
Studies of Medical Tests



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Accelerating Research to Improve Health

UCSF

Overview

- **General Issues**
 - Contrast with other observational designs
 - Types of research questions addressed
 - “Gold standard” issues
 - Spectrum of disease and of results
 - Sampling and generalizability
- **Examples:**
 - Reproducibility and Accuracy of S_3
 - Visual assessment of jaundice

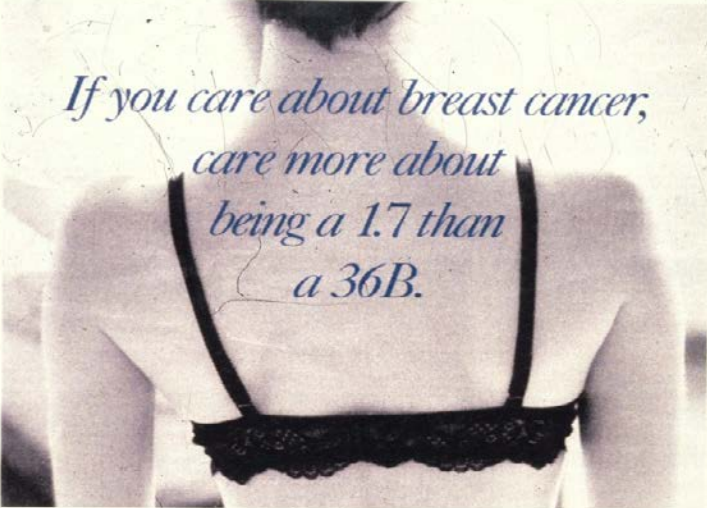


What do we mean by “tests”?

Studies, procedures, maneuvers intended to provide information about the probability of different health states, e.g.,

- Items of the history and physical examination
- Blood tests
- X-rays
- Endoscopies





*If you care about breast cancer,
care more about
being a 1.7 than
a 36B.*

Know your breast cancer risk assessment number.

Know that NOLVADEX® (tamoxifen citrate) could reduce your chances of getting breast cancer if you are at high risk.

This new risk assessment test is a simple set of questions your doctor will ask you. The results will give you a number that estimates your chances of developing breast cancer over the next 5 years. A score of 1.7 or above is considered high risk. Most likely you won't be at high risk, but you owe it to yourself to find out.

Knowing your number gives you power, and knowing about Nolvadex should give you hope. Because even if you are at high risk, Nolvadex has now been proven to significantly reduce the incidence of breast cancer in women at high risk.

The proof? In a landmark study of women 35 years or older and at high risk of breast cancer, women who took Nolvadex had fewer breast cancers than women taking sugar pills. Nolvadex decreases but does not eliminate the risk of breast cancer, and did not show an increase in survival.

Nolvadex is not for every woman at high risk.

In the study, women taking Nolvadex were 2 to 3 times more likely to develop uterine cancer or blood clots in the lung and legs, although each of these occurred in less than 1% of women. Women with a history of blood clots should not take Nolvadex. Stroke, cataracts, and cataract surgery were more common with Nolvadex. Most women experienced some level of hot flashes and vaginal discharge. **Pregnant women or women planning to become pregnant should not take Nolvadex.** You and your doctor must carefully discuss whether the potential benefits of Nolvadex will outweigh these potential side effects.

Call your doctor and ask for your Breast Cancer Risk Assessment test. For a free video, call 1 800 898-8423 to learn more about Nolvadex and the Breast Cancer Risk Assessment test.

Nolvadex^{TABLETS}
TAMOXIFEN CITRATE

There is something you can do.

Please see important information on adjacent page.

NI-1252-599

“Tests” include history questions

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How are studies of tests similar to other clinical research studies?

- Same basic pieces
 - Research question
 - Study design
 - Subjects
 - Predictor variables
 - Outcome variables
 - Analysis
- Same need to generalize from study subjects to populations and from measurements to phenomena of interest



How are studies of tests different?

