

# 大數據行銷研究

## Big Data Marketing Research



Tamkang  
University  
淡江大學

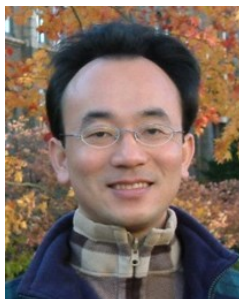
# 測量與量表

## (Measurement and Scaling)

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2016-10-21



# 課程大綱 (Syllabus)

週次 (Week)	日期 (Date)	內容 (Subject/Topics)
1	2016/09/16	中秋節 (調整放假一天) (Mid-Autumn Festival Holiday)(Day off)
2	2016/09/23	大數據行銷研究課程介紹 (Course Orientation for Big Data Marketing Research)
3	2016/09/30	資料科學與大數據行銷 (Data Science and Big Data Marketing)
4	2016/10/07	大數據行銷分析與研究 (Big Data Marketing Analytics and Research)
5	2016/10/14	測量構念 (Measuring the Construct)
6	2016/10/21	測量與量表 (Measurement and Scaling)

# 課程大綱 (Syllabus)

週次 (Week)	日期 (Date)	內容 (Subject/Topics)
7	2016/10/28	大數據行銷個案分析 I (Case Study on Big Data Marketing I)
8	2016/11/04	探索性因素分析 (Exploratory Factor Analysis)
9	2016/11/11	確認性因素分析 (Confirmatory Factor Analysis)
10	2016/11/18	期中報告 (Midterm Presentation)
11	2016/11/25	社群運算與大數據分析 (Social Computing and Big Data Analytics)
12	2016/12/02	社會網路分析 (Social Network Analysis)

# 課程大綱 (Syllabus)

週次 (Week)	日期 (Date)	內容 (Subject/Topics)
13	2016/12/09	大數據行銷個案分析 II (Case Study on Big Data Marketing II)
14	2016/12/16	社會網絡分析量測與實務 (Measurements and Practices of Social Network Analysis)
15	2016/12/23	大數據情感分析 (Big Data Sentiment Analysis)
16	2016/12/30	金融科技行銷研究 (FinTech Marketing Research)
17	2017/01/06	期末報告 I (Term Project Presentation I)
18	2017/01/13	期末報告 II (Term Project Presentation II)

# Outline

- A paradigm for developing better measures of marketing constructs
- Current practice in scale development
- The linkage among attitudes, behavior, and marketing effectiveness
- Measurement Scales

# Big Data Marketing Research Papers

1. Ashman, R., & Patterson, A. (2015). Seeing the big picture in services marketing research: infographics, SEM and data visualisation. *Journal of Services Marketing*, 29(6-7), 613-621.
2. Calder, B. J., Malthouse, E. C., & Maslowska, E. (2016). Brand marketing, big data and social innovation as future research directions for engagement. *Journal of Marketing Management*, 32(5-6), 579-585.
3. Chintagunta, P., Hanssens, D. M., & Hauser, J. R. (2016). Marketing Science and Big Data. *Marketing Science*, 35(3), 341-342.
4. Dhar, V. (2014). Big Data and the Rise of Machines in Financial Markets. *Big Data*, 2(2), 65-67.
5. Dhar, V. (2014). Can Big Data Machines Analyze Stock Market Sentiment? *Big Data*, 2(4), 177-181.

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6. Donnelly, C., Simmons, G., Armstrong, G., & Fearne, A. (2015). Digital loyalty card "big data" and small business marketing: Formal versus informal or complementary? *International Small Business Journal*, 33(4), 422-442.
7. Erevelles, S., Fukawa, N., & Swayne, L. (2016). Big Data consumer analytics and the transformation of marketing. *Journal of Business Research*, 69(2), 897-904.
8. Fan, S. K., Lau, R. Y. K., & Zhao, J. L. (2015). Demystifying Big Data Analytics for Business Intelligence Through the Lens of Marketing Mix. *Big Data Research*, 2(1), 28-32.
9. Gutmann, J. (2015). Humanizing Big Data: Marketing at the Meeting of Social Science and Consumer Insight. *International Journal of Market Research*, 57(3), 503-505.
10. Jun, S., Park, S., & Jang, D. (2015). A Technology Valuation Model Using Quantitative Patent Analysis: A Case Study of Technology Transfer in Big Data Marketing. *Emerging Markets Finance and Trade*, 51(5), 963-974.

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11. Mouncey, P. (2016). Creating value with Big Data analytics: making smarter marketing decisions. *International Journal of Market Research*, 58(5), 761-764.
12. Perera, C., Ranjan, R., & Wang, L. Z. (2015). End-to-End Privacy for Open Big Data Markets. *IEEE Cloud Computing*, 2(4), 44-53.
13. Schepp, N. P., & Wambach, A. (2016). On Big Data and Its Relevance for Market Power Assessment. *Journal of European Competition Law & Practice*, 7(2), 120-124.
14. Tirunillai, S., & Tellis, G. J. (2014). Mining Marketing Meaning from Online Chatter: Strategic Brand Analysis of Big Data Using Latent Dirichlet Allocation. *Journal of Marketing Research*, 51(4), 463-479.
15. Xu, Z. N., Frankwick, G. L., & Ramirez, E. (2016). Effects of big data analytics and traditional marketing analytics on new product success: A knowledge fusion perspective. *Journal of Business Research*, 69(5), 1562-1566.



# Big Data Marketing Research Papers

16. Lau, R. Y., Zhao, J. L., Chen, G., & Guo, X. (2016). Big data commerce. *Information & Management*.
17. Aloysius, J. A., Hoehle, H., Goodarzi, S., & Venkatesh, V. (2016). Big data initiatives in retail environments: Linking service process perceptions to shopping outcomes. *Annals of Operations Research*, 1-27.
18. Li, J., Tao, F., Cheng, Y., & Zhao, L. (2015). Big Data in product lifecycle management. *The International Journal of Advanced Manufacturing Technology*, 81(1-4), 667-684.
19. Chong, A. Y. L., Li, B., Ngai, E. W., Ch'ng, E., & Lee, F. (2016). Predicting online product sales via online reviews, sentiments, and promotion strategies: A big data architecture and neural network approach. *International Journal of Operations & Production Management*, 36(4), 358-383.
20. Hartmann, P. M., Hartmann, P. M., Zaki, M., Zaki, M., Feldmann, N., Feldmann, N., ... & Neely, A. (2016). Capturing value from big data—a taxonomy of data-driven business models used by start-up firms. *International Journal of Operations & Production Management*, 36(10), 1382-1406.

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Hauser, J. R. (2016).

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Mining brand perceptions from  
Twitter social networks.  
*Marketing Science*, 35(3), 343-362.

Ringel, D. M., & Skiera, B. (2016).  
Visualizing asymmetric competition  
among more than 1,000 products  
using big search data.  
*Marketing Science*, 35(3), 511-534.

Lau, R. Y., Zhao, J. L., Chen, G., & Guo, X.  
(2016).

Big data commerce.

*Information & Management.*

# Big Data Commerce

Emerging Electronic Commerce Applications



Theories, Models, Methods, Systems

trigger

trigger

trigger

trigger

Volume

Mass amounts of data are made available

Velocity

Data are generated in high speed

Variety

Data with different formats are produced from multiple sources

Veracity

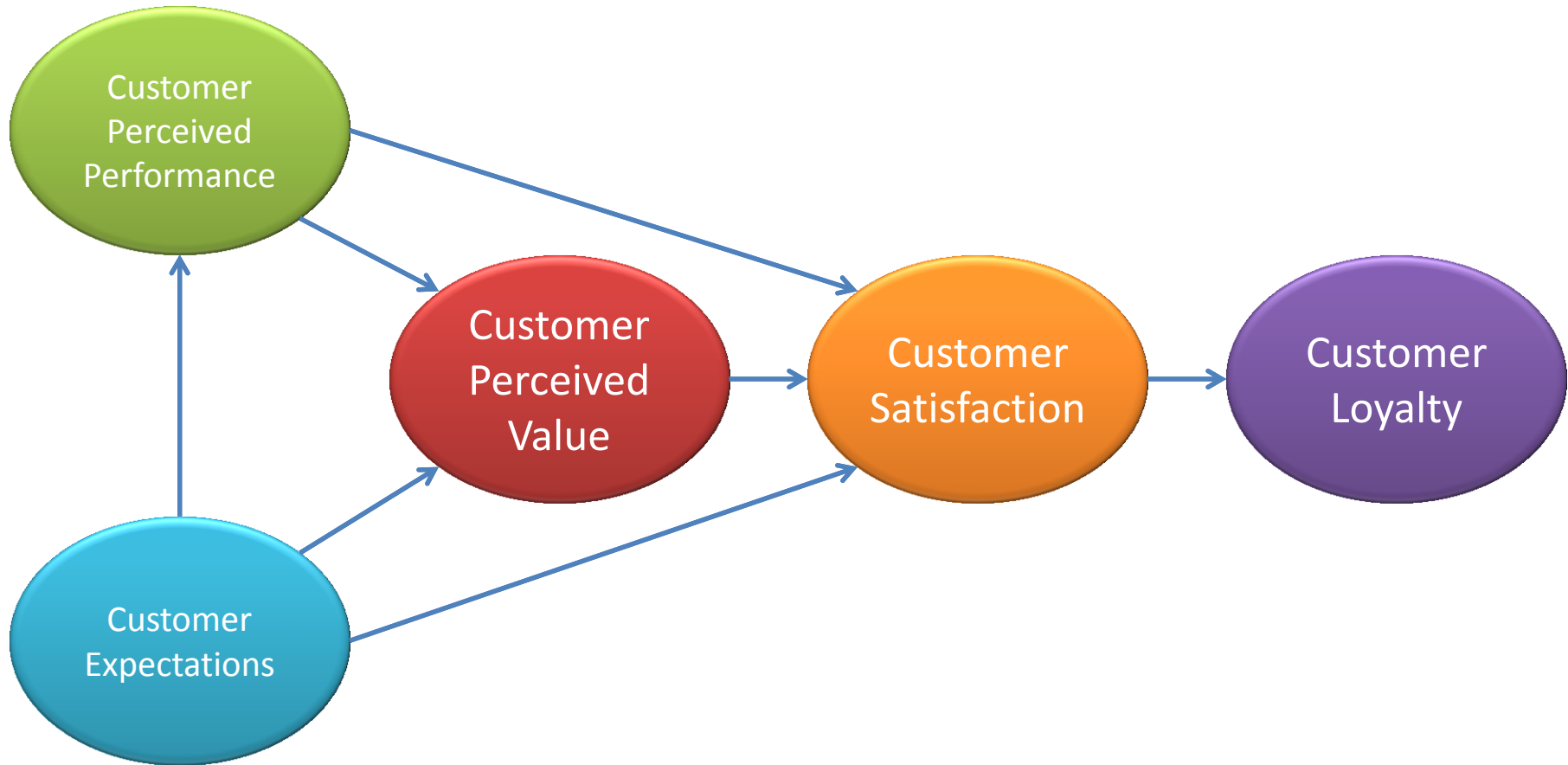
Data come with varying quality and validity

Value

Big data tend to have low value density

big data characteristics

# Customer Perceived Value, Customer Satisfaction, and Loyalty



# Measuring **Loyalty**

## 5 Variables (Items) (5:1)

(Zeithaml, Berry & Parasuraman, 1996)

Say **positive things** about XYZ to other people.

**Recommend** XYZ to someone who seeks your advice.

**Encourage friends and relatives** to do business with XYZ.

Consider XYZ your **first choice** to buy services.

