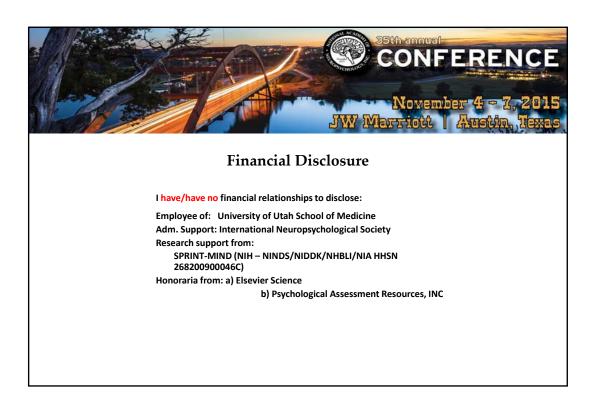


## Moving Neuropsychology from the Backdoor to the Front Door: Embracing Outcomes in Research and Practice

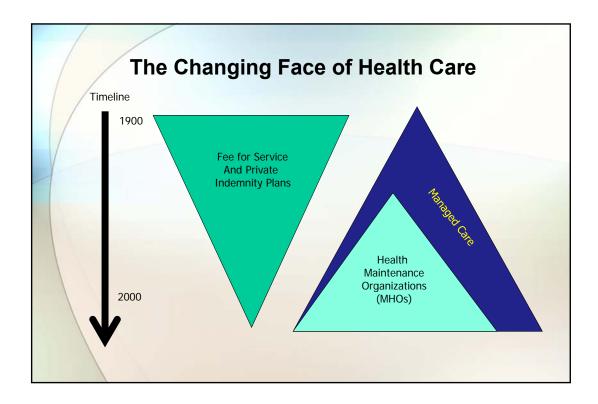
Gordon J. Chelune, Ph.D. Professor, Department of Neurology University of Utah School of Medicine

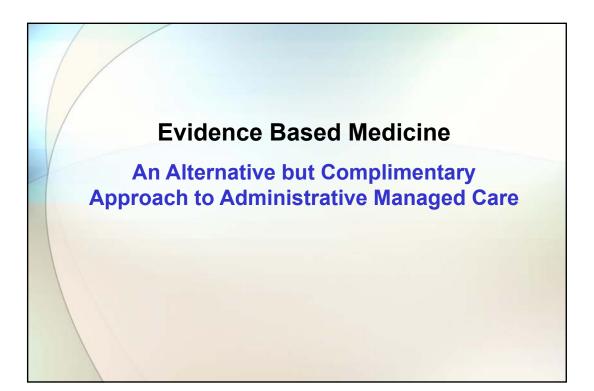




Moving Neuropsychology from the Backdoor to the Front Door: Embracing Outcomes in Research and Practice







## Clinical Practice and Evidence-Based Medicine:

Toward a value-driven, evidence-based health care system

"Evidence-based medicine, or the 'outcomes movement,' accepts as axiomatic that a substantial portion of health care expenditure in the United States is wasted on unproven or ineffective tests and treatments. As a result, this movement figures prominently in health care reforms and in medical education."

Horwitz, 1996

A value-driven, evidence-based health care system Based on Outcomes Management not Administrative Management

As originally conceived, procedures and treatments have value (are reimbursable) if they can be <u>objectively</u> <u>demonstrated to positively affect (change) a patient's</u> <u>condition</u> in a cost effective manner.

# **Outcomes Management**

A value-driven, evidence-based health care system

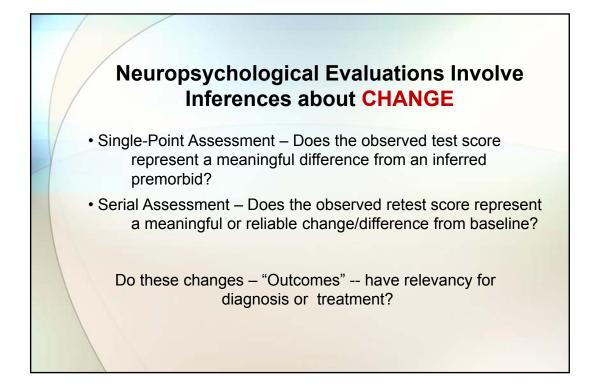
Outcomes accountability and following the outcomes of patients and managing them on the basis of <u>epidemiologic</u> <u>information</u> is critical to medicine and the HMO movement. Paul Ellwood, M.D.