- Address different types of questions
 - Primarily descriptive
 - Confidence intervals rather than P-values
 - Causal inference may or may not be relevant
- Different biases
 - Spectrum, verification, etc.
- Different statistics used to summarize results
 - Kappa, sensitivity, specificity, ROC curves, likelihood ratios



Sample size for studies of diagnostic tests

- Because they are primarily descriptive, traditional hypothesis testing (Type 1 and Type 2 errors, null hypothesis, etc.) does not apply
- Goal is not to determine whether test result is associated with disease, but HOW STRONGLY
- Therefore, sample size of diseased subjects is based on the WIDTH of the 95% CI desired and the estimated **sensitivity**
- Sample size of nondiseased based on the WIDTH of the 95% CI desired and the estimated **specificity**



Sample size example

- You want to estimate the sensitivity of abnormal urine smell for urinary tract infection in children.
- You estimate it might be 70%.
- You want a 95% CI with width 10% (e.g. 65%-75%)
- DCR-4 Page 81 (use 0.3)
 - $N = 323$

Sample Size -- Confidence Interval For a Proportion

Instructions: Enter parameters in the **Red** cells. Answer will appear in the **blue** cell.

- P = Expected Proportion
- W = Total Width of Confidence Interval

Confidence Level (e.g., 0.95)	P	W
0.95	0.7	0.1

Z-Alpha	
1.96	
N	323
Recalc	

www.sample-size.net
for CTSI sample size
calculator



Diagnostic Test Research Questions

- How reproducible is it?
- How accurate is it?
- How much new information does it provide?
- How often do results affect clinical decisions?
- What are the costs, risks, and acceptability of the test?
- What is the effect of testing on outcomes?
- How do the answers to these questions vary by patient characteristics?



Gold Standard -1

- Needed for studies that measure accuracy
- Can't include test being measured (Incorporation bias)
 - Example: White Blood Cell (WBC) count as a predictor of sepsis in newborns
 - “Gold standard” (+blood culture) imperfect
 - Why not include *probable* sepsis, based on judgment of treating clinicians?
 - Judgment affected by WBC count!



Gold Standard -2

- Best if applied *blindly*
 - Prevent incorporation bias
- Best if applied *uniformly*
 - Prevent verification bias, double-gold standard bias
- If imperfect, test accuracy can be under-estimated or over-estimated
 - Example: culture vs PCR for pertussis
- If nonexistent, think about WHY you want to make the diagnosis
 - Examples: Attention-deficit hyperactivity disorder (ADHD), autism



Spectrum of Disease, Non-disease and Test Results

- Disease is often easier to diagnose if severe
- “Non-disease” is easier to diagnose if patient is well than if the patient has other diseases
- Test results will be more reproducible if ambiguous results excluded



Sources of variation, generalizability and sampling

- Test characteristics like sensitivity and specificity may depend on:
 - How the specimen is obtained and processed
 - How and by whom the test is done and interpreted
- Consider whether you need to sample or stratify results at these levels (depends on the RQ)



Studies of Reproducibility

- For tests with no gold standard
- Often done as part of quality control
 - For a larger study
 - For patient care



Example 1: The Third Heart Sound

- RQs:
 - What is interobserver variability for hearing S_3 ?
 - How does this vary with level of experience?
- Design: cross-sectional study

ORIGINAL INVESTIGATION

Relationship Between Accurate Auscultation of a Clinically Useful Third Heart Sound and Level of Experience

Gregory Marcus, MD; Joshua Vessey, MD; Mark V. Jordan, MD; Michele Huddleston, RN; Barry McKeown, MD; Ivor L. Gerber, MD; Elyse Foster, MD; Kanu Chatterjee, MB; Charles E. McCulloch, PhD; Andrew D. Michaels, MD

Marcus et al., Arch Intern Med. 2006;166:617-622



Study Subjects

- Adults scheduled for non-emergency left-sided heart catheterization at UCSF 8/03 to 6/04
- N=100

Marcus et al., Arch Intern Med. 2006;166:617-622



Examining Physicians

- Cardiology attendings (N=26)
- Cardiology fellows (N= 18)
- Internal medicine residents (N=54)
- Internal medicine interns (N=48)
- All from UCSF