**Do more business** with XYZ in the next few years.



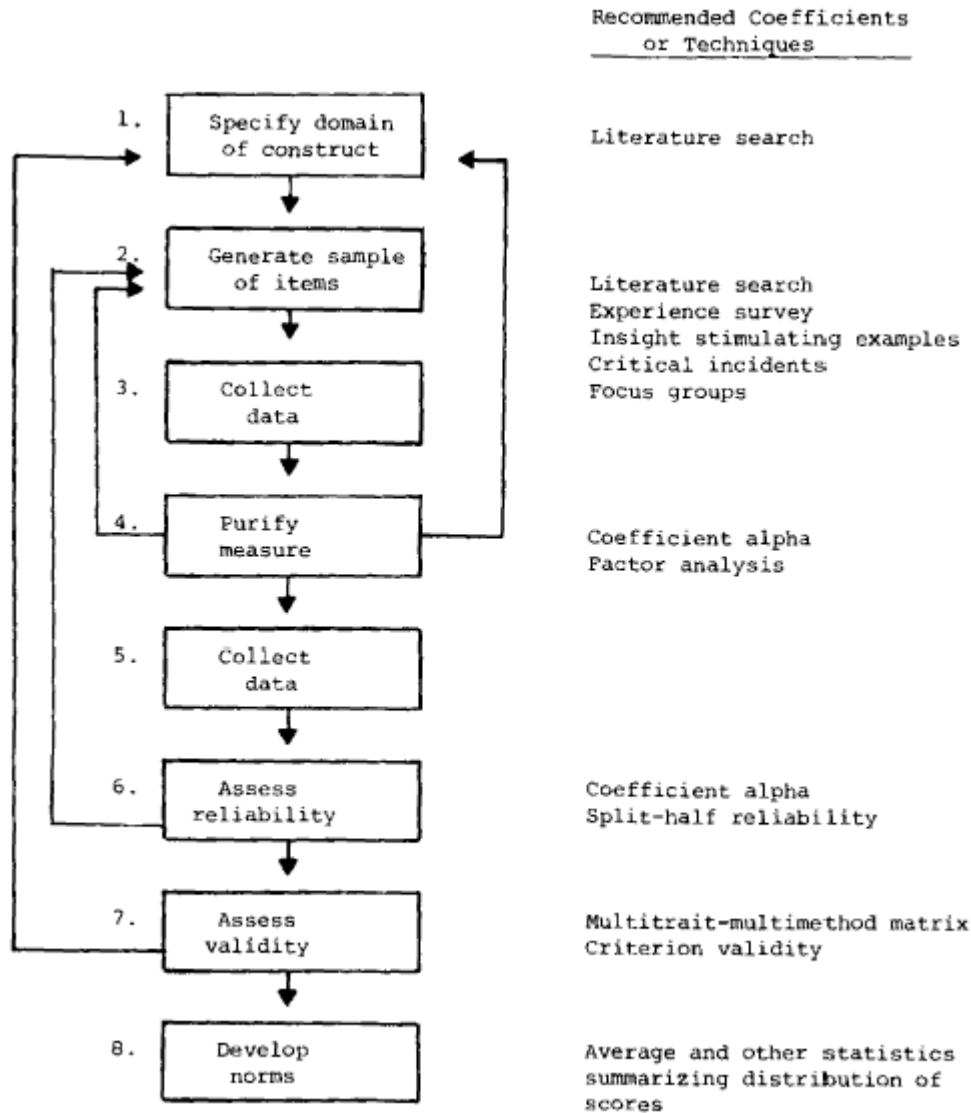
**Loyalty**



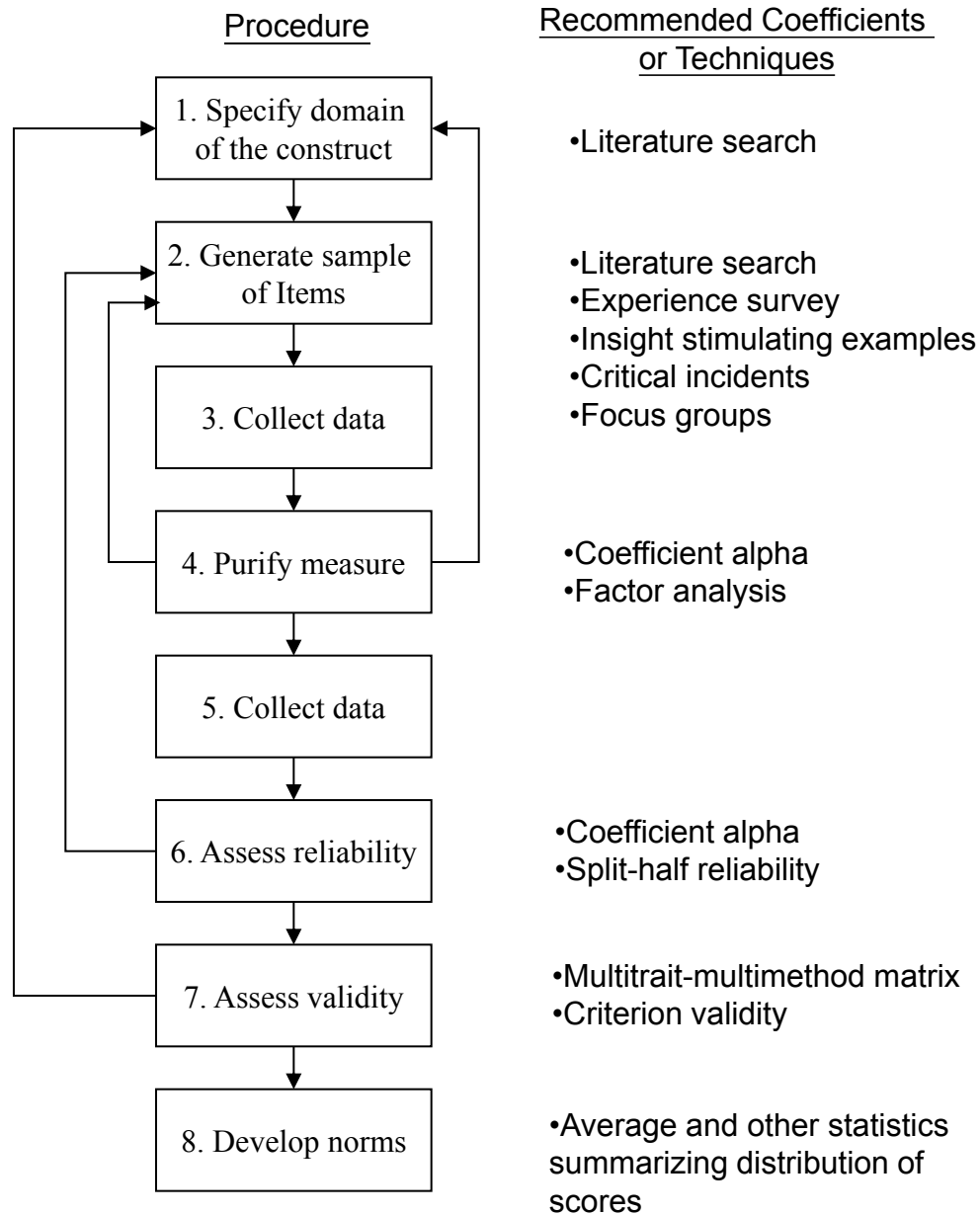
# A paradigm for developing better measures of marketing constructs

Churchill, G. A., Jr., (1979),  
A paradigm for developing better measures of marketing  
constructs.  
*Journal of Marketing Research*, 16(February), 64-73.

# Suggested Procedure for Developing Better Measures



# Suggested Procedure for Developing Better Measures (Churchill, 1979)



# The Problem and Approach

- Developing measures which have desirable reliability and validity properties
- The process of measurement or operationalization involves “rules for assigning numbers to objects to represent quantities of attributes”.
- Consider some arbitrary construct, C, such as customer satisfaction.

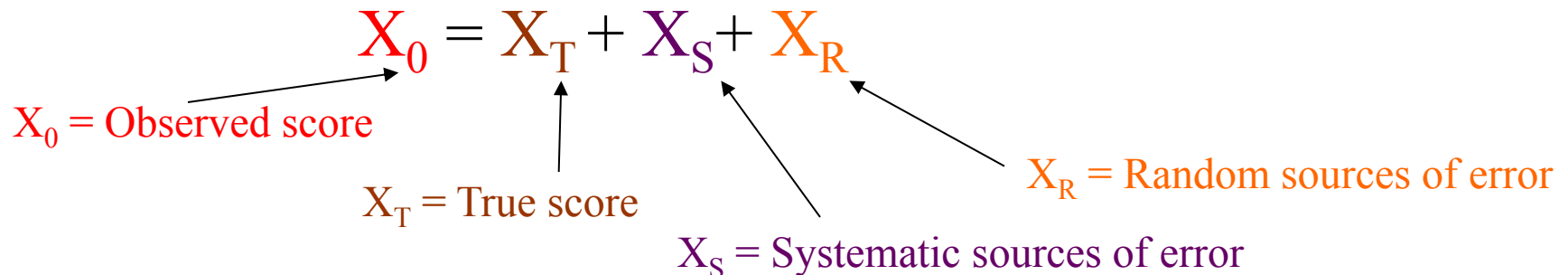
$$X_0 = X_T + X_S + X_R$$

$X_0$  = Observed score

$X_T$  = True score

$X_S$  = Systematic sources of error

$X_R$  = Random sources of error

The diagram illustrates the equation  $X_0 = X_T + X_S + X_R$ . Below the equation, three definitions are provided:  $X_0$  = Observed score (in red),  $X_T$  = True score (in brown), and  $X_S$  = Systematic sources of error (in purple). To the right,  $X_R$  = Random sources of error (in orange) is also defined. Arrows point from each definition to its corresponding variable in the equation: from  $X_0$  to the first term, from  $X_T$  to the second term, from  $X_S$  to the third term, and from  $X_R$  to the fourth term.

# Scale Development

## Example from (Davis, 1989)

**Perceived Usefulness,**  
**Perceived Ease of Use,**  
**and User Acceptance of Information Technology**

Fred D. Davis

MIS Quarterly

Vol. 13, No. 3 (Sep., 1989), pp. 319-340

# TAM (1989)

Perceived  
Usefulness

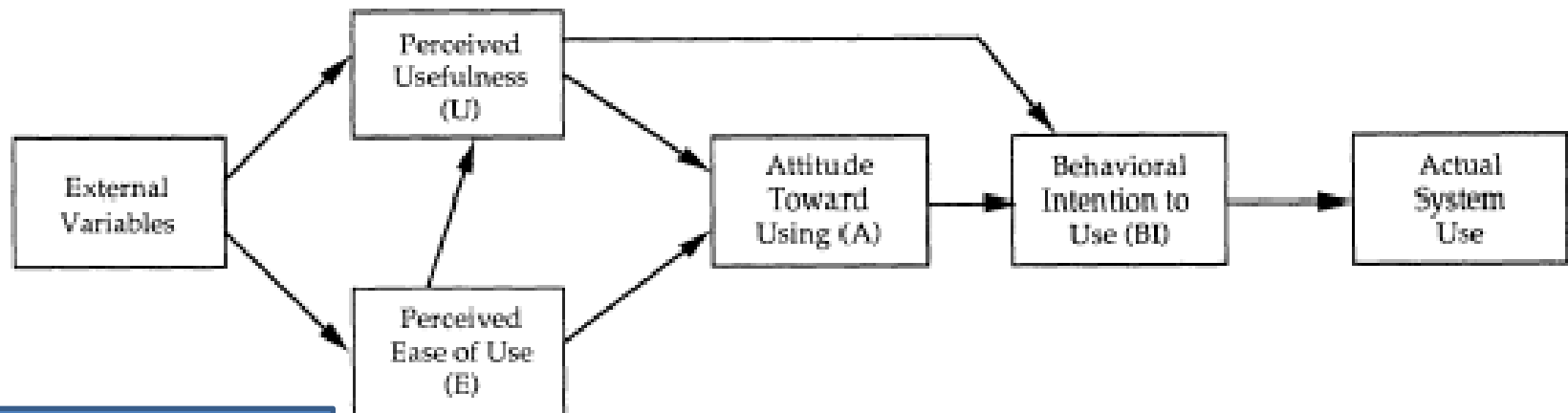
## **Perceived Usefulness, Perceived Ease of Use, and User Acceptance of Information Technology**

Perceived  
Ease of Use

**By: Fred D. Davis  
Computer and Information Systems  
Graduate School of Business  
Administration  
University of Michigan  
Ann Arbor, Michigan 48109**

# TAM (1989)

Perceived  
Usefulness



Perceived  
Ease of Use

FIGURE 2. Technology Acceptance Model (TAM).

(Davis et al., 1989)

User acceptance of computer technology :  
A comparison of two theoretical models

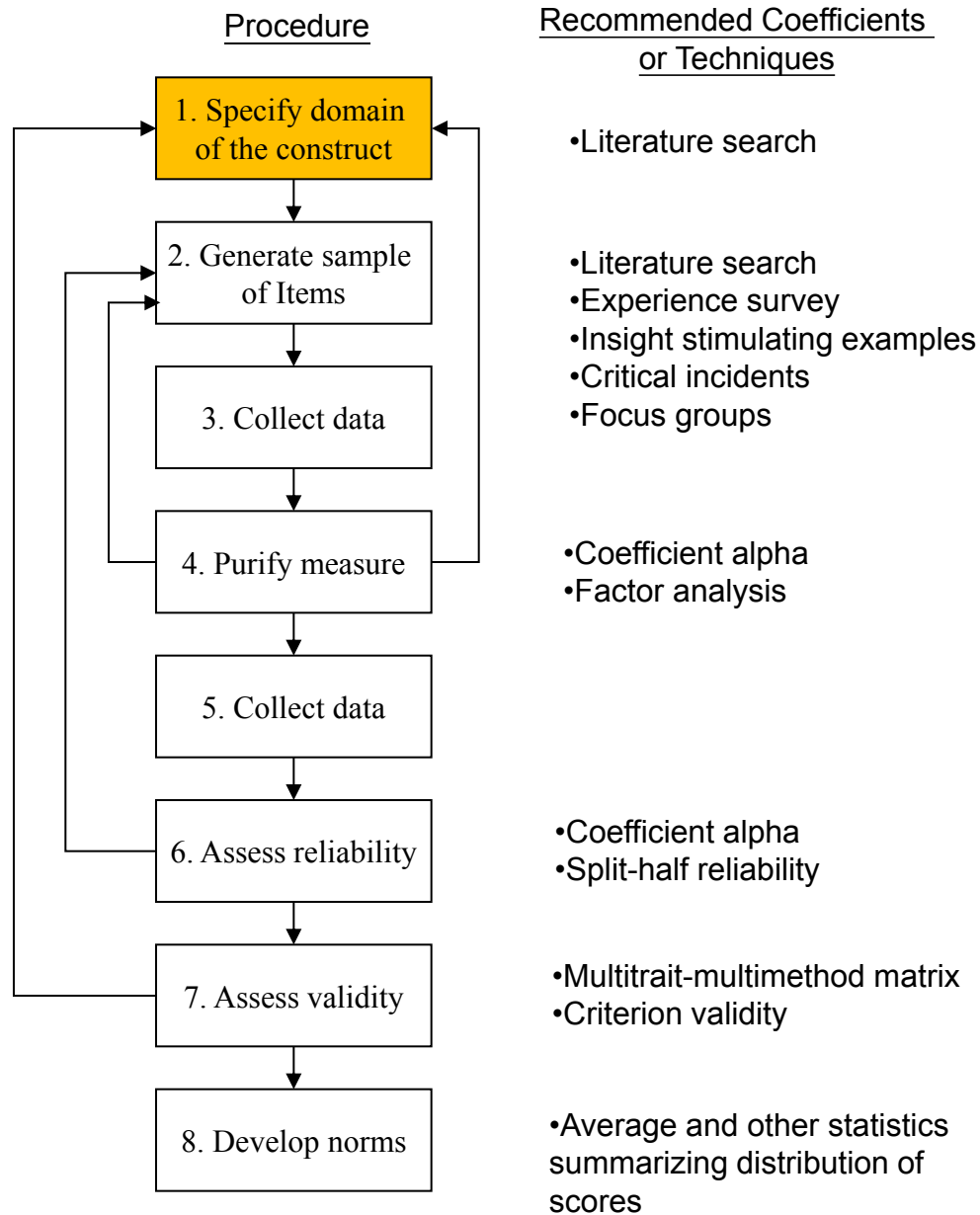
# Scale Development

## Example from (Davis, 1989)

- Scale Development and Pretest
  - A step-by-step process was used to develop new multi-item scales having high reliability and validity.
  - The conceptual definitions of perceived usefulness and perceived ease of use, stated above, were used to generate 14 candidate items for each construct from past literature.
  - Pretest interviews were then conducted to assess the semantic content of the items. Those items that best fit the definitions of the constructs were retained, yielding 10 items for each construct.
  - Next, a field study (Study 1) of 112 users concerning two different interactive computer systems was conducted in order to assess the reliability and construct validity of the resulting scales.
  - The scales were further refined and streamlined to six items per construct. A lab study (Study 2) involving 40 participants and two graphics systems was then conducted.
  - Data from the two studies were then used to assess the relationship between usefulness, ease of use, and self-reported usage.



# Suggested Procedure for Developing Better Measures (Churchill, 1979)

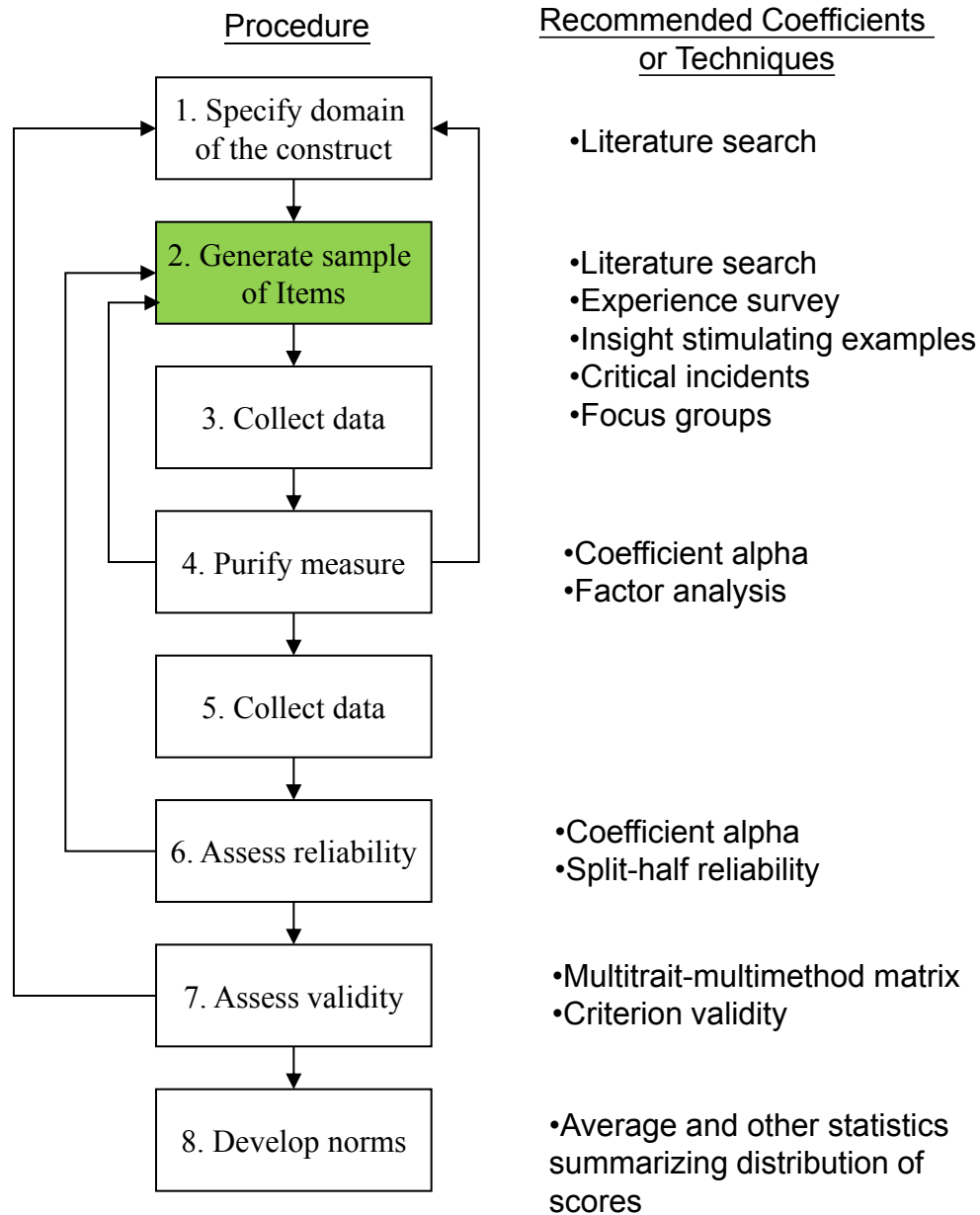


**1. Specify domain of the construct**

# 1. Specify Domain of the Construct

- Theoretical Definition
  - Perceived Usefulness:
    - The degree to which a person believes that using a particular system would enhance job performance
  - Perceived Ease of Use:
    - The degree to which a person believes that using a particular system would be free of effort.