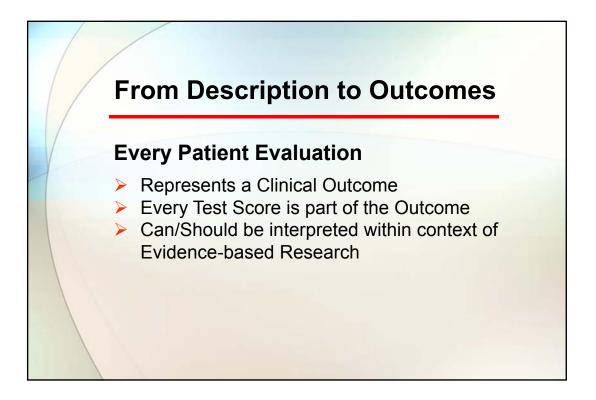
> Note: Emphasis is not on "how much" but on "how many"

# What is a Clinical Outcome?

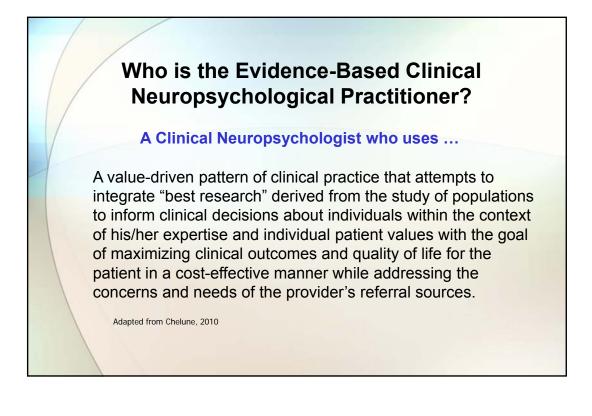
In a broad sense, clinical outcomes are discrete measurable events, marked by a change in status, performance, or other objectively defined endpoint, that can be tracked both in the aggregate on a group level but also, importantly, at the level of the specific patient.

Chelune, 2002, 2010







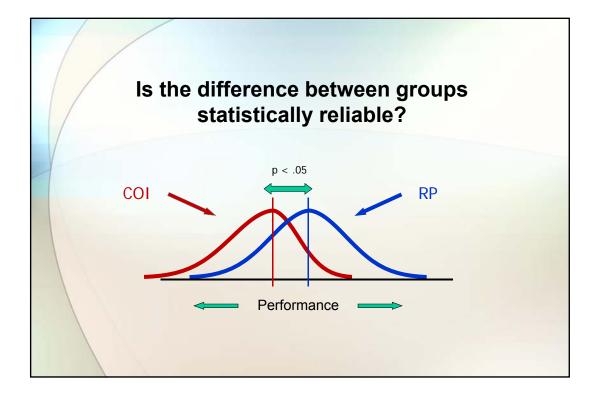


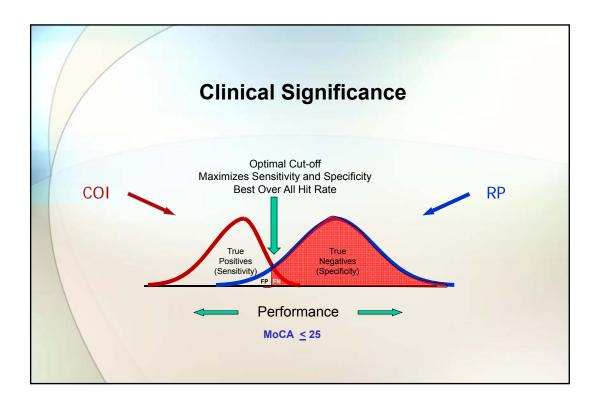
# **Clinical Significance of Tests**

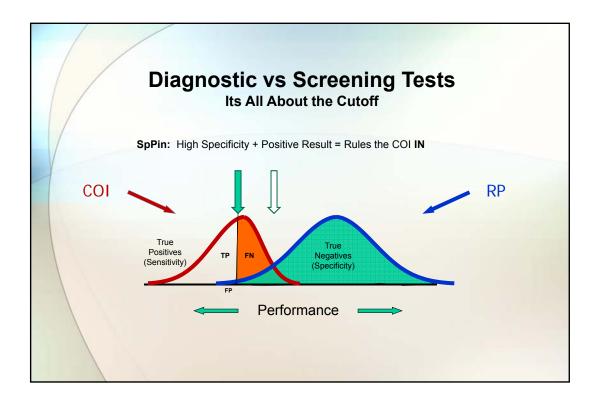
Patients "deserve decisions and recommendations that are founded increasingly upon empirical validation. The instruments chosen to produce data to resolve questions in a valid fashion should be selected for their power to reduce uncertainty with respect to those questions..."