• *Marcus et al., Arch Intern Med.*
2006;166:617-622



Measurements

- Auscultation
 - Standard procedure in quiet room
 - Examiners blinded to other information
- Phonocardiogram with computerized analysis to determine S_3



Analysis: Kappa

- Measures agreement beyond that expected by chance
- For *ordinal* variables use *weighted* kappa, which gives credit for coming close

Kappa	Agreement
0-0.2	Poor
0.2-.04	Fair
0.4-0.6	Moderate
0.6-0.8	Good
0.8-0.9	Very Good
0.9-1	Excellent



Results: Comparison of Auscultation with Phonocardiogram

	Kappa	P
Attendings	0.29	0.003
Fellows	0.37	<.001
Residents	0.13	0.11
Interns	0.04	0.36

Marcus, G. et al. Arch Intern Med 2006;166:617-622.

ARCHIVES OF
INTERNAL MEDICINE

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Issues: 1. Generalizability

- Were patients representative of those in whom an S_3 is relevant?
- Were study participants (MDs) representative of those who listen for S_3 ?
 - UCSF representative?
 - How many of the attending examinations were done by Kanu Chatterjee?



Issues: 2. Does test provide *new* information?

- Blinding observers to rest of H & P not sufficient
 - Information could still be redundant
- Options
 - Compare accuracy of prediction of (gold standard) left ventricular end-diastolic pressure (LVEDP) with and without examination for S_3
 - Record all clinical information and use multivariate techniques



Issues 3: Value of Information

- What decision is the test supposed to help with?
- How often does the test change the decision?
- What is the effect of the change in decision on outcome?
- What is the *value* of that effect?



Example 2: Should every newborn have a bilirubin test before discharge?

- About 60% of newborns develop some jaundice
- Usually it is harmless, but can be dangerous if very high
- Proposal: check bilirubin level before discharge on all newborns
 - Recommended by some experts but insufficient evidence to recommend in guideline
 - Alternative: visual estimation



CDC Posters



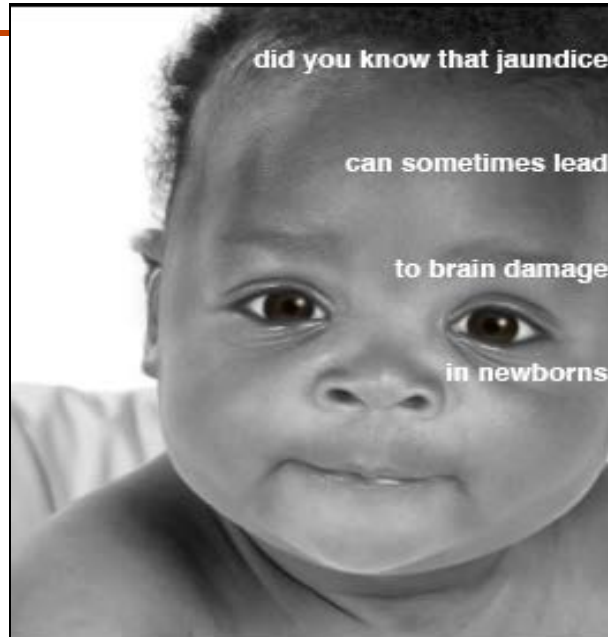
did you know that jaundice
can sometimes lead
to brain damage
in newborns



Before you leave the hospital ask your doctor or nurse about a jaundice bilirubin test for your baby.

All babies can get jaundice in the first few days of life. So ask your doctor or nurse about a jaundice bilirubin test—it's the only way to know for sure if your baby has jaundice that needs to be treated. Having the baby in the sunlight is not a safe way to treat jaundice. Also, make sure a doctor or nurse checks your baby for jaundice 48 hours after your baby leaves the hospital.