# Suggested Procedure for Developing Better Measures (Churchill, 1979)



**2. Generate sample of Items**

## 2. Generate Sample of Items

- Literature search
- Experience survey
- Insight stimulating examples
- Critical incidents
- Focus groups

# 2. Generate Sample of Items

(Cont.)

Perceived  
Usefulness

**Table 1. Initial Scale Items for Perceived Usefulness**

1. My job would be difficult to perform without electronic mail.
2. Using electronic mail gives me greater control over my work.
3. Using electronic mail improves my job performance.
4. The electronic mail system addresses my job-related needs.
5. Using electronic mail saves me time.
6. Electronic mail enables me to accomplish tasks more quickly.
7. Electronic mail supports critical aspects of my job.
8. Using electronic mail allows me to accomplish more work than would otherwise be possible.
9. Using electronic mail reduces the time I spend on unproductive activities.
10. Using electronic mail enhances my effectiveness on the job.
11. Using electronic mail improves the quality of the work I do.
12. Using electronic mail increases my productivity.
13. Using electronic mail makes it easier to do my job.
14. Overall, I find the electronic mail system useful in my job.

Perceived  
Ease of Use

**Table 2. Initial Scale Items for Perceived Ease of Use**

1. I often become confused when I use the electronic mail system.
2. I make errors frequently when using electronic mail.
3. Interacting with the electronic mail system is often frustrating.
4. I need to consult the user manual often when using electronic mail.
5. Interacting with the electronic mail system requires a lot of my mental effort.
6. I find it easy to recover from errors encountered while using electronic mail.
7. The electronic mail system is rigid and inflexible to interact with.
8. I find it easy to get the electronic mail system to do what I want it to do.
9. The electronic mail system often behaves in unexpected ways.
10. I find it cumbersome to use the electronic mail system.
11. My interaction with the electronic mail system is easy for me to understand.
12. It is easy for me to remember how to perform tasks using the electronic mail system.
13. The electronic mail system provides helpful guidance in performing tasks.
14. Overall, I find the electronic mail system easy to use.

# 2. Generate Sample of Items

(Cont.)

Perceived  
Usefulness

**Table 1. Initial Scale Items for Perceived Usefulness**

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# 2. Generate Sample of Items

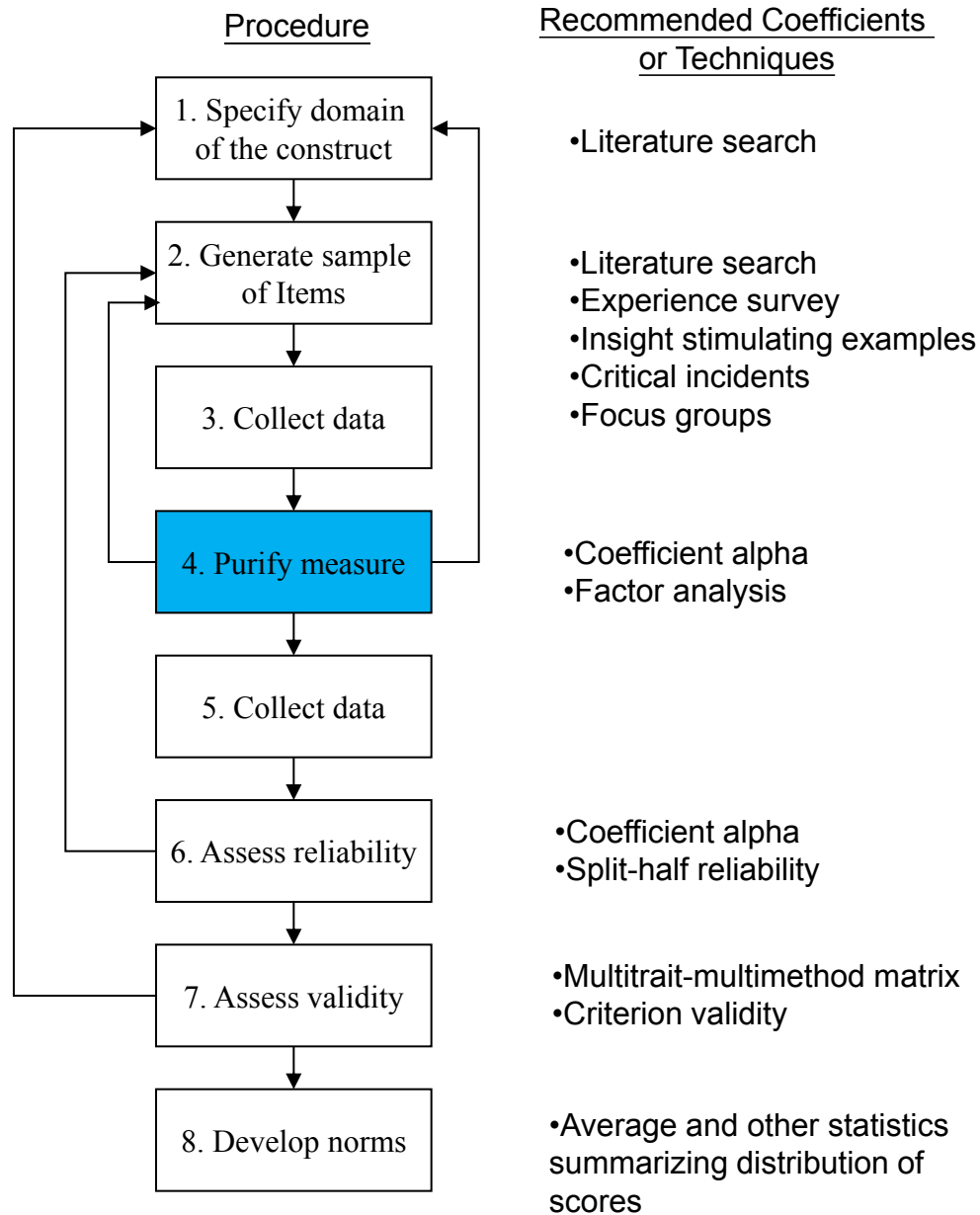
(Cont.)

Perceived  
Ease of Use

**Table 2. Initial Scale Items for Perceived Ease of Use**

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# Suggested Procedure for Developing Better Measures (Churchill, 1979)



**4. Purify measure**



# 4. Purify the Measure

Perceived  
Usefulness

Table 3. Pretest Results: Perceived Usefulness

Old Item #	Item	Rank	New Item #	Cluster
1	Job Difficult Without	13		C
2	Control Over Work	9	2	
3	Job Performance	2	6	A
4	Addresses My Needs	12		C
5	Saves Me Time	11		B
6	Work More Quickly	7	3	B
7	Critical to My Job	5	4	C
8	Accomplish More Work	6	7	B
9	Cut Unproductive Time	10		B
10	Effectiveness	1	8	A
11	Quality of Work	3	1	A
12	Increase Productivity	4	5	B
13	Makes Job Easier	8	9	C
14	Useful	NA	10	NA

Perceived  
Ease of Use

Table 4. Pretest Results: Perceived Ease of Use

Old Item #	Item	Rank	New Item #	Cluster
1	Confusing	7		B
2	Error Prone	13		
3	Frustrating	3	3	B
4	Dependence on Manual	9	(replace)	C
5	Mental Effort	5	7	B
6	Error Recovery	10		
7	Rigid & Inflexible	6	5	A
8	Controllable	1	4	A
9	Unexpected Behavior	11		
10	Cumbersome	2	1	A
11	Understandable	4	8	B
12	Ease of Remembering	8	6	C
13	Provides Guidance	12	(replace)	C
14	Easy to Use	NA	10	NA
NA	Ease of Learning	NA	2	NA
NA	Effort to Become Skillful	NA	9	NA

# 4. Purify the Measure

Perceived  
Usefulness

**Table 3. Pretest Results: Perceived Usefulness**

Old Item #	Item	Rank	New Item #	Cluster
1	Job Difficult Without	13		C
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9	Cut Unproductive Time	10		B
10	Effectiveness	1	8	A
11	Quality of Work	3	1	A
12	Increase Productivity	4	5	B
13	Makes Job Easier	8	9	C
14	Useful	NA	10	NA

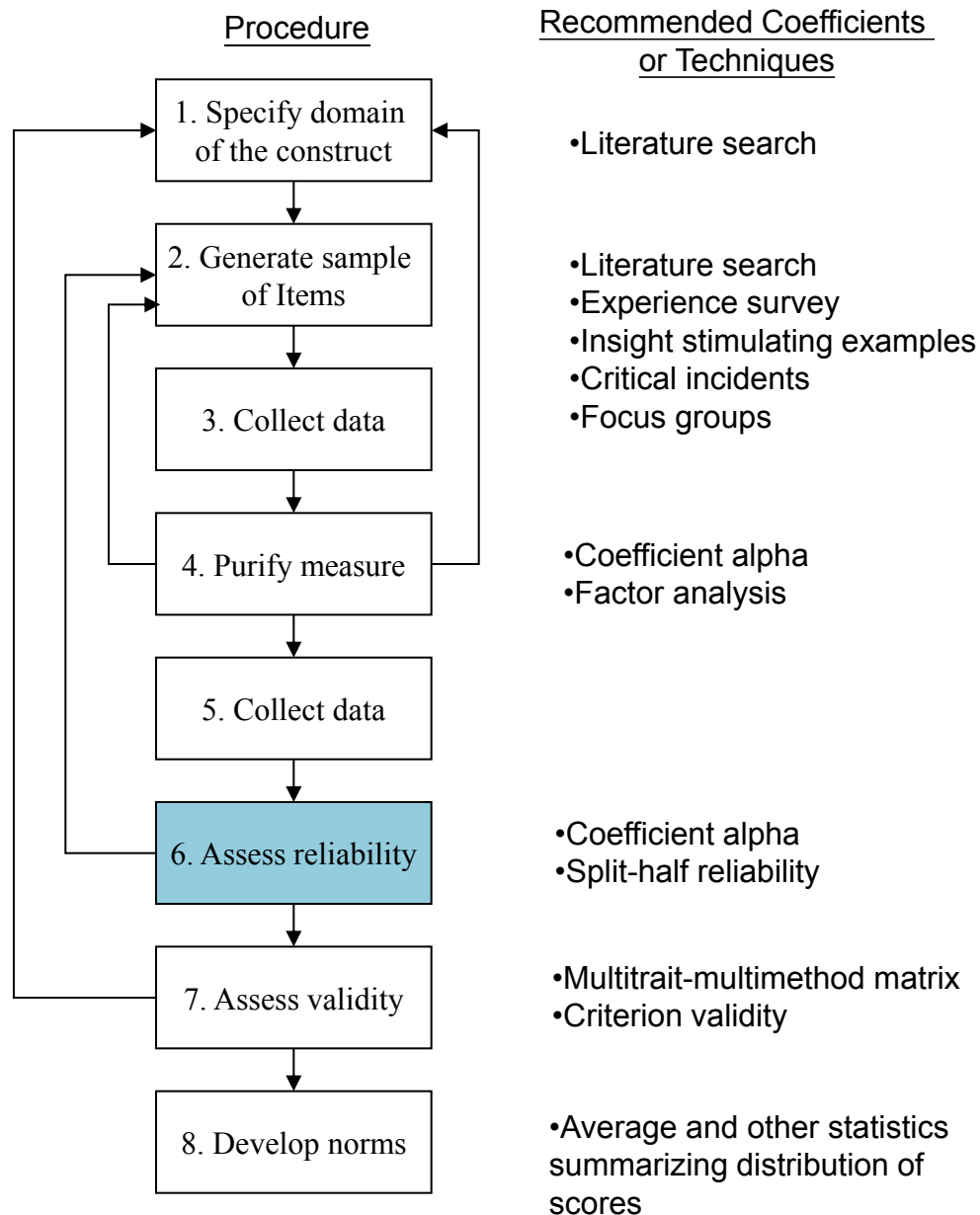
# 4. Purify the Measure

Perceived  
Ease of Use

**Table 4. Pretest Results: Perceived Ease of Use**

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2	Error Prone	13		
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8	Controllable	1	4	A
9	Unexpected Behavior	11		
10	Cumbersome	2	1	A
11	Understandable	4	8	B
12	Ease of Remembering	8	6	C
13	Provides Guidance	12	(replace)	C
14	Easy to Use	NA	10	NA
NA	Ease of Learning	NA	2	NA
NA	Effort to Become Skillful	NA	9	NA

# Suggested Procedure for Developing Better Measures (Churchill, 1979)



6. Assess reliability

# 6. Assess Reliability with New Data

**Table 6. Factor Analysis of Perceived Usefulness and Ease of Use Questions: Study 1**

<b>Scale Items</b>	<b>Factor 1 (Usefulness)</b>	<b>Factor 1 (Ease of Use)</b>
<b>Usefulness</b>		
1 Quality of Work	.80	.10
2 Control over Work	.86	-.03
3 Work More Quickly	.79	.17
4 Critical to My Job	.87	-.11
5 Increase Productivity	.87	.10
6 Job Performance	.93	-.07
7 Accomplish More Work	.91	-.02
8 Effectiveness	.96	-.03
9 Makes Job Easier	.80	.16
10 Useful	.74	.23
<b>Ease of Use</b>		
1 Cubersome	.00	.73
2 Ease of Learning	.08	.60
3 Frustrating	.02	.65
4 Controllable	.13	.74
5 Rigid & Inflexible	.09	.54
6 Ease of Remembering	.17	.62
7 Mental Effort	-.07	.76
8 Understandable	.29	.64
9 Effort to Be Skillful	-.25	.88
10 Easy to Use	.23	.72