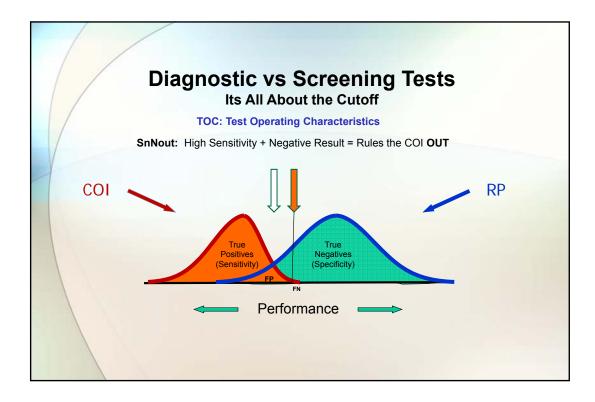
#### Costa, JCN, 1983, p. 7.

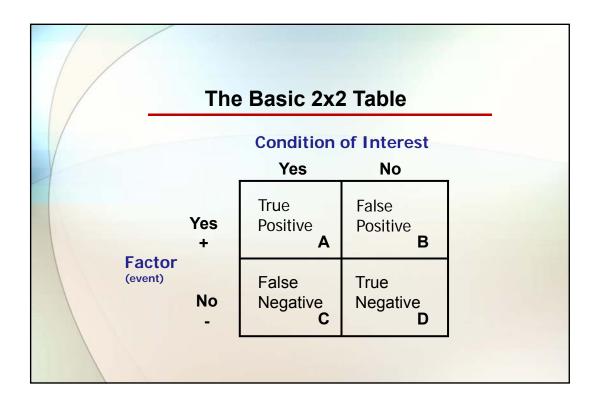
Our ability "to reduce uncertainty" provides value to patient care



