Barki and Hartwick, 1994; Newman and Robey, 1992; Salaway, 1987;

Orr, 1998; Wang and Strong, 1996

# Research Examples

## Classification

## Examples

Interpretive Capabilities

Barley, 1986; DeSanctis and Poole, 1994; Orlikowski, 1992, 2000; Orlikowski and Yates, 1994;

Constant, Sproull, and Kiesler, 1996; Pickering and King, 1995; Zack, 1993

Weisband, 1987

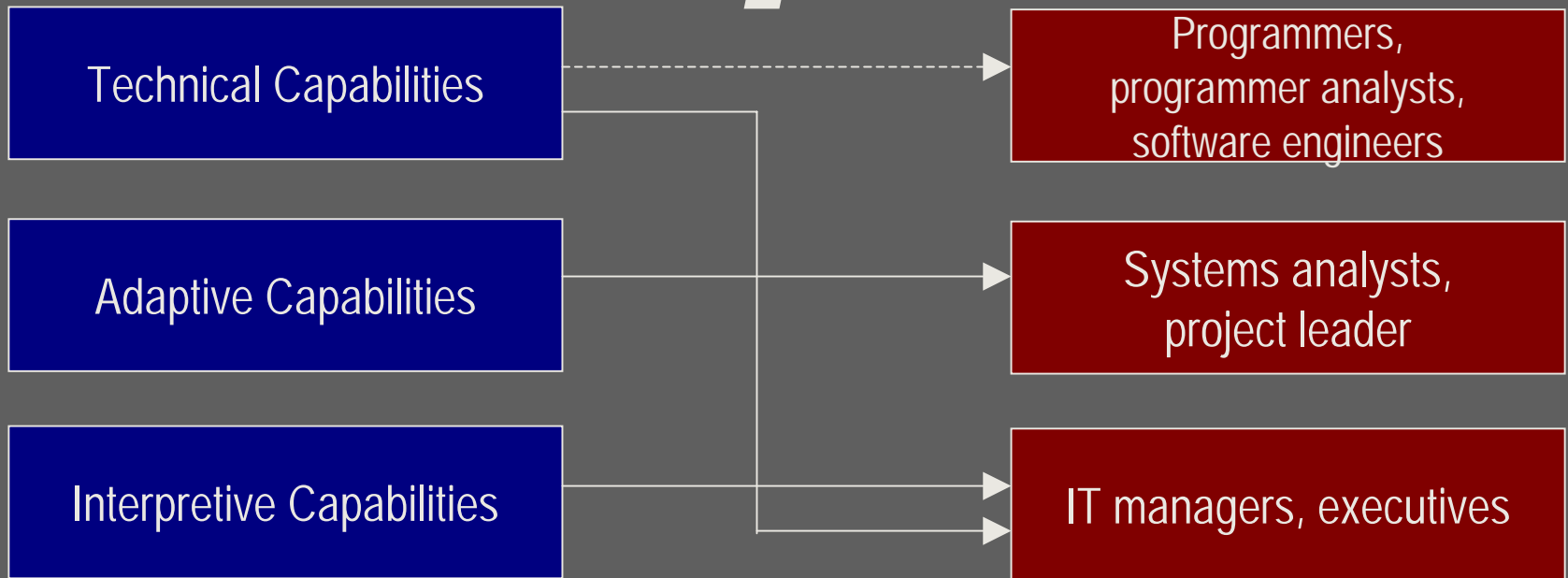
Davenport and Short, 1990; Hammer, 1990; Hammer and Champy, 1993

# Research and Practice

Research



Practice



# Descriptive Statistics

Table 1

No.	Description	Mean	Std Dev	Based on T-Test	Based on Tukey	Subsets Based on Tukey			
1.	DQ measurement	6.33	0.96	1-2	1-10	A			
2.	DQ implications	6.10	1.08	1-6, 9	1-13	A	B		
3.	TQM	5.90	1.09	2-10	1-15	A	B	C	
4.	Data entry improvement	5.84	1.20	2-11	1-15	A	B	C	
5.	Org. policies	5.79	1.27	2-13	1-15	A	B	C	
6.	DB error detection	5.77	1.35	2-12	1-15	A	B	C	
7.	DQ dimensions	5.75	1.04	3-12	1-15	A	B	C	
8.	Change process	5.72	1.07	3-12	1-15	A	B	C	
9.	DQ cost/benefit	5.70	1.35	2-12	1-15	A	B	C	
10.	User requirements	5.67	1.14	3-14	1-15	A	B	C	
11.	Info. overload	5.49	1.21	4-15	2-15		B	C	
12.	DQ audit	5.46	1.18	5-15	2-15		B	C	
13.	Statistical techniques	5.30	1.46	5,10-15	2-18		B	C	D
14.	Data mining skills	5.23	1.50	10-15	3-18			C	D
15.	Data warehouse setup	5.18	1.43	11-15	3-18			C	D
16.	Analytic models	4.54	1.59	16-18	13-18				D
17.	Relational algebra	4.54	1.52	16-18	13-18				D
18.	Software tools	4.54	1.41	16-18	13-18				D

# Factor Analysis

Table 2

	Factor 1	Factor 2	Factor 3
<b>Factor 1 (Alpha = .798)</b>			
14. Data Mining Skills	.783		
16. Analytic Models	.765		
15. Data Warehouse Setup	.726		
17. Relational Algebra	.588	.508	
13. Statistical Techniques	.577	.442	
<b>Factor 2 (Alpha = .644)</b>			
1. DQ Measurements		.813	
3. TQM		.675	.413
4. Data Entry Improvement		.612	
10. User Requirements		.553	
<b>Factor 3 (Alpha = .699)</b>			
8. Change Process			.795
2. DQ Implications			.694
9. DQ Cost/Benefit			.644
6. DB Error Detection	.466		.561



# Skills Ratings by Job Titles

Table 5 – abridged

	Professors (N=10)		Executives Managers (N=11)		Consultants (N=10)		Project Managers Analysts (N=15)	
	Mean	Std. Dev	Mean	Std. Dev	Mean	Std Dev	Mean	Std Dev
Interpretive Capabilities	6.08	0.69	5.95	0.66	5.38	1.32	5.97	0.82
Adaptive Capabilities	5.68	0.83	5.64	1.10	6.30	0.60	6.17	0.60
Technical Capabilities	4.66	1.13	4.38	1.10	4.84	1.48	5.21	0.93

# Conclusions

- ⇒ Practitioners value diverse skills differently depending on their job situations.
- ⇒ IS educators should design a data quality curriculum to fit the need of long-term and short-term career objectives of their student.
- ⇒ Both academic researchers and executives reported Interpretive Capabilities—the ability of identifying and articulating organizational implications of data quality—as most important in improving and maintaining the data quality.
- ⇒ Future research efforts should be directed to a systematic investigation of how data quality would affect the way in which people are organized and jobs are structured.