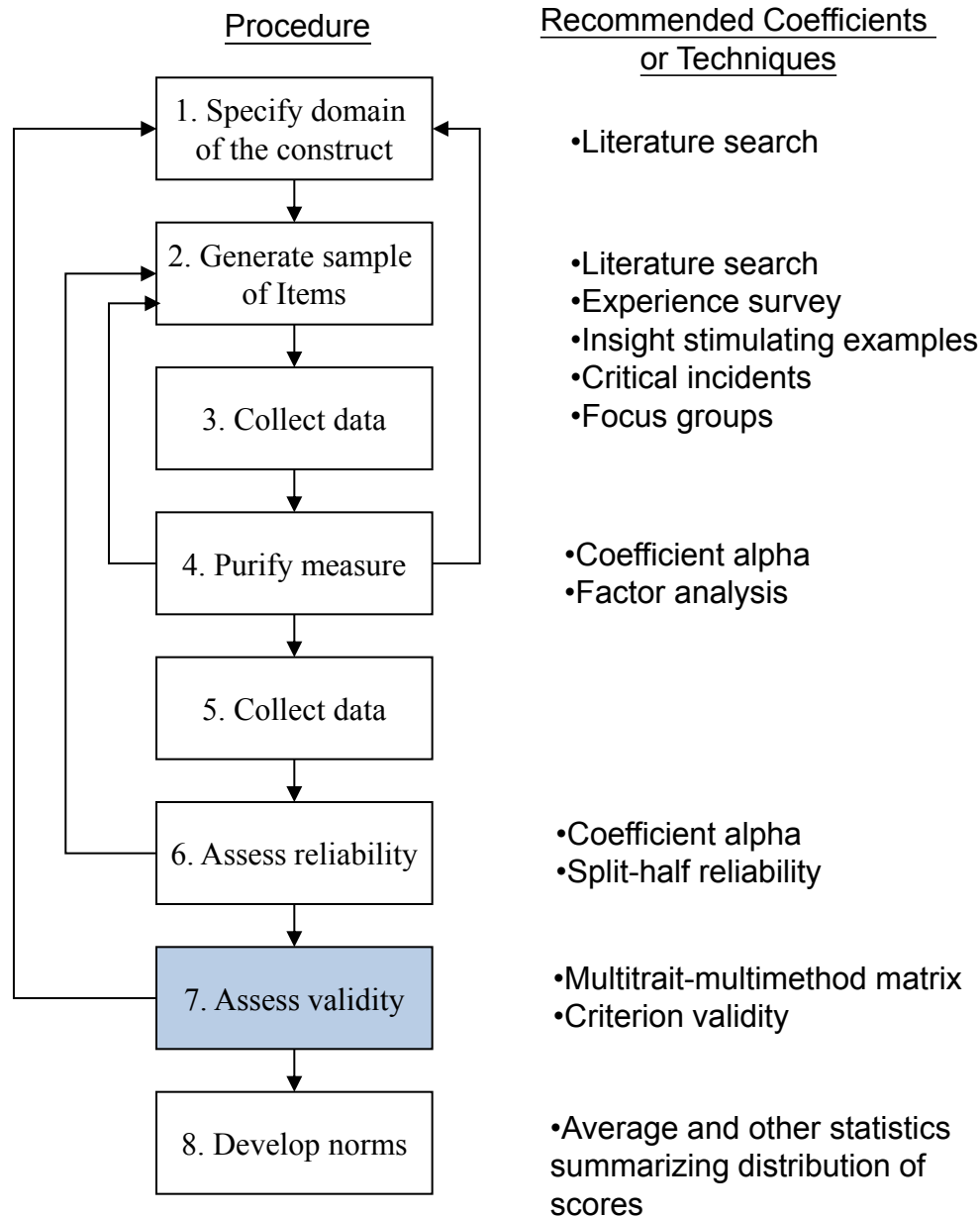
# 6. Assess Reliability with New Data

## (cont.)

**Table 7. Factor Analysis of Perceived Usefulness and Ease of Use Items: Study 2**

<b>Scale Items</b>		<b>Factor 1 (Usefulness)</b>	<b>Factor 2 (Ease of Use)</b>
<b>Usefulness</b>			
1	Work More Quickly	.91	.01
2	Job Performance	.98	-.03
3	Increase Productivity	.98	-.03
4	Effectiveness	.94	.04
5	Makes Job Easier	.95	-.01
6	Useful	.88	.11
<b>Ease of Use</b>			
1	Easy to Learn	-.20	.97
2	Controllable	.19	.83
3	Clear & Understandable	-.04	.89
4	Flexible	.13	.63
5	Easy to Become Skillful	.07	.91
6	Easy to Use	.09	.91

# Suggested Procedure for Developing Better Measures (Churchill, 1979)



**7. Assess validity**

# 7. Assess Construct Validity

- Multitrait-multimethod matrix
- Criterion validity

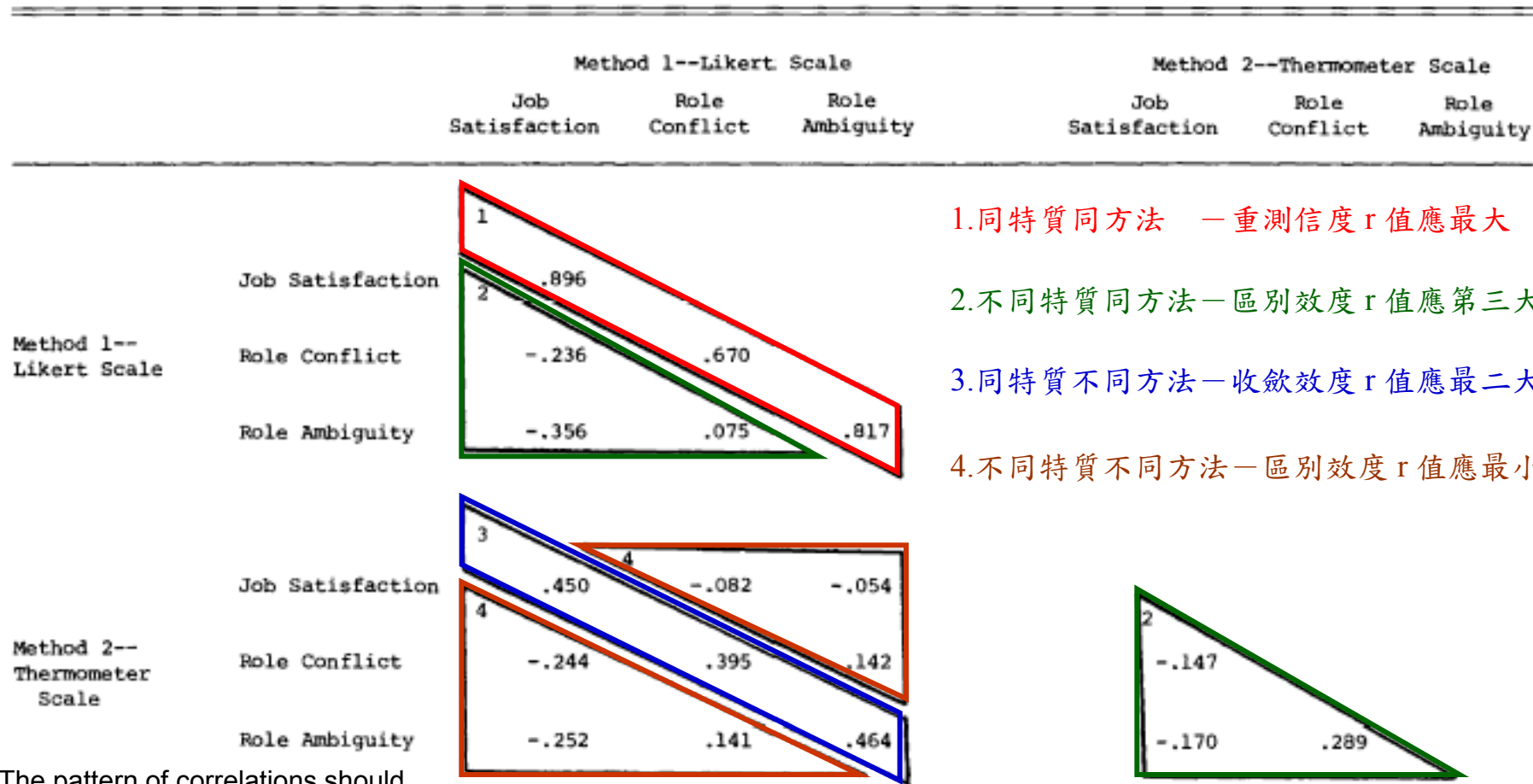


2. The validity coefficients (3) should be higher than the correlations in the heterotrait-monomethod triangles (2) which suggests that the correlation within a trait measured by different methods must be higher than the correlations between traits which have method in common.

# MTMM

1. Entries in the validity diagonal (3) should be higher than the correlations that occupy the same row and column in the heteromethod block (4). This is a minimum requirement.

## MULTITRAIT-MULTIMETHOD MATRIX



1. 同特質同方法 — 重測信度 r 值應最大

2. 不同特質同方法 — 區別效度 r 值應第三大

3. 同特質不同方法 — 收斂效度 r 值應最第二大

4. 不同特質不同方法 — 區別效度 r 值應最小

3. The pattern of correlations should be the same in all of the heterotrait triangles, e.g., both (2) and (4).

# Does the Measure as Expected?

(Churchill, 1979)

- Four separate propositions (Nunnally, 1967, p. 93)
  - 1. The constructs **job satisfaction (A)** and **likelihood of quitting (B)** are related.
  - 2. The scale **X** provides a measure of **A**.
  - 3. **Y** provides a measure of **B**.
  - 4. **X** and **Y** correlate positively.
- Only the fourth proposition is directly examined with empirical data.
- To establish that X truly measures A, one must assume that propositions 1 and 3 are correct.
- One must have a good measure for B, and the theory relating A and B must be true.
- The analyst tries to establish the construct validity of a measure by relating it to a number of other constructs and not simply one.

# 7. Assess Construct Validity

**Table 8. Correlations Between Perceived Usefulness, Perceived Ease of Use, and Self-Reported System Usage**

	Correlation		
	Usefulness & Usage	Ease of Use & Usage	Ease of Use & Usefulness
<b>Study 1</b>			
Electronic Mail (n = 109)	.56***	.32***	.56***
XEDIT (n = 75)	.68***	.48***	.69***
Pooled (n = 184)	.63***	.45***	.64***
<b>Study 2</b>			
Chart-Master (n = 40)	.71***	.25	.25
Pendraw (n = 40)	.59***	.47***	.38**
Pooled (n = 80)	.85***	.59***	.56***
<b>Davis, et al. (1989) (n = 107)</b>			
Wave 1	.65***	.27**	.10
Wave 2	.70***	.12	.23**

\*\*\* p<.001

\*\* p<.01

\* p<.05

# 7. Assess Construct Validity (cont.)

**Table 9. Regression Analyses of the Effect of Perceived Usefulness and Perceived Ease of Use on Self-Reported Usage**

	Independent Variables		R <sup>2</sup>
	Usefulness	Ease of Use	
<b>Study 1</b>			
Electronic Mail (n = 109)	.55***	.01	.31
XEDIT (n = 75)	.69***	.02	.46
Pooled (n = 184)	.57***	.07	.38
<b>Study 2</b>			
Chart-Master (n = 40)	.69***	.08	.51
Pendraw (n = 40)	.76***	.17	.71
Pooled (n = 80)	.75***	.17*	.74
<b>Davis, et al. (1989) (n = 107)</b>			
After 1 Hour	.62***	.20***	.45
After 14 Weeks	.71***	-.06	.49

\*\*\* p<.001    \*\* p<.01    \* p<.05

# Final Measurement Scales for Perceived Usefulness and Perceived Ease of Use

## Perceived Usefulness

Using CHART-MASTER in my job would enable me to accomplish tasks more quickly.

likely | \_\_\_\_\_ | quite | \_\_\_\_\_ | neither | \_\_\_\_\_ | \_\_\_\_\_ | \_\_\_\_\_ | unlikely  
extremely

Using CHART-MASTER would improve my job performance.

likely | \_\_\_\_\_ | quite | \_\_\_\_\_ | neither | \_\_\_\_\_ | \_\_\_\_\_ | \_\_\_\_\_ | unlikely  
extremely

Using CHART-MASTER in my job would increase my productivity.

likely | \_\_\_\_\_ | quite | \_\_\_\_\_ | neither | \_\_\_\_\_ | \_\_\_\_\_ | \_\_\_\_\_ | unlikely  
extremely

Using CHART-MASTER would enhance my effectiveness on the job.

likely | \_\_\_\_\_ | quite | \_\_\_\_\_ | neither | \_\_\_\_\_ | \_\_\_\_\_ | \_\_\_\_\_ | unlikely  
extremely

Using CHART-MASTER would make it easier to do my job.

likely | \_\_\_\_\_ | quite | \_\_\_\_\_ | neither | \_\_\_\_\_ | \_\_\_\_\_ | \_\_\_\_\_ | unlikely  
extremely

I would find CHART-MASTER useful in my job.

likely | \_\_\_\_\_ | quite | \_\_\_\_\_ | neither | \_\_\_\_\_ | \_\_\_\_\_ | \_\_\_\_\_ | unlikely  
extremely

# Final Measurement Scales for Perceived Usefulness and Perceived Ease of Use

## Perceived Ease of Use

Learning to operate CHART-MASTER would be easy for me.

likely								unlikely
	extremely	quite	slightly	neither	slightly	quite	extremely	

I would find it easy to get CHART-MASTER to do what I want it to do.

likely								unlikely
	extremely	quite	slightly	neither	slightly	quite	extremely	

My interaction with CHART-MASTER would be clear and understandable.

likely								unlikely
	extremely	quite	slightly	neither	slightly	quite	extremely	

I would find CHART-MASTER to be flexible to interact with.

likely								unlikely
	extremely	quite	slightly	neither	slightly	quite	extremely	

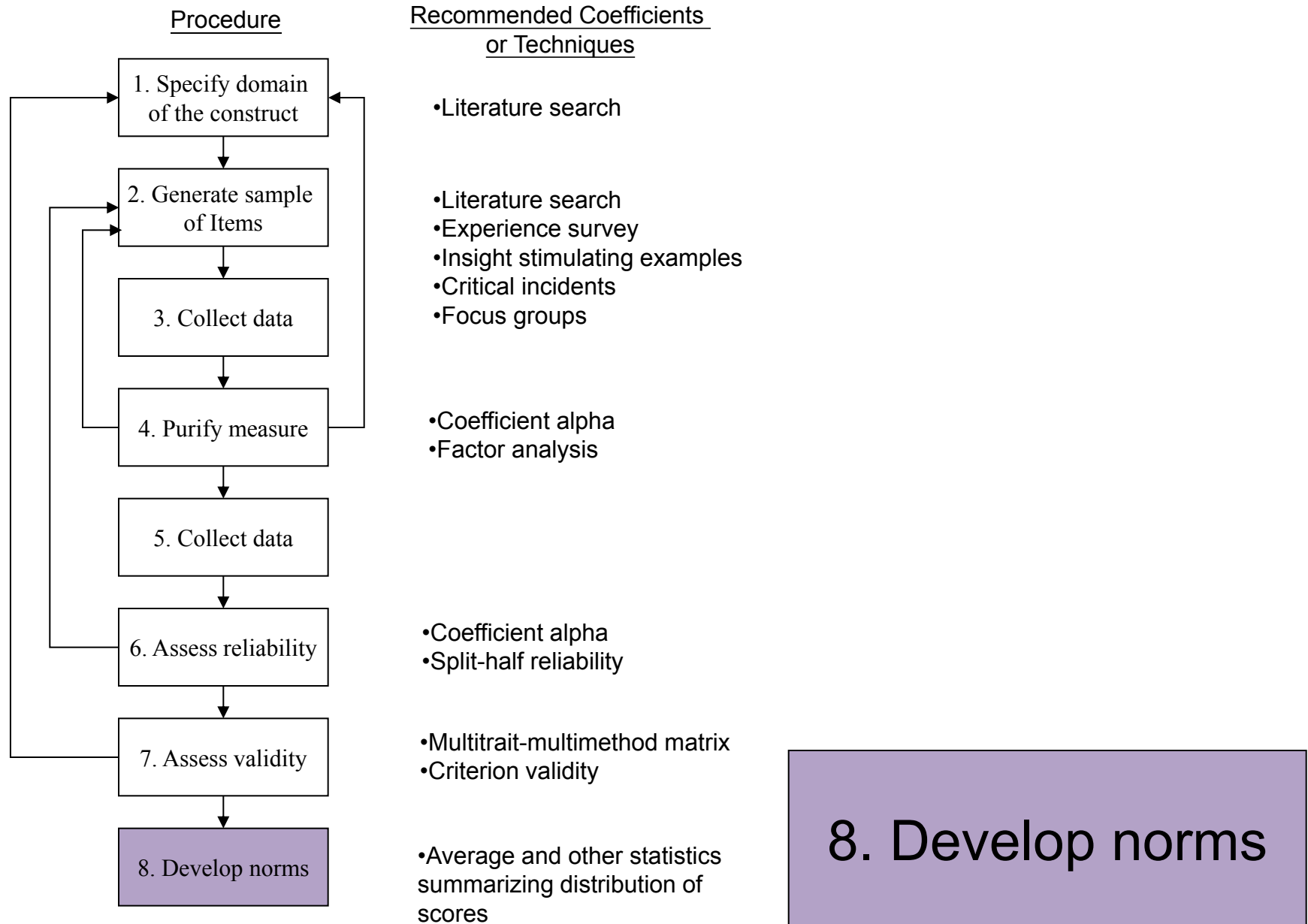
It would be easy for me to become skillful at using CHART-MASTER.

likely								unlikely
	extremely	quite	slightly	neither	slightly	quite	extremely	

I would find CHART-MASTER easy to use.

likely								unlikely
	extremely	quite	slightly	neither	slightly	quite	extremely	

# Suggested Procedure for Developing Better Measures (Churchill, 1979)



# 8 Developing Norms

- A better way of assessing the position of the individual on the characteristic is to compare the person's score with the score achieved by other people.
- Norm quality is a function of both the number of cases on which the average is based and their representativeness.