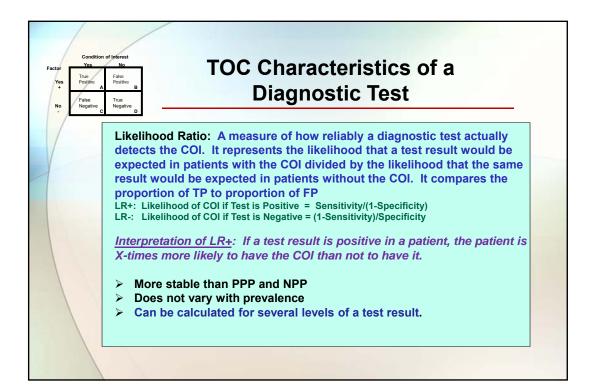


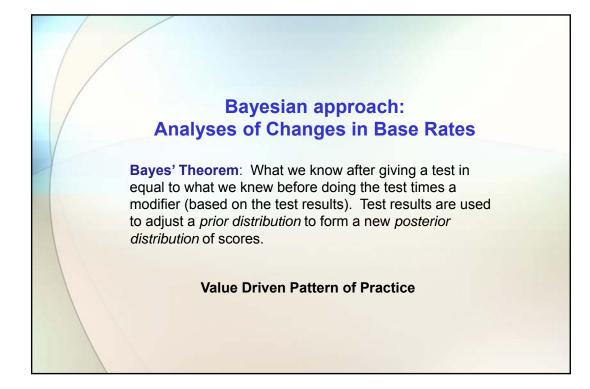


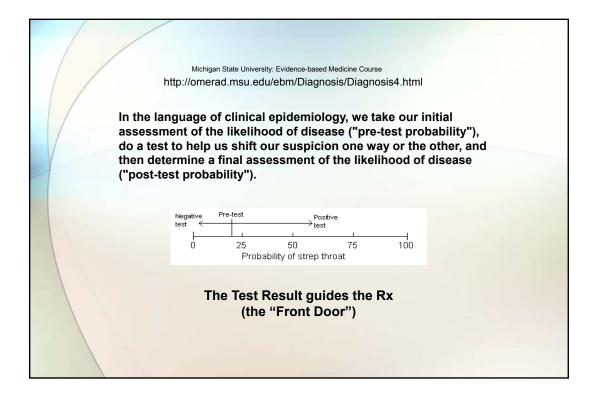


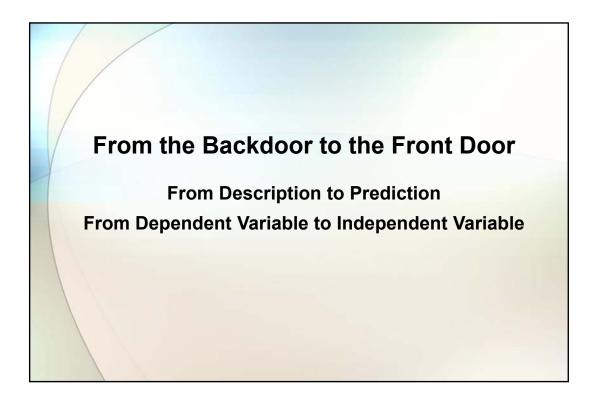


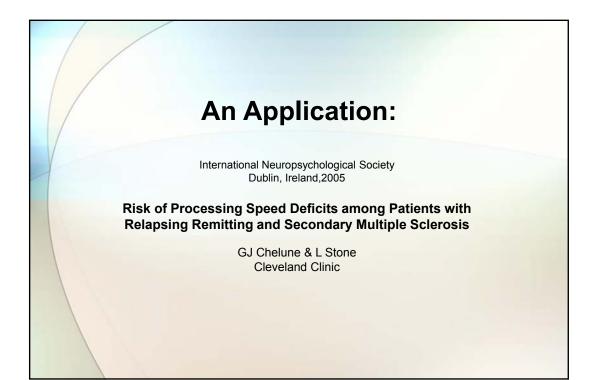
Dayesian rest Opt	erating Characteristics
% Prevalence	Odds
% Overall Correct Hit Rate	Odds Ratio
Sensitivity	Relative Risk Ratio
Specificity	Likelihood Ratio
Positive Predictive Power	Pre – Post Test Odds
Negative Predictive Power	Pre – Post Test Probabilities











## **Referral Question:**

My patient with RMSS is complaining of increased cognitive problems; physical exam is relatively stable. Has the patient's course become Secondary Progressive?

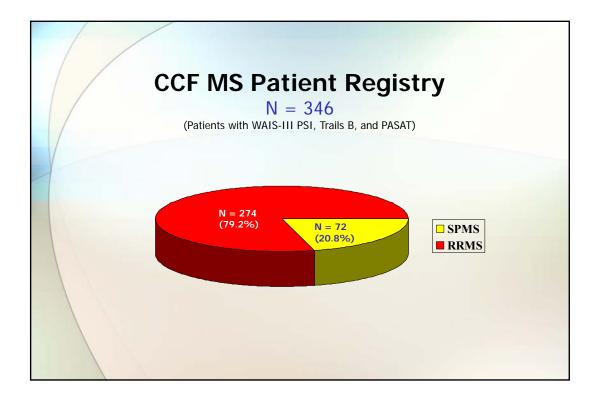
## Literature Review (Best Evidence):

- Background: What are the best measures to differentiate SPMS from RRMS?
- Foreground: In patients with
  Patient: SPMS
  Intervention: what neuropsychological tests
  Comparison: compared RRMS

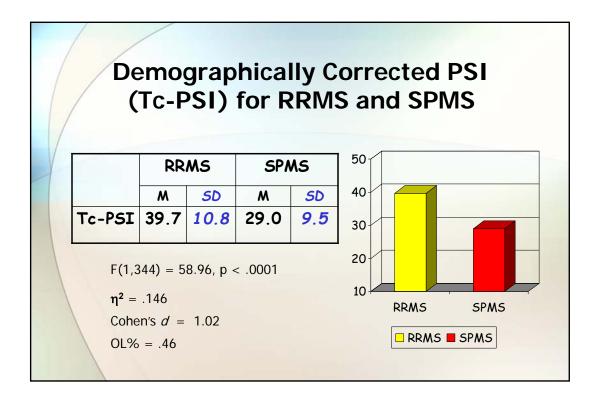
Outcome: are sensitive?

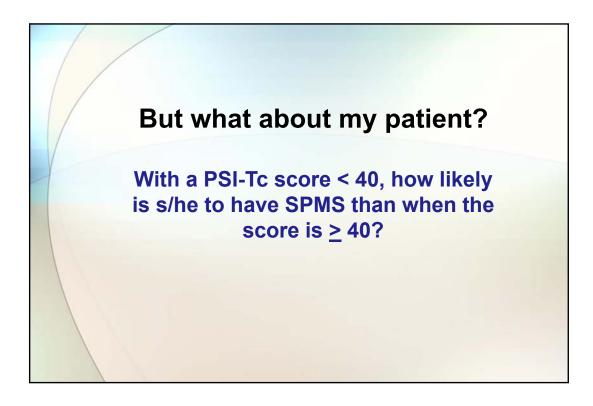
## Research Question (Case Controlled Study) :