# Summary of Suggested Procedure for Developing Better Measures

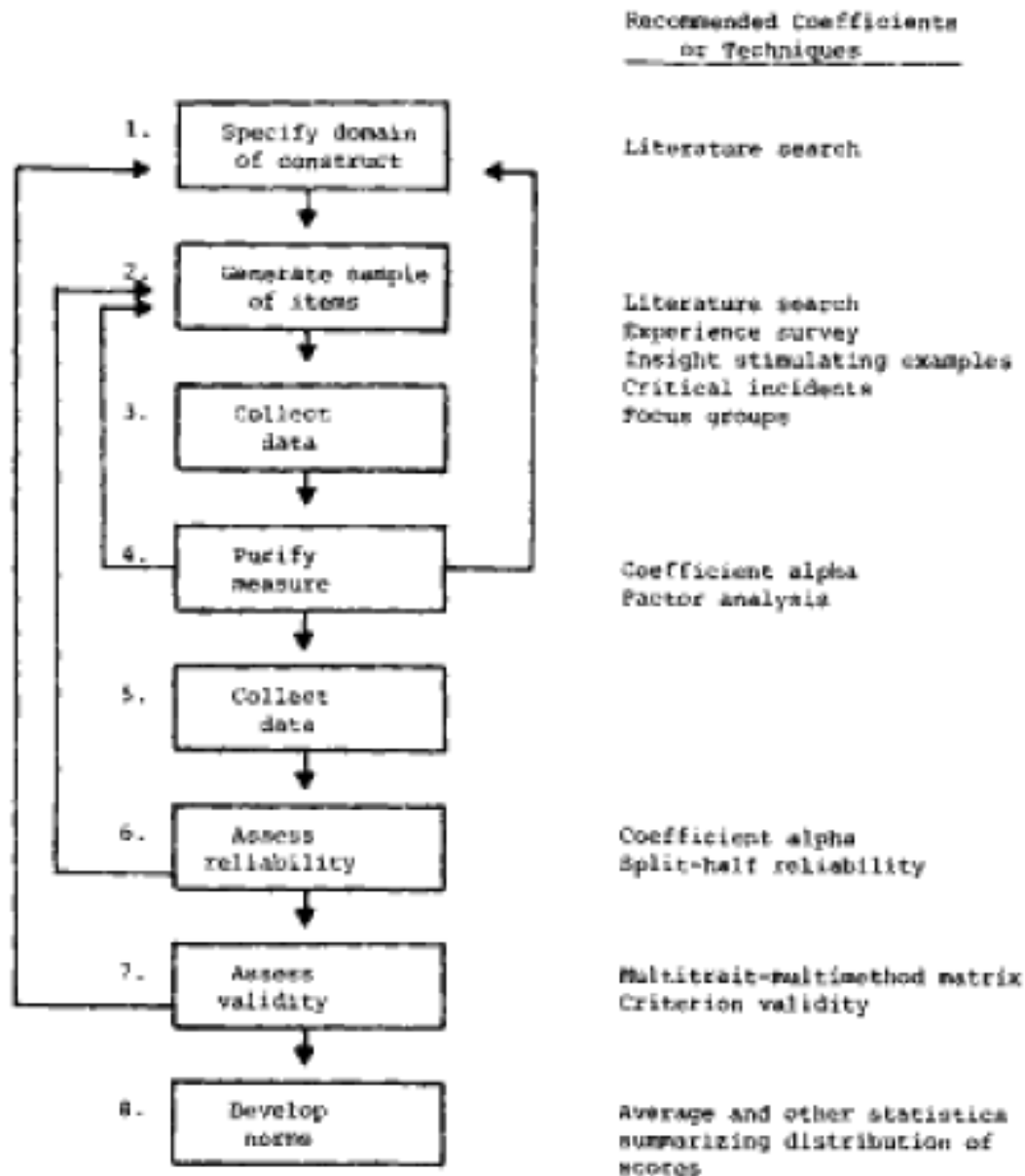
(Churchill, 1979)

- Researchers doing applied work and practitioners could at least be expected to complete the process through step 4.
- Marketing researchers are already collecting data relevant to steps 5-8.

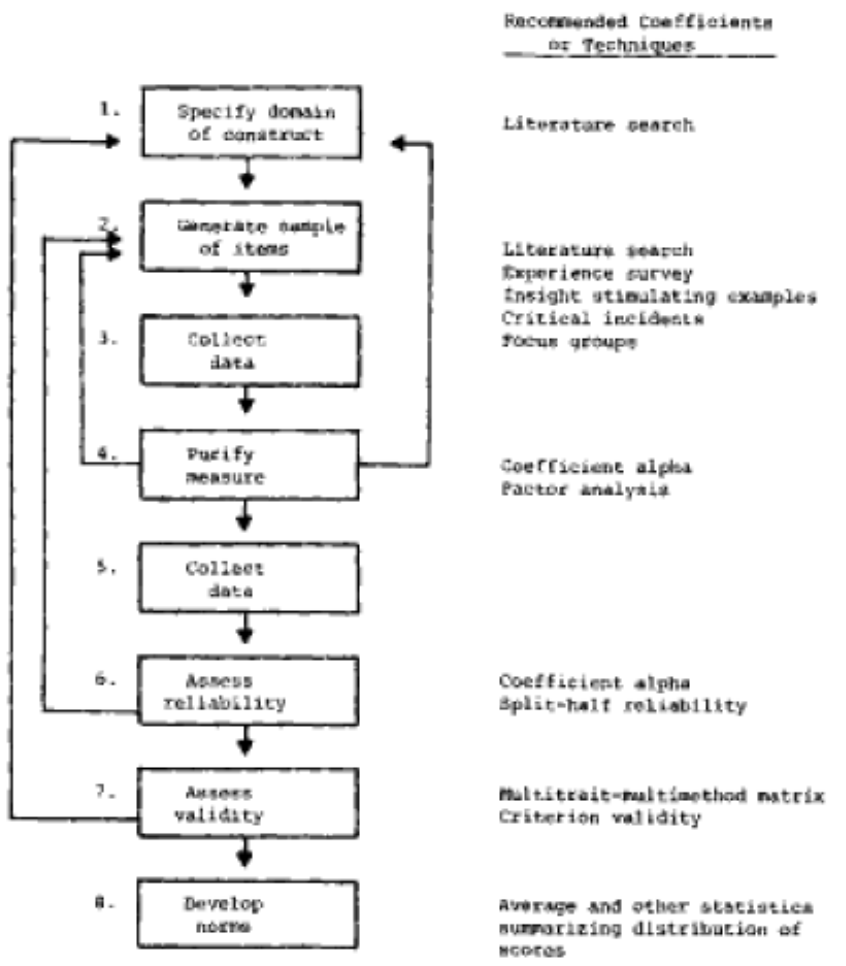
# Current Practice in Scale Development

- Churchill, G. A., Jr., (1979). A paradigm for developing better measures of marketing constructs. *Journal of Marketing Research*, 16(February), 64-73.
- Gerbing, D. W., & Anderson, J. C. (1988). An updated paradigm for scale development incorporating unidimensionality and its assessment. *Journal of Marketing Research*, 25(2), 186-192.
- DeVellis, R. F. (1991). *Scale development: Theory and applications*. Newbury Park, CA: Sage Publications.
- Spector, P. E. (1992). *Summated rating scale construction: An introduction*. Newbury Park, CA: Sage Publications.
- Netemeyer, R. G., Bearden, W. O., & Sharma, S. (2003). *Scaling procedures: Issues and applications*. Thousand Oaks, CA: Sage Publications.
- Clark R. A. (2006), Consumer Independence: Conceptualization, Measurement and Validation of a Previously Unmeasured Social Response Tendency, Ph.D. Dissertation, College of Business of The Florida State University.

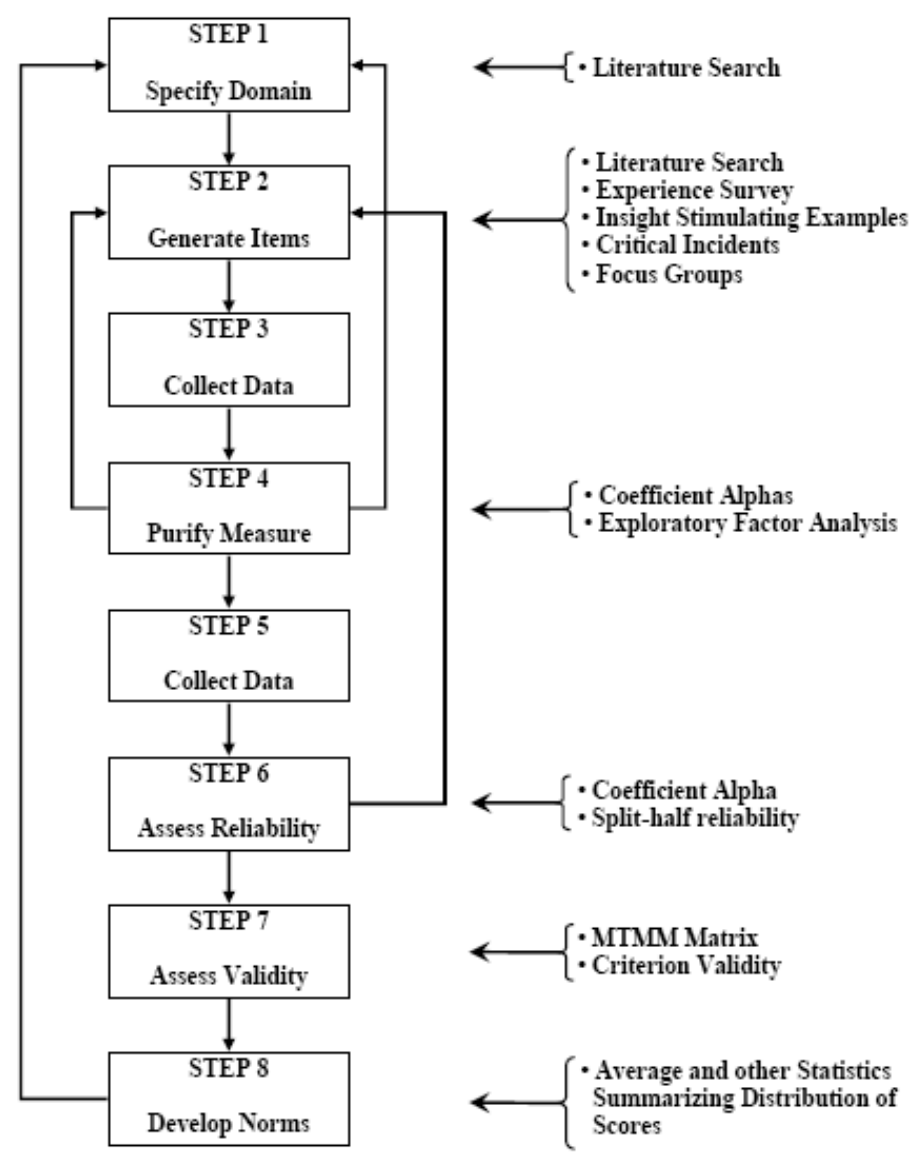
# Suggested Procedure for Developing Better Measures (Churchill, 1979)



# Current Practice in Scale Development

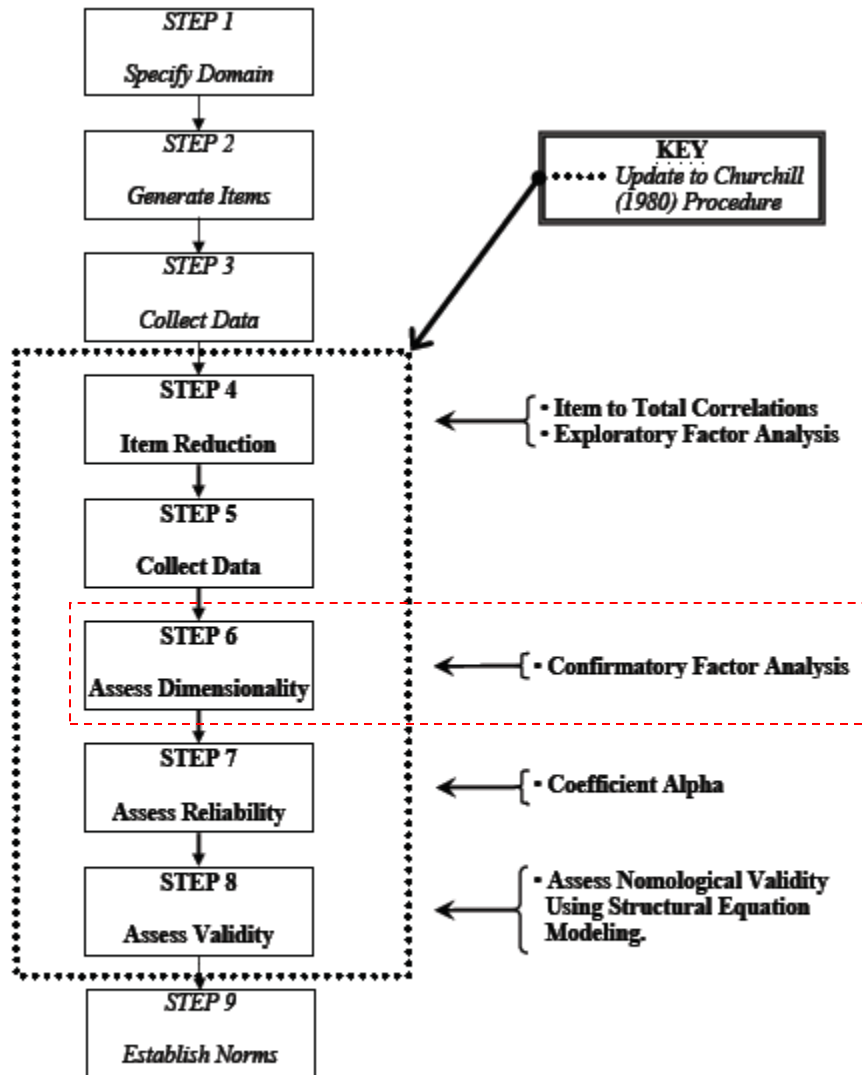


(Churchill, 1979)