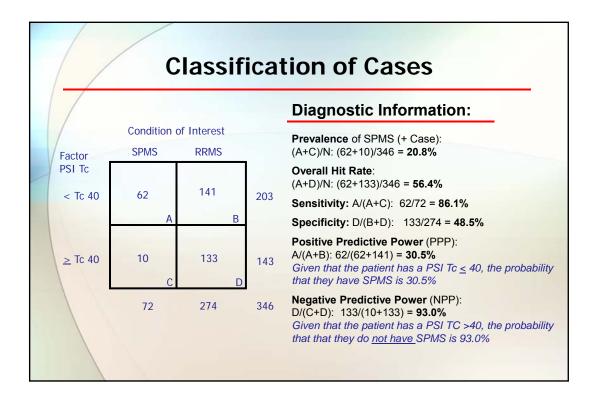
Can patients' performances on measures of processing speed (e.g., WAIS-III PSI, Trails B, and PASAT) help me identify those who are likely to have SPMS vs. RRMS? If so, what is the likelihood that this patient has SPMS?

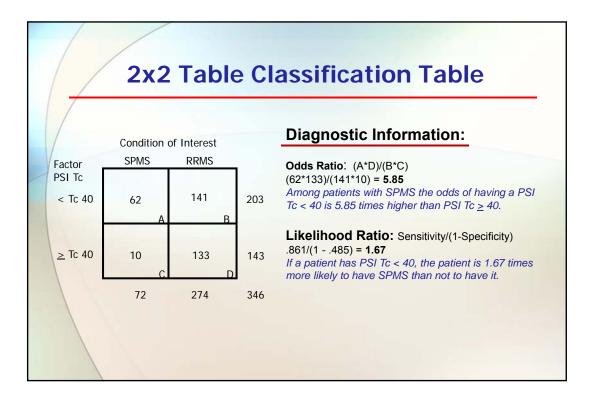


gistic Regre	ession U	sing PS	I-Tc, T
and PASA	T as Pre	dictor	Variabl
	Classificatio		
		Predicted	Percent
Observed	SPMS	RRMS	Correct
SPMS	24	48	33.3%
	6	268	97.8%
RRMS Overall Percentage	-		









s' performances on meas WAIS-III PSI) help me ide likely to have SPMS	entify those who are
Test Operating Characterist	ics
% Prevalence (Baserate) of COI	20.81
% Overall Correct Hit Rate	56.36
Sensitivity (% True Positives)	0.8611
Specificity (% True Negatives)	0.4854
Positive Predictive Power	0.305
Negative Predictive Power	0.930
Odds Ratio	5.8482
Risk Ratio (cohort studies)	4.3675
Likelihood Ratio (LR+)	1.6734
Pre-Test Odds	0.2628
Post-Test Odds	0.4397
Pre-test Probabality	0.2081
Post-Test Probabality	0.3054



Journal of the International Neuropsychological Society (2009), **15**, 769–776. Copyright © 2009 INS. Published by Cambridge University Press. Printed in the USA. doi:10.1017/S1355617709990373

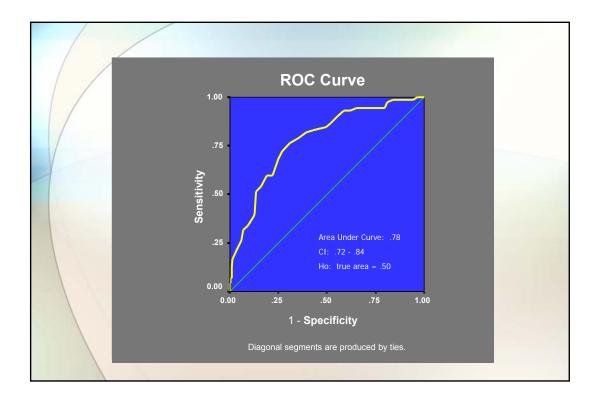
### The diagnostic utility of multiple-level likelihood ratios

#### STEPHEN C. BOWDEN,<sup>1</sup> and DAVID W. LORING<sup>2</sup>

<sup>1</sup>Department of Psychology, The University of Melbourne, Victoria, Australia <sup>2</sup>Department of Neurology, Emcry University School of Medicine, Atlanta, Georgia (RECEIVED September 12, 2008; FINAL REVISION June 2, 2009; ACCEPTED June 11, 2009)

#### Abstract

Clinicians are accustomed to interpreting diagnostic test scores in terms of sensitivity and specificity. Many clinicians also appreciate that sensitivity and specificity need to be interpreted in terms of local base rates (i.e., pretest probability). However, most neuropsychological tests contain a wide range of scores. Important diagnostic information may be sacrificed when valid test scores are reduced to the simple dichotomy of "positive" or "negative" diagnosis that underlies sensitivity and specificity analysis. The purpose of this study is to provide an introduction to multiple-level likelihood ratios, a method for preserving the information in a wider range of scores. These statistics are first described using a hypothetical example of dementia screening, then with patient data from an epilepsy surgery sample. Multiple-level likelihood ratios have several advantages over sensitivity and specificity analysis because they are applied across a wider range of diagnostic scores, and generalize to settings with different base rates. We suggest that the diagnostic validity of many psychological tests may be underestimated by relying solely on traditional dichotomous sensitivity and specificity analysis. *CIINS*, 2009, *15*, 769–776.)

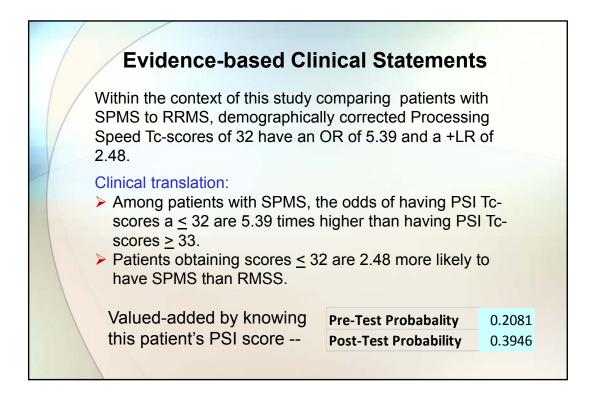


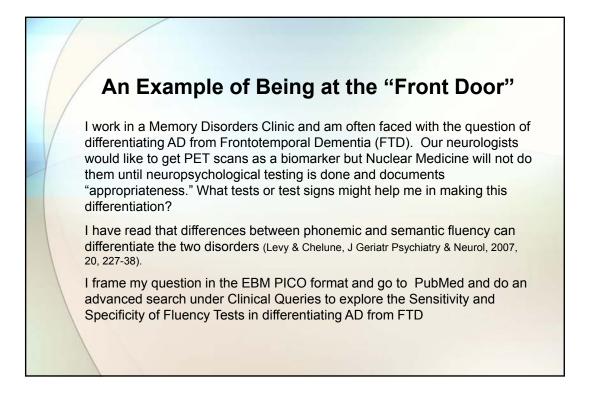
1	Positive in				Positive if			
/	Less Thar Equal To	or Sensitivity	1-Specific	itv	Less Than o Equal To S		-Specificit	tv
_		,		-		,		·
/	10.00	.000	.000					
/	11.50	.028	.000	1.00 SD	39.50	.861	.515	LR 1.7
/	12.50	.042	.000	1.00 30	40.50	.903	.555	LIX 1.7
/	13.50	.042	.004		41.50	.931	.588	
	14.50	.042	.004		42.50	.931	.620	
	14.50	.069	.004		43.50	.944	.653	
	16.50	.089	.011		44.50	.944	.693	
					45.50	.944	.737	
	17.50	.097	.011		46.50	.944	.759	
	18.50	.125	.011		47.50	.944	.777	
3.00 SD -	19.50	.167	.015	LR 11.1	48.50	.944	.796	
3.00 3D	20.50	.194	.026		49.50	.972	.810	
	21.5 <mark>0</mark>	.208	.033		50.50	.986	.839	
	22.50	.264	.058		51.50	.986	.861	
	23.50	.319	.069		52.50	.986	.880	
	24.50	.333	.088		53.50	.986	.901	
	25.50	.347	.099		54.50	.986	.909	
	26.50	.389	.124		55.50	.986	.927	
	27.50	.403	.128		56.50	.986	.931	
	28.50	.514	.135		57.50	.986	.931	
2.00 SD —	29.50	.542	.161	LR 3.4				
2.00 30	30.50	.597	.190	LR 3.4	58.50	1.000	.964	
	31.50	.597	.219		60.00	1.000	.971	
	32.50	.681	.248		61.50	1.000	.974	
	33.50	.722	.270		63.00	1.000	.982	
	34.50	.764	.307		65.50	1.000	.985	
	34.50	.792	.354		68.50	1.000	.989	
	36.50	.819	.354		72.50	1.000	.993	
					76.00	1.000	.996	
	37.50	.833	.438		78.00	1.000	1.000	
	38.50	.847	.496					