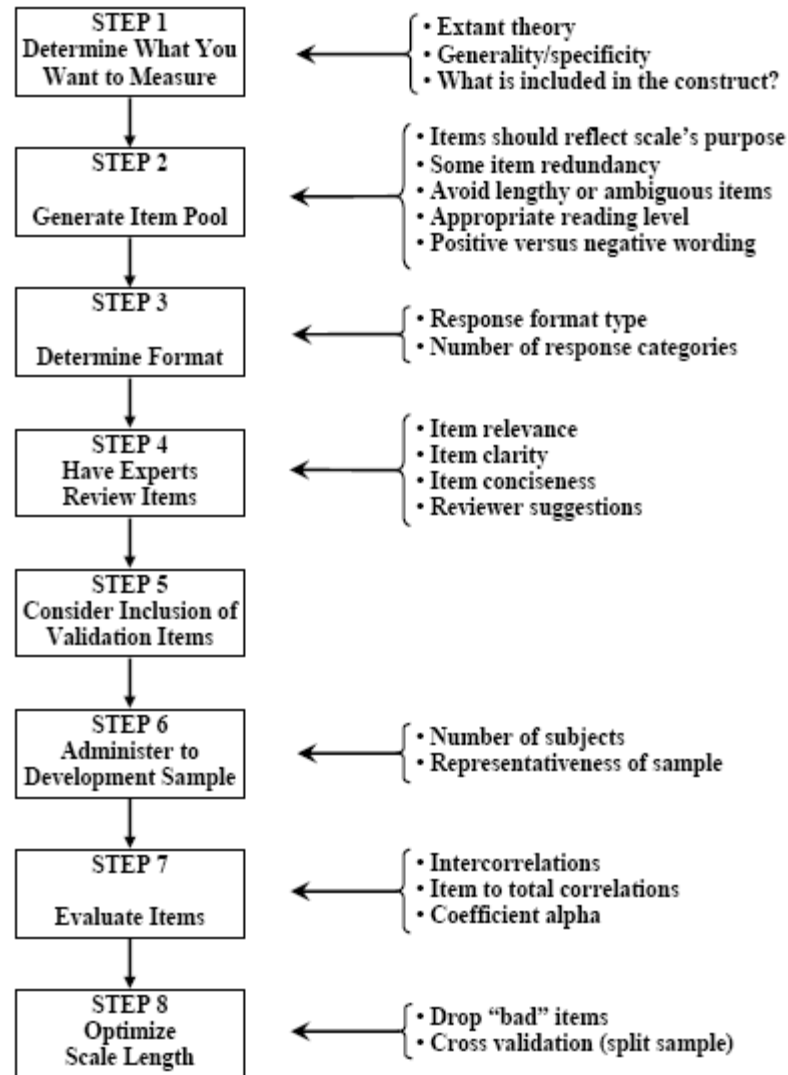
**Figure 3.1**  
**Churchill's (1980) Scale Development Procedure**  
*Adapted from Churchill (1979)*

# (Gerbing & Anderson, 1988)



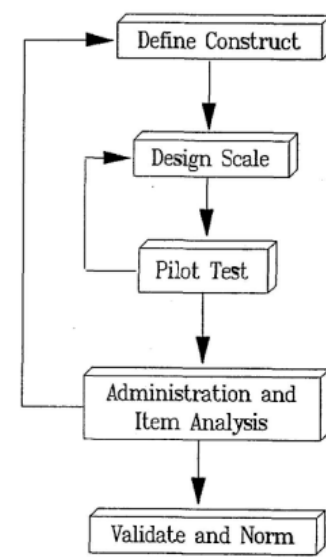
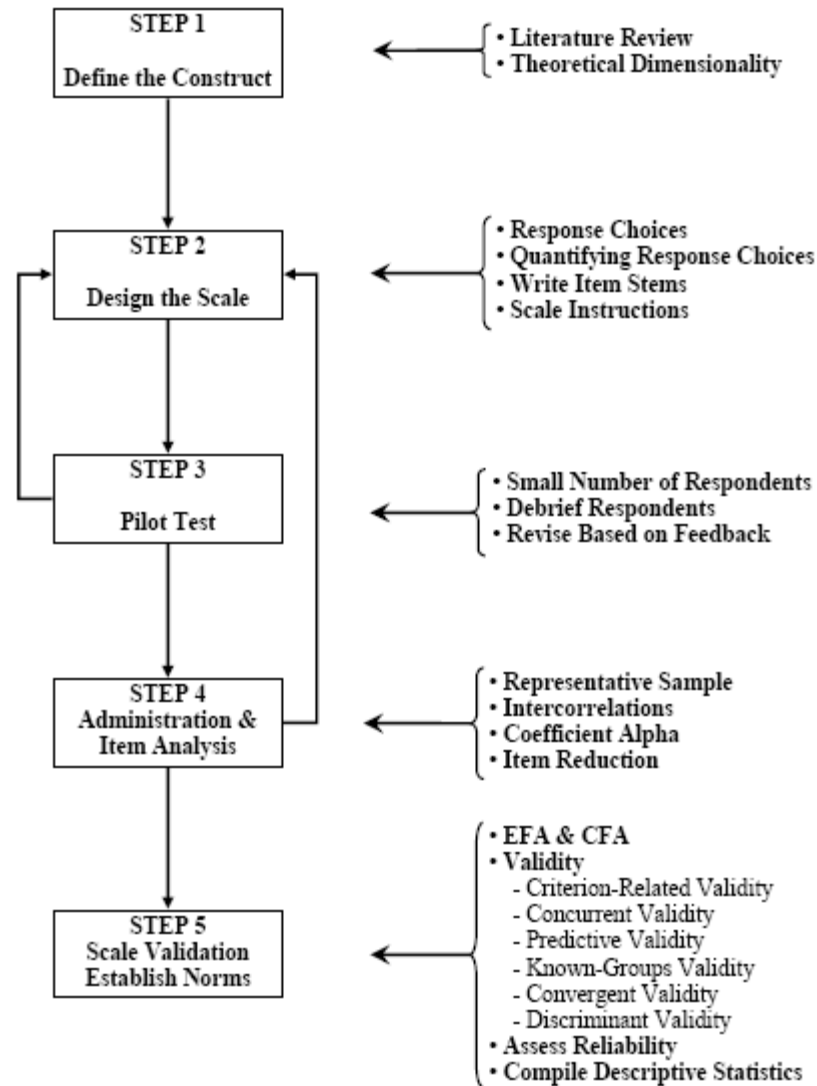
**Figure 3.2**  
**Gerbing & Anderson's (1988) Updated Paradigm**

# (DeVellis, 1991)



**Figure 3.3**  
**DeVellis's (1991) Scale Development Approach**

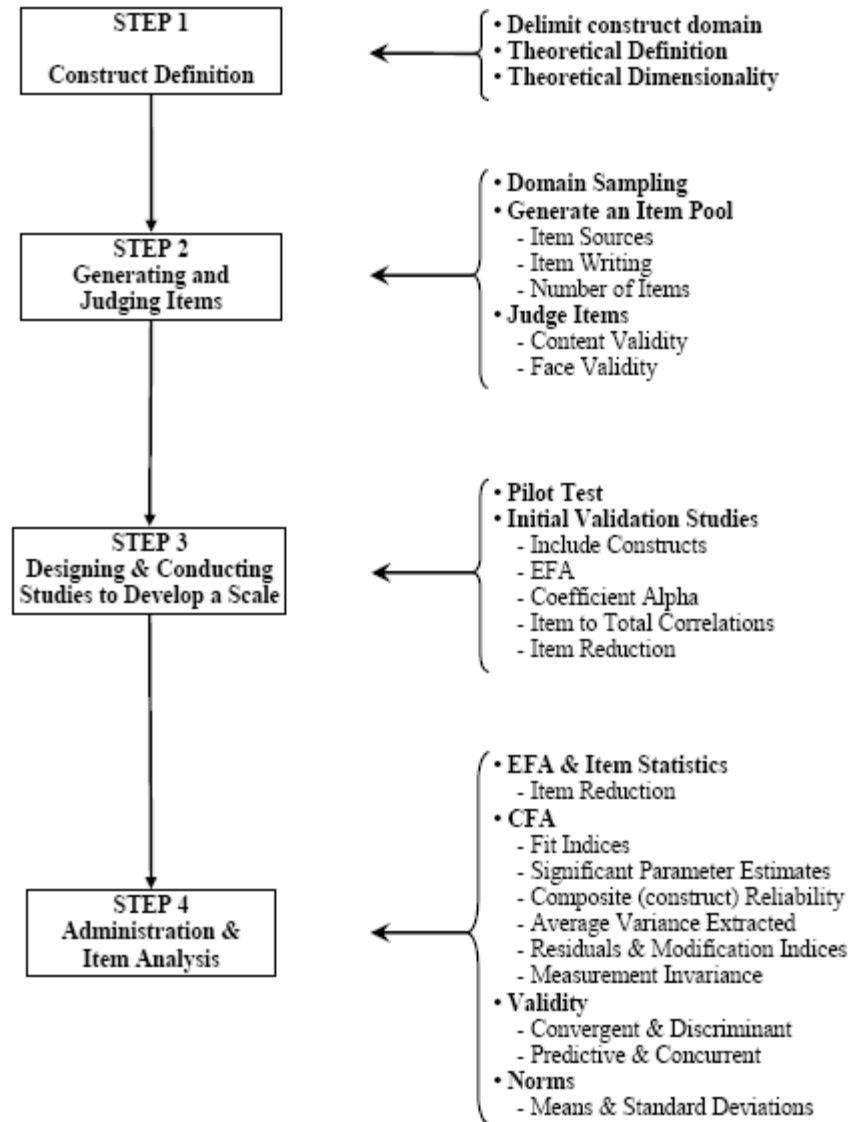
# (Spector, 1992)



Major Steps to Developing a Summated Rating Scale (Spector, 1992, p.8)

**Figure 3.4**  
**Spector's (1992) Summated Rating Scale Development Procedure**  
*Adapted from Spector (1992)*

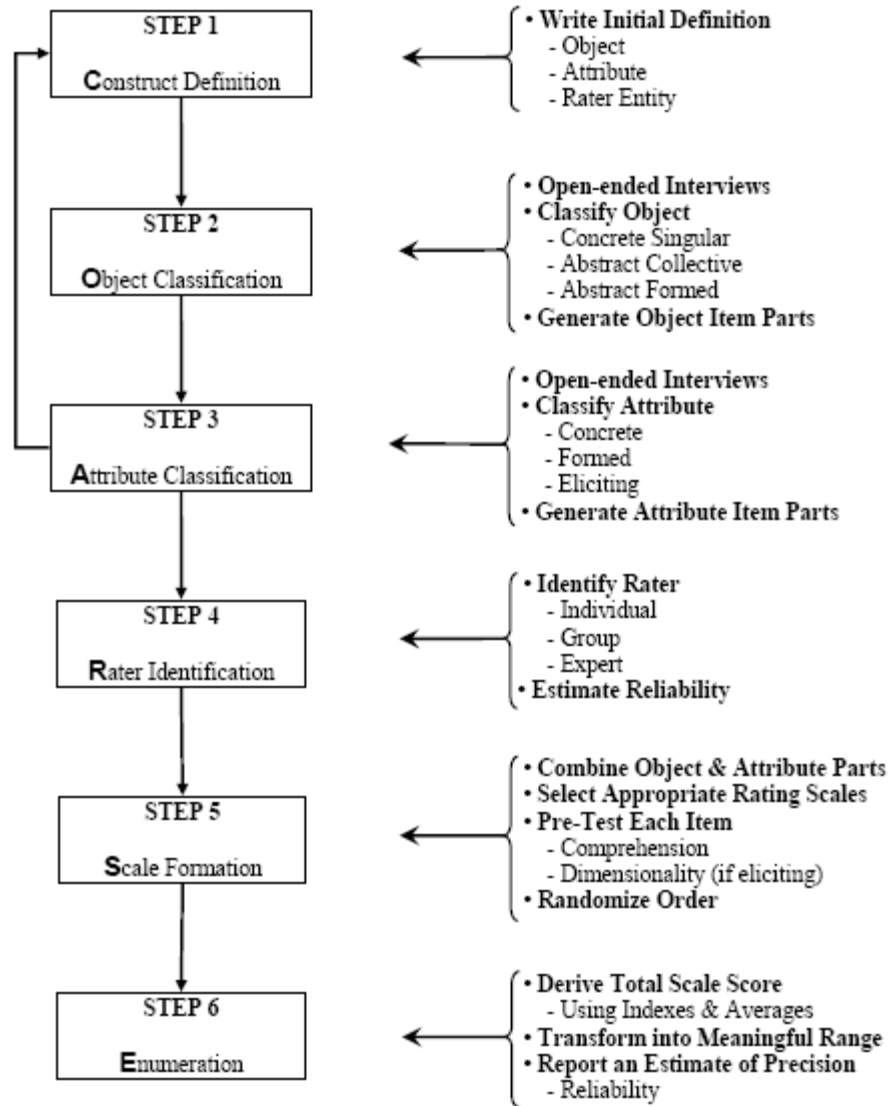
# (Netemeyer et al., 2003)



**Figure 3.5**  
**Netemeyer, Bearden, & Sharma's (2003) Scaling Procedure**



# (Rossiter, 2002)



**Figure 3.6**  
**Rossiter's (2002) C-OAR-SE Marketing Scale Procedure**  
*Adapted from Rossiter (2002)*

# C-OAR-SE procedure

- Rossiter (2002) laments that the current scale paradigm places too much emphasis on empiricism (i.e., factor analysis and reliability), which leads deletion of conceptually necessary items and retention of conceptually inappropriate items.
- The emphasis in the C-OAR-SE procedure is on content validity (Rossiter, 2002).