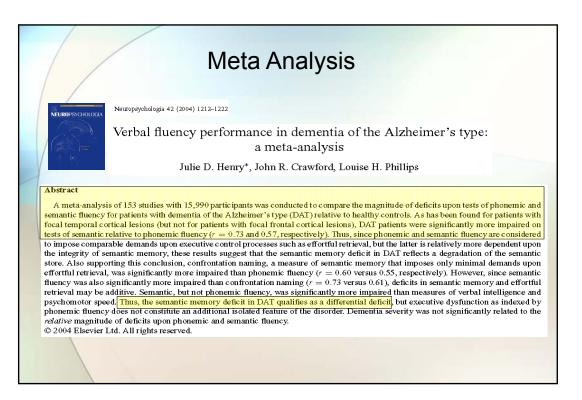
Likeli	hood R	ati	o as	s a C	linica	I Tool
	ely is my pati				•	•
-	to RRMS ba from demogr					crepancy
	PSI Tc <	SD	(SS)	LR		
	40		1.0	(85)	1.7	
	38		1.2	(82)	1.9	
	36		1.4	(79)	2.2	
	34		1.6	(76)	2.7	
	32		1.8	(73)	2.7	
	30		2.0	(70)	3.4	

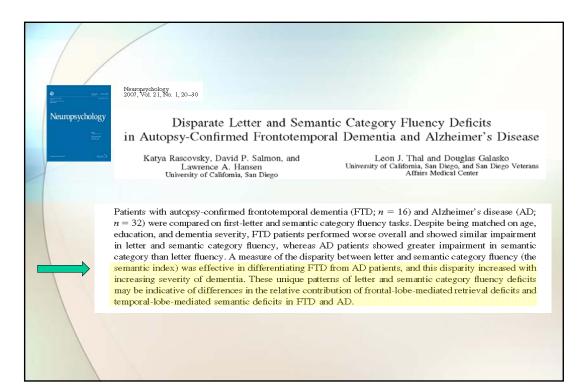
<b>Reference Grou</b>	up		COI Group	
Enter Mean, SD and	d Target Sc	ore	Enter Mean, SD and T	arget Score
Mean	39.7		Mean	29
SD	10.8		SD	9.5
Target Score	32.99		Target Score	<mark>32.99</mark>
z-score	-0.6213		z-score	0.42
Percentile Above	0.73		Percentile Above	0.34
Percentile Below	0.27		Percentile Below	0.66
Enter N for Ref Gro	up	274	Enter N for COI Group	
Est. N Above Targe	t score	201	Est. N Above Target so	ore
Est N Below Target	score	73	Est. N Below Target sc	ore

/	100	Cha	racten	stics of PSI 7	IC <u>&lt;</u> 32
	Fill In the Number of	Subjects in	Each Cell:	Estimated Test Op	erating Characteristic
1/		A:	48	% Prevalence of COI	20.81 %
		В:	73	% Overall Correct	71.82 %
1		C:	24	Sensitivity	0.6628
1		D:	201	Specificity	0.7328
1				PPP	0.395
	Enter Confidence Level (1-α)	0.95		NPP	0.892
	Z-score of Interval (Z $_{1-\alpha/2}$ )	1.960		Odds Ratio	5.390
	Standard Error of OR	0.2842		Odds Ratio Lower Cl	3.088
				Odds Ratio Upper Cl	9.408
		C	DI	Likelihood Ratio (LR+)	2.480
		SPMS	RRMS	Likelihood Ratio (LR-)	0.4602
	Tc <u>&lt;</u> 32	48	73	Pre-Test Odds	0.2628
	Test Result	A	В	Post-Test Odds	0.6518
	Tc <u>&gt;</u> 33	24	201	Pre-Test Probabality	0.2081
1		С	D	Post-Test Probability	0.3946
				Risk Ratio*	3.6575 * For cohort studie









Variable	$\begin{array}{c} \text{FTD} \\ (n = 16) \end{array}$	$\begin{array}{l} \text{AD} \\ (n = 32) \end{array}$	
Age			
M (SD), years Range	63.31 (8.2) 48–76	66.56 (5.4) 53–77	
Education M (SD), years	13.62 (4.2)	13.94 (2.6)	
Range MMSE score	3–19	11-20	
M (SD) Range	21.12 (5.6) 9–29	21.09 (5.6) 8–30	
FAQ percentage score <i>M</i> ( <i>SD</i> ) Range	63.07 (26.2) <sup>a</sup> 12–95	57.37 (27.9) <sup>b</sup> 0–100	
Estimated duration M (SD), years	4.31 (3.7)	4.16 (3.0)	
Range	1-16	1-15	
Semantic index = (s	semantic fl emantic fluency +		