# (Clark, 2006)

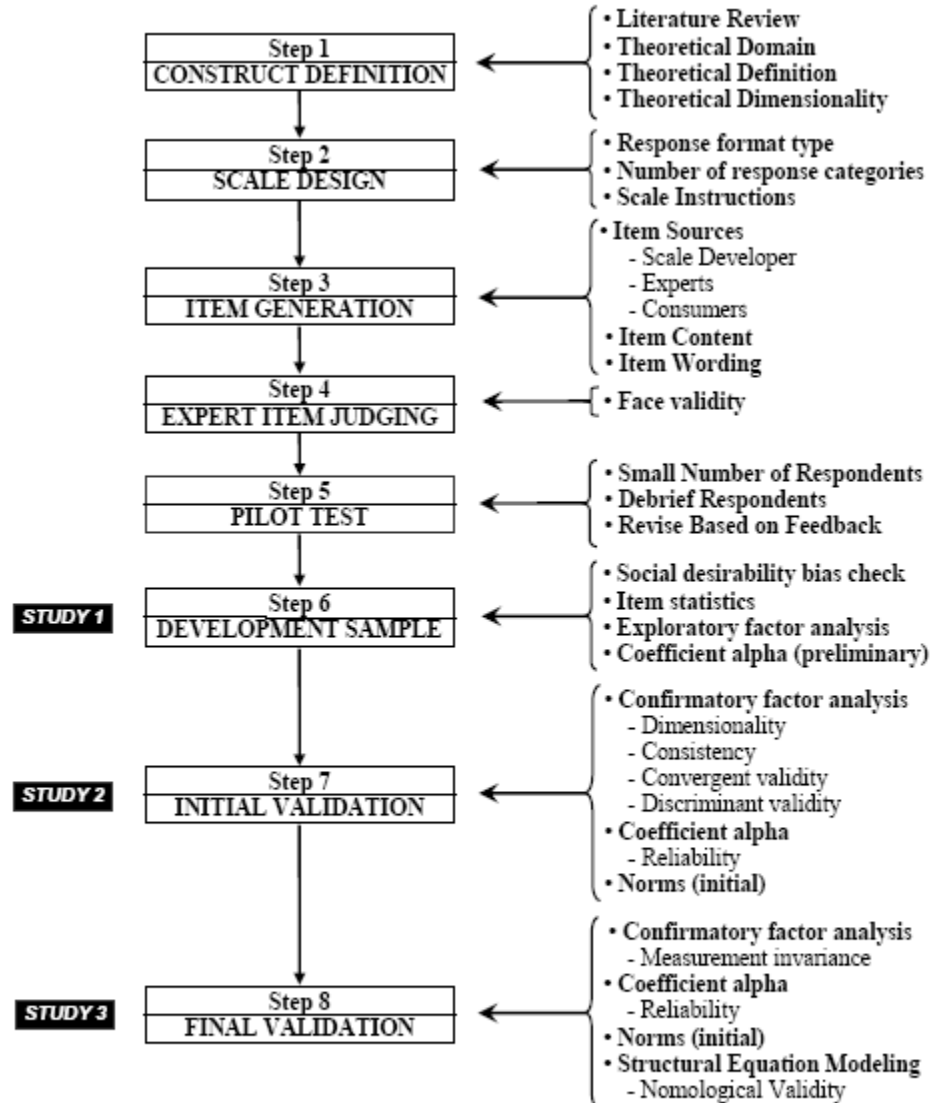
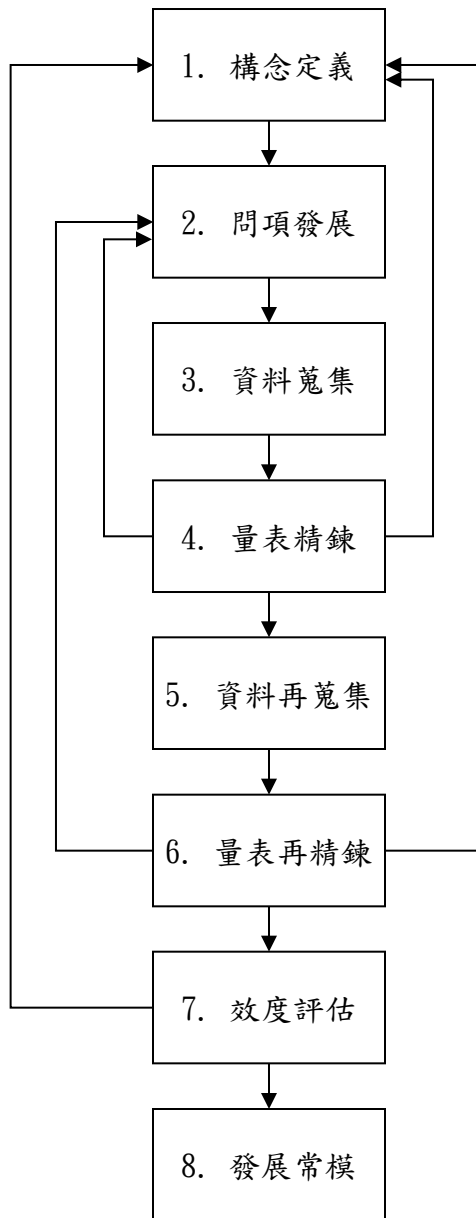


Figure 3.7  
Amalgamated Scale Development Procedure

## 研究流程



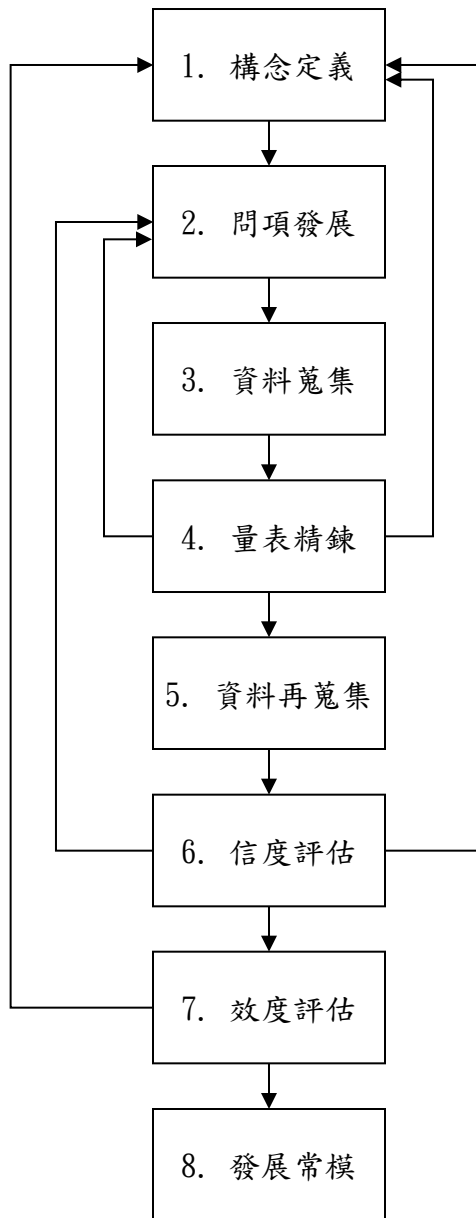
## 研究方法與工具

- 文獻探討
- 文獻蒐尋
- 經驗調查
- 內容效度比率(CVR)
- 抽樣
- Cronbach' s  $\alpha$  係數
- 相關係數矩陣
- Item-to-Total相關法
- 抽樣
- 因素分析
- Cronbach' s  $\alpha$  係數
- Item-to-Total相關法
- 相關係數矩陣
- 多特質多方法矩陣(MTMM)
- Pearson積差相關係數
- 中位數
- 百分位數
- 標準差
- 平均數
- 期望常態分配

## 研究內容

- 領域界定
- 歸納構念之關係面向
- 構念之定義
- 發展問項集合(初始問項)
- 決定量表格式
- 確保內容效度
- 加入效度評估問項
- 決定抽樣方法
- 決定樣本規模
- 針對小樣本進行預試
- 信度與構念效度分析
- 刪除不良問項確保構念效度
- 決定抽樣方法
- 決定樣本規模
- 針對大樣本進行預試
- 信度與構念效度分析
- 刪除不良問項確保構念效度
- 驗證內容效度
- 驗證構念效度
- 驗證法理效度
- 發展測量評估標準
- 樣本分數之統計分配

## 研究流程



## 研究方法與工具

- 文獻探討
- 文獻蒐尋
- 經驗調查
- 專家意見
- 焦點群體
- 內容效度比率(CVR)
- 表面效度
- 抽樣
- 項目分析(Item Analysis)
- 探索性因素分析(EFA)
- Cronbach's  $\alpha$ 係數
- 相關係數矩陣
- Item-to-Total相關法
- 抽樣
- 探索性因素分析(EFA)
- Cronbach's  $\alpha$ 係數
- Item-to-Total相關法
- 驗證性因素分析(CFA)
- 相關係數矩陣
- 多特質多方法矩陣(MTMM)
- Pearson積差相關係數
- 驗證性因素分析(CFA)(SEM)
- 中位數
- 百分位數
- 標準差
- 平均數
- 期望常態分配

## 研究內容

- 領域界定
- 歸納構念之關係面向
- 構念之定義
- 發展問項集合(初始問項)
- 決定量表格式
- 確保內容效度
- 加入效度評估問項
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- 驗證構念效度
- 驗證法理效度
- 發展測量評估標準
- 樣本分數之統計分配

# Summary of Best practices for scale development

- Follow the paradigm for developing better measures (Churchill, 1978; Gerbing, D. W., & Anderson) and best practices for scale development (Netemeyer et al., 2003; Spector, 1992; DeVellis, 1991).

**The linkage among  
attitudes,  
behavior, and  
marketing effectiveness**

# Attitudes and Linkage

- Attitude defined:
  - Enduring organization of motivational, emotional, perceptual, and cognitive processes with respect to some aspect of a person's environment.
  - Level of Customer Involvement
  - Attitude Measurement & Strength
  - Effects of Other People & Brands
  - Situational Factors



# Measurement Scales

- Scaling defined:
  - Procedures for assigning numbers (or other symbols) to properties of an object in order to impart some numerical characteristics to the properties in question.

# Measurement Scales

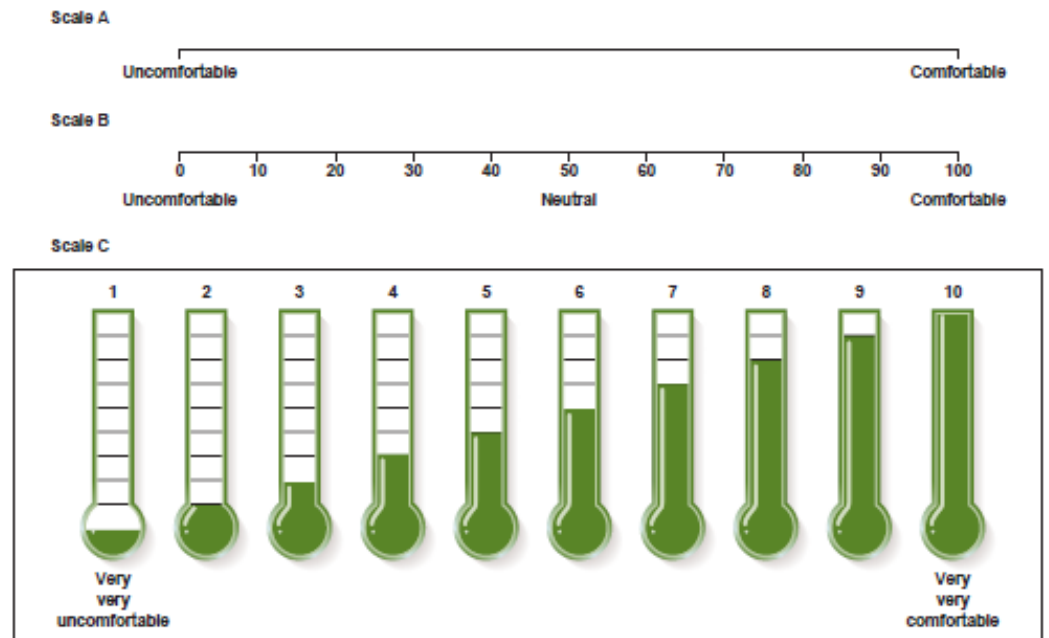
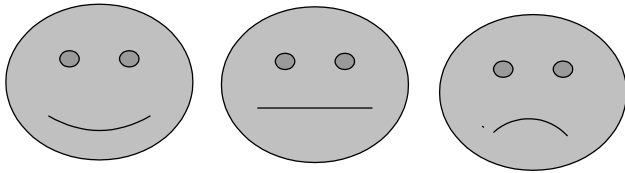
- Scaling Approaches:
  - Unidimensional:
    - Measures **only one attribute** of a concept, respondent, or object.
  - Multidimensional:
    - Measures **several dimensions** of a concept, respondent, or object.

# Measurement Scales

- Types of Scales:
  - Noncomparative Scale:
    - Scales in which judgment is made without reference to another object, concept, or person.
  - Comparative Scale:
    - Scales in which one object, concept, or person is compared with another on a scale.

# Graphic Rating Scales

- Measurement scales that include a graphic continuum, anchored by two extremes.

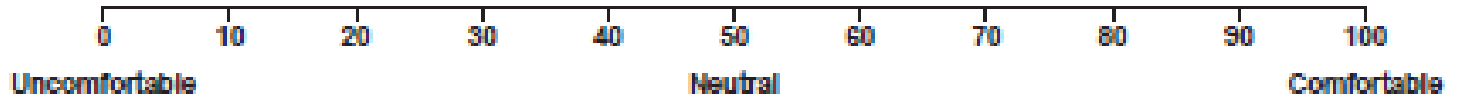


# Graphic Rating Scales

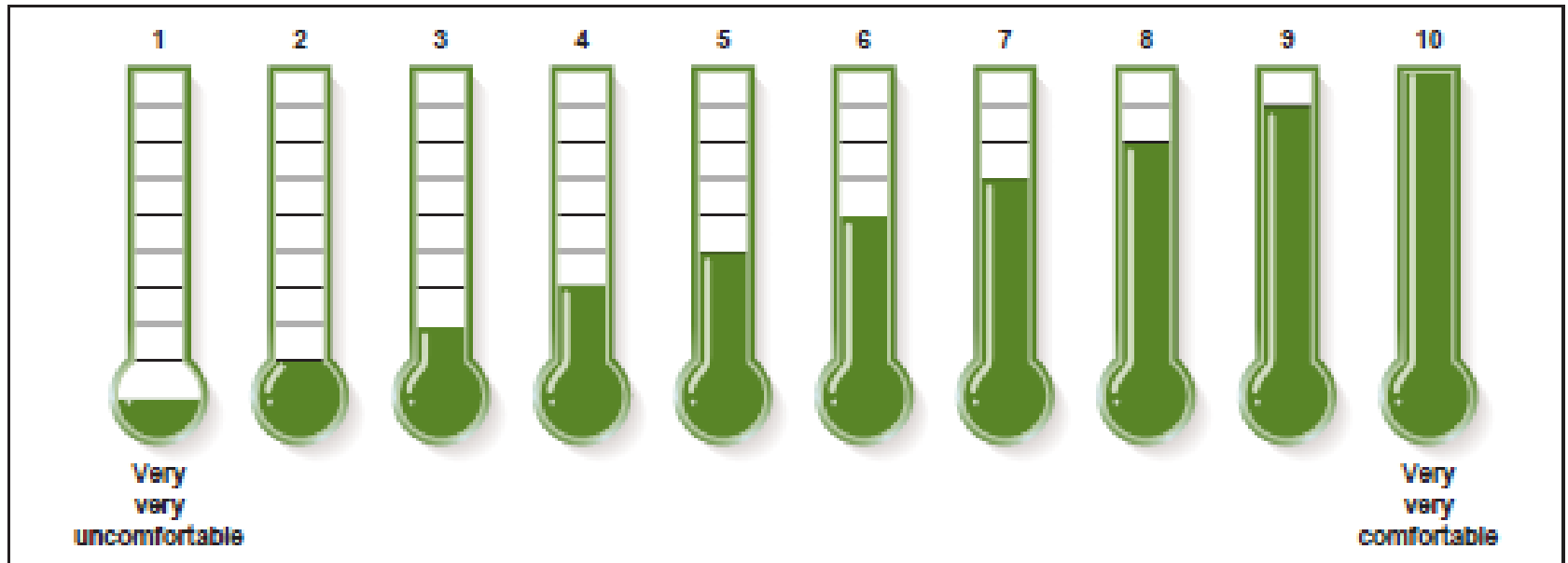
Scale A



Scale B



Scale C



# Itemized Rating Scales

- The respondent selects an answer from a limited number of ordered categories.