#### p.24

fluency performance independent of defective retrieval. As expected, the semantic index was significantly lower in AD patients (M = 0.43, SD = 0.12) compared with FTD patients (M = 0.62, SD = 0.21), t(46) = -4.16, p < .05, d = 1.28, even though

On the basis of this analysis, an optimal semantic index (SI) cutoff score of .524 (SI < .524 = AD; SI  $\ge$  .524 = FTD) correctly classified 26 of 32 (81.3%) AD patients and 12 of 16 (75.0%) FTD patients, for an overall correct discrimination of 79.2%. Compar-

/	FTD			Α	D	
Co	ondition of Int	erest	Cor	ndition of	f Interest	
	FTD A	D Totals		AD	FTD	Totals
SI > .524	12	6 18	61 . FOA	26	4	
_	12	10	SI < .524	20	4	30
SI Cutoff	A	В	SI Cutoff	A	В	
SI < .524	4 2	30	SI <u>&gt;</u> .524	6	12	18
	с	D		c	D	
Totals	16 3	48	Totals	32	16	48
Test Operating	o Characteris	tics for FTD	Test Operating	n Charad	teristic	s for AD
% Prevalence (Bas		33.33	% Prevalence (Bas			66.6
% Positive Test Re	,	37.50	% Positive Test Re	,		62.5
% Negative Test R	esult	62.50	% Negative Test R	esult		37.5
% Overall Correct		79.17	% Overall Correct	Hit Rate		79.1
Sensitivity (% True	e Positives)	0.7500	Sensitivity (% True	e Positives	5)	0.812
Specificity (% True	e Negatives)	0.8125	Specificity (% True	e Negative	s)	0.750
Positive Predictive	e Power	0.667	Positive Predictiv	e Power		0.86
Negative Predictiv	ve Power	0.867	Negative Predictive	ve Power		0.66
Odds having COI w	v. Pos. Test	2.000	Odds having COI v	w. Pos. Tes	t	6.50
Odds having COI w	v. Neg. Test	0.154	Odds having COI v	w. Neg. Te:	st	0.50
Odds Ratio		13.0000	Odds Ratio			13.000
Likelihood Ratio (	LR+)	4.0000	Likelihood Ratio (	LR+)		3.250
Pre-Test Odds		0.5000	Pre-Test Odds			2.000
Post-Test Odds		2.0000	Post-Test Odds			6.500
Pre-test Probabali	ity	0.3333	Pre-test Probabal	lity		0.666
Post-Test Probaba	ality	0.6667	Post-Test Probaba	ality		0.866
Risk Ratio (cohort	studies)	5.0000	Risk Ratio (cohort	t studies)		2.600

	Patient's SI Sc w likely is my p		
Му	Patient's SI So	core is .45	
Ho	w likely is my p	atient FTD?	
	e sample chara can estimate t	acteristics of the groups	
	our patient's s		
	our patient's s	pecific score	
}	our patient's s	pecific score FTD	
N	<b>AD</b> 32	pecific score FTD 16	

Estimating    Contingency Table Cell Sizes Derived from the Meta      and Standard Deviations of a Reference Group and a COI Gro      **IMPORTANT** Calculations assume normal distribution of scores      Use only within the scope of this assumption      Reference Group    COI Group      Enter Mean, SD and Target Score    Enter Mean, SD and Target Score      Mean    0.62      SD    0.43
**IMPORTANT** Calculations assume normal distribution of scores      Use only within the scope of this assumption    COI Group      Reference Group    COI Group      Enter Mean, SD and Target Score    Enter Mean, SD and Target Score      Mean    0.43
Use only within the scope of this assumption    COI Group      Reference Group    COI Group      Enter Mean, SD and Target Score    Enter Mean, SD and Target Score      Mean    0.43
Reference Group  COI Group    Enter Mean, SD and Target Score  Enter Mean, SD and Target Score    Mean  0.43
Enter Mean, SD and Target Score      Enter Mean, SD and Target Score        Mean      0.43      Mean      0.62
Enter Mean, SD and Target Score      Enter Mean, SD and Target Scor        Mean      0.43      Mean      0.62
Mean 0.43 Mean 0.62
0.42
SD 0.12 SD 0.21
Target Score 0.65 Target Score 0.65
z-score 1.83333 z-score 0.14286
Percentile Above 0.03 Percentile Above 0.44
Percentile Below 0.97 Percentile Below 0.56
Enter N for Ref Group 32 Enter N for COI Group
Est. N Above Target score 1 Est. N Above Target score