*Odd Scale*

**Important**

**1**

**2**

**3**

**4**

**Not Important**

**5**

*Even Scale*

**Important**

**1**

**2**

**3**

**4**

**5**

**Not Important**

**6**

# Itemized Rating Scales

## Exhibit 11.2

### Itemized Rating Scales Used in Internet and Mail Surveys

If offered, how likely would you be to use the following areas on this site?

#### Scale A

a. Auctions

Not at all likely to use

1 2 3 4 5 6 7

Extremely likely to use

b. Fee-based education tools

Not at all likely to use

1 2 3 4 5 6 7

Extremely likely to use

c. Event registration

Not at all likely to use

1 2 3 4 5 6 7

Extremely likely to use

d. Online shopping markets

Not at all likely to use

1 2 3 4 5 6 7

Extremely likely to use

e. Recruiting

Not at all likely to use

1 2 3 4 5 6 7

Extremely likely to use

f. Research subscription

Not at all likely to use

1 2 3 4 5 6 7

Extremely likely to use

g. Trading community

Not at all likely to use

1 2 3 4 5 6 7

Extremely likely to use

h. Training/seminars

Not at all likely to use

1 2 3 4 5 6 7

Extremely likely to use

# Itemized Rating Scales

What factors influence your choice of music Web sites? (Rate the Importance of each item.)

	Not at All Important				Very Important
Customer benefits or rewards for shopping	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
Customer service or delivery options	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
Ease of use of Web site	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
Low prices	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
Real-time audio sampling of CDs	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
Reviews and artist information	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>

## Scale D

How interested would you be in obtaining additional information about this customer relationship management solution for your business?

- Extremely interested
- Somewhat interested
- Not at all interested
- Very interested
- Not very interested

How likely is it that your business will invest in this type of customer relationship management solution within the next 12 months?

- Extremely likely
- Somewhat likely
- Not at all likely
- Very likely
- Not very likely



# Itemized Rating Scales

## Submitting a Request for a Hotel Reservation

We'd like to get your feedback regarding your experience in submitting a request for a hotel reservation at our Web site today. Please rate your satisfaction with each of the following aspects of *fasthotels.com* based on your experience this visit.

	Very Satisfied				Very Dissatisfied
	1	2	3	4	5
Ability to access the offer page	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
Ability to locate hotel information	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
Ability to locate city information	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
Clarity of how the bonus program works	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
Clarity of the purchase agreement	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>

Please rate the extent to which you are satisfied that *Fasthotels.com* has communicated each of the following to you during this visit:

	Very Satisfied				Very Dissatisfied
	1	2	3	4	5
Your hotel reservation is/will be nonchangeable	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
Your hotel reservation is/will be nonrefundable	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>

How satisfied would you say you were with this visit to *Fasthotels.com*?

- Very satisfied
- Satisfied
- Somewhat satisfied
- Neither satisfied nor dissatisfied
- Somewhat dissatisfied
- Dissatisfied
- Very dissatisfied

# Itemized Rating Scales

**EXHIBIT 11.3** Selected Itemized Rating Scales

Characteristic of Interest	Rating Choices				
Purchase Intent	Definitely will buy	Probably will buy	Probably will not buy	Definitely will not buy	
Level of Agreement	Strongly agree	Somewhat agree	Neither agree nor disagree	Somewhat disagree	Strongly disagree
Quality	Very good	Good	Neither good nor bad	Fair	Poor
Dependability	Completely dependable	Somewhat dependable	Not very dependable	Not dependable at all	
Style	Very stylish	Somewhat stylish	Not very stylish	Completely unstylish	
Satisfaction	Completely satisfied	Somewhat satisfied	Neither satisfied nor dissatisfied	Somewhat dissatisfied	Completely dissatisfied
Cost	Extremely expensive	Expensive	Neither expensive nor inexpensive	Slightly inexpensive	Very inexpensive
Ease of Use	Very easy to use	Somewhat easy to use	Not very easy to use	Difficult to use	
Color Brightness	Extremely bright	Very bright	Somewhat bright	Slightly bright	Not bright at all
Modernity	Very modern	Somewhat modern	Neither modern nor old-fashioned	Somewhat old-fashioned	Very old-fashioned

# One Stage vs. Two Stage

## Traditional One-Stage Format

“How effective do you believe Senator Foghorn is in having your money stay in the community?”

Very  
effective  
4

Somewhat  
effective  
3

Somewhat  
ineffective  
2

Very  
ineffective  
1

Don't  
know  
0

## Two-Stage Format

“How effective do you believe Senator Foghorn is in having your money stay in the community?”

**How effective?**

Effective

Ineffective

No opinion

**Would that be very or somewhat?**

Very

Somewhat

Advice for analyzing rating scales is given in the Practicing Marketing Research box below.

# Rank Order Scale

Uses Comparative Scaling:

Put these fast food chains in order of preference:

- McDonalds
- Burger King
- Taco Bell

# Rank Order Scale

## Exhibit 11.4(A)

### Series of Rank-Order Scales Used to Evaluate Eye Shadows and Car Resale Values

#### Eye Shadow Scales

Please rank the following eye shadows, with 1 being the brand that best meets the characteristic being evaluated and 6 the worst brand on the characteristic being evaluated. The six brands are listed on card C. (HAND RESPONDENT CARD C.) Let's begin with the idea of having high-quality compacts or containers. Which brand would rank as having the highest quality compacts or containers? Which is second? (RECORD BELOW.)

	Q.48. Having High-Quality Container	Q.49. Having High-Quality Applicator	Q.50. Having High-Quality Eye Shadow
Avon	_____	_____	_____
Cover Girl	_____	_____	_____
Estee Lauder	_____	_____	_____
L'Oreal	_____	_____	_____
Natural Wonder	_____	_____	_____
Revlon	_____	_____	_____

# Q-Sorting

- Q-sorting is basically a sophisticated form of rank ordering.
- A respondent is given cards listing a set of objects—such as verbal statements, slogans, product features, or potential customer services—and asked to sort them into piles according to specified rating categories.
- Q-sorts usually contain a large number of cards—from 60 to 120 cards.
- For statistical convenience, the respondent is instructed to put varying numbers of cards in several piles, the whole making up a normal statistical distribution.

Here is a Q-sort distribution of 90 items:

Excellent Feature						Poor Feature				
3	4	7	10	13	16	13	10	7	4	3
10	9	8	7	6	5	4	3	2	1	0

This is a rank-order continuum from Excellent Feature (10) to Poor Feature (0), with varying degrees of approval and disapproval between the extremes.

# Q-Sorting

Here is a Q-sort distribution of 90 items:

Excellent Feature					Poor Feature					
3	4	7	10	13	16	13	10	7	4	3
10	9	8	7	6	5	4	3	2	1	0

This is a rank-order continuum from Excellent Feature (10) to Poor Feature (0), with varying degrees of approval and disapproval between the extremes.

# Paired Comparison

*“Which drink do you prefer:”*

\_\_\_ Coke  
\_\_\_ Pepsi

---

\_\_\_ Coke  
\_\_\_ Sprite

---

\_\_\_ Pepsi  
\_\_\_ Sprite

## Exhibit 11.5

### Paired Comparison Scale for Sun Care Products

Here are some characteristics used to describe sun care products in general. Please tell me which characteristic in each pair is more important to you when selecting a sun care product.

- |   |   |
|---|---|
| a. Tans evenly                          | b. Tans without burning                 |
| a. Prevents burning                     | b. Protects against burning and tanning |
| a. Good value for the money             | b. Goes on evenly                       |
| a. Not greasy                           | b. Does not stain clothing              |
| a. Tans without burning                 | b. Prevents burning                     |
| a. Protects against burning and tanning | b. Good value for the money             |
| a. Goes on evenly                       | b. Tans evenly                          |
| a. Prevents burning                     | b. Not greasy                           |



# Paired Comparison

## Exhibit 11.5

### Paired Comparison Scale for Sun Care Products

Here are some characteristics used to describe sun care products in general. Please tell me which characteristic in each pair is more important to you when selecting a sun care product.

- |   |   |
|---|---|
| a. Tans evenly                          | b. Tans without burning                 |
| a. Prevents burning                     | b. Protects against burning and tanning |
| a. Good value for the money             | b. Goes on evenly                       |
| a. Not greasy                           | b. Does not stain clothing              |
| a. Tans without burning                 | b. Prevents burning                     |
| a. Protects against burning and tanning | b. Good value for the money             |
| a. Goes on evenly                       | b. Tans evenly                          |
| a. Prevents burning                     | b. Not greasy                           |

# Constant Sum Scale

What features do you want in a car?

Sun roof \_\_\_\_\_

Leather \_\_\_\_\_

ABS Brakes \_\_\_\_\_

CD Player \_\_\_\_\_

Total            100 points

# Constant Sum Scale

## Exhibit 11.6

### Constant Sum Scale Used in Tennis Sportswear Study

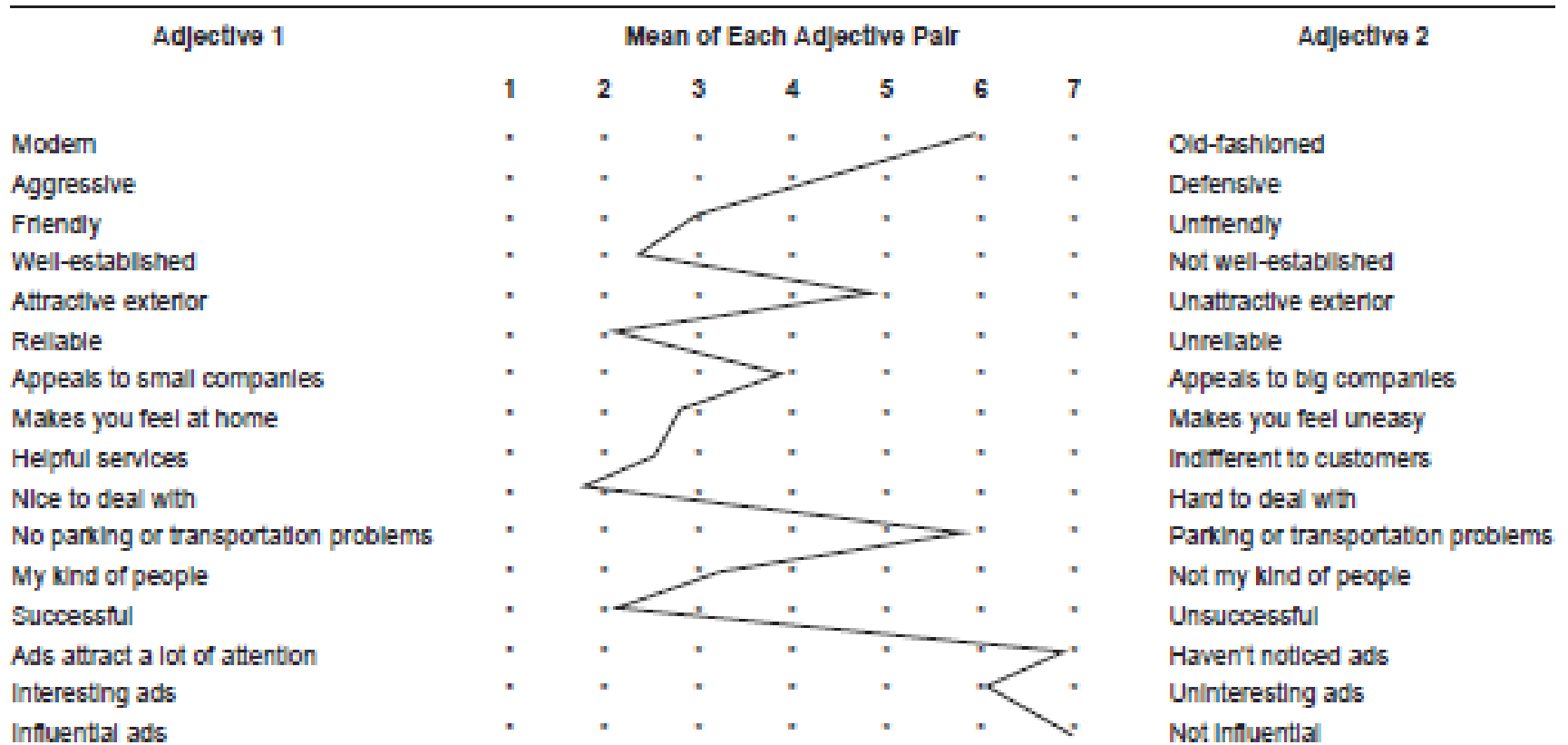
Below are seven characteristics of women's tennis sportswear. Please allocate 100 points among the characteristics such that the allocation represents the importance of each characteristic to you. The more points that you assign to a characteristic, the more important it is. If the characteristic is totally unimportant, you should not allocate any points to it. When you've finished, please double-check to make sure that your total adds to 100.

Characteristics of Tennis Sportswear	Number of Points
Is comfortable to wear	_____
Is durable	_____
Is made by well-known brand or sports manufacturers	_____
Is made in the United States	_____
Has up-to-date styling	_____
Gives freedom of movement	_____
Is a good value for the money	_____
	<hr/>
	100 points

# Semantic Differential Scale

## Exhibit 11.7

### Semantic Differential Profile of an Arizona Savings and Loan Association



# Stapel Scale

## Exhibit 11.8

### Stapel Scale Used to Measure a Retailer's Web Site

+5	+5
+4	+4
+3	+3
+2	+2
+1	+1
<b>Cheap Prices</b>	<b>Easy to Navigate</b>
-1	-1
-2	-2
-3	-3
-4	-4
-5	-5

# Likert Scale

## Exhibit 11.9

### Likert Scales Used by an Internet Game Site

#### Scale A

How did you feel about the registration process when you became a new user?

	Strongly disagree	Somewhat disagree	Neutral	Somewhat agree	Strongly agree
The registration was simple.	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
The registration questions were "nonthreatening."	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
Registration here will protect my privacy.	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
The registration did not take a long time to complete.	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
The registration informed me about the site.	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>

# Purchase Intent Scales

## Exhibit 11.10

### Purchase Intent Scale and Related Questions for In-Home Product Placement of Fly Traps

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21. If a set of three traps sold for approximately \$3.00 and was available in the stores where you normally shop, would you:

	(51)
definitely buy the set of traps	1
probably buy	2
probably not buy	3
definitely not buy	4

22. Would you use the traps (a) instead of or (b) in addition to existing products?

	(52)
instead of	1
in addition to	2

23. Would you recommend this product to your friends?

	(53)
definitely	1
probably	2
probably not	3
definitely not	4

# Multiple Choice Scale

- Multiple response → *Check all that apply*
- Single response → *Check only one*
- Controlled response → *Check the top three*

## **Net Promoter Score (NPS):**

Begins with a 10-point scale on likelihood to recommend. Next, the difference between promoters and dissuaders is computed.



# How to Select a Scale

## Things to Consider

1. The Nature of the Construct Being Measured
2. Type of Scale and Number of Scale Categories
3. Balanced vs. Nonbalanced
  - Balanced:
    - Scales with equal numbers of positive & negative categories.
  - Nonbalanced:
    - Scales weighted towards one end or the other of the scale.
4. Forced vs. Nonforced
  - Having an odd vs. even number of response choices.

# Attitude Measures and Management Decision Making

- Determinant Attitudes
  - A key component to intentions
  - Those customer attitudes most closely related to preferences or to actual purchase decisions.

# Types of Questioning

- Direct vs. Indirect
  - Observation

# Summary

- A paradigm for developing better measures of marketing constructs
- Current practice in scale development
- The linkage among attitudes, behavior, and marketing effectiveness
- Measurement Scales

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