For more information, visit www.cdc.gov/jaundice



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Advancement of Dermal Icterus in the Jaundiced Newborn

Kramer LI, AJDC 1969;118:454

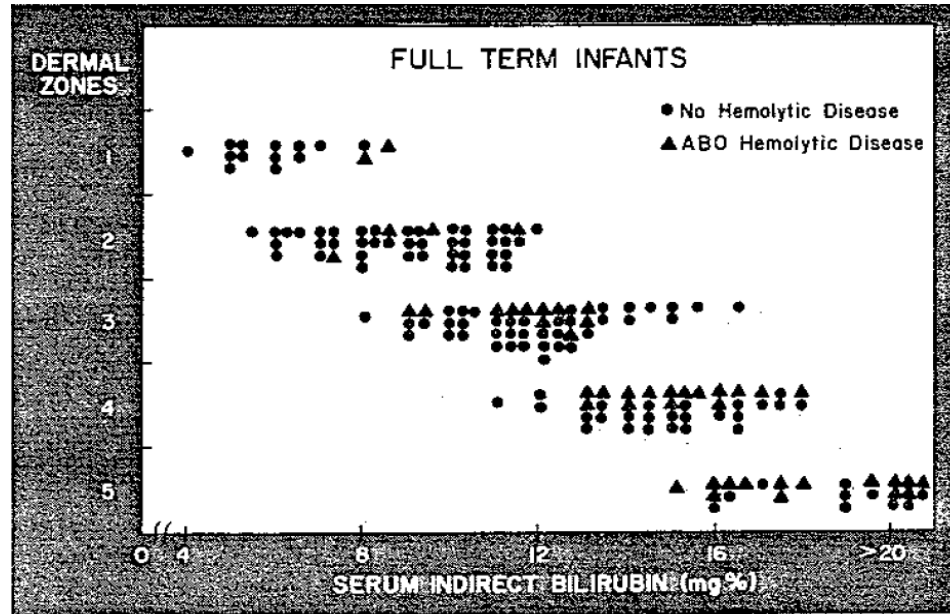
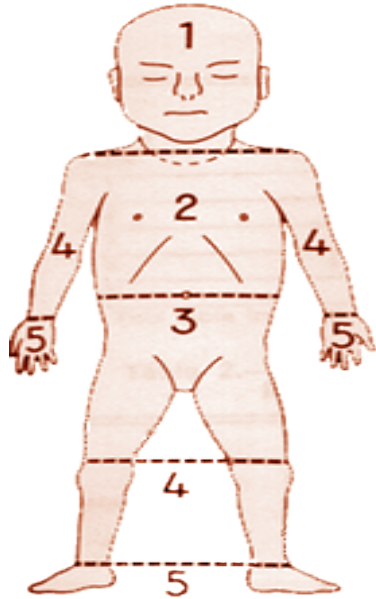


Fig 2.—Relationship of dermal icterus to serum bilirubin in full term infants.



Accuracy of Clinical Judgment in Neonatal Jaundice*

- RQ: How well can clinicians estimate bilirubin levels in jaundiced newborns?
- Study Design: cross-sectional study
- Subjects: 122 healthy term newborns (mean age 2 days) whose total serum bilirubin (TSB) was measured in the course of standard newborn care

*Moyer et al., Archives Peds Adol Med 2000; 154:391



Accuracy of Clinical Judgment in Neonatal Jaundice*

- Measurements:
 - Jaundice assessed by attendings, nurse practitioners and pediatric residents (absent/slight/obvious) at each body part and Total Serum Bilirubin (TSB) estimated
 - TSB levels measured in clinical laboratory
- Analysis
 - Agreement for jaundice at each body part by Weighted Kappa
 - Sensitivity and specificity for TSB ≥ 12 mg/dL

*Moyer et al., Archives Peds Adol Med 2000; 154:391



Results: 1.

Agreement Between Observers for Jaundice in Infants

Site	Weighted κ	95% Confidence Interval
Face and neck	0.16	-0.02 to 0.34
Neck to nipple line	0.15	0.01 to 0.29
Nipple line to umbilicus	0.23	0.09 to 0.38
Umbilicus to groin	0.19	0.05 to 0.34
Upper legs	0.20	0.06 to 0.35
Lower legs	0.16	-0.01 to 0.34
Soles	-0.06	-0.20 to 0.08
Arms	0.02	-0.14 to 0.18
Palms	0.05	-0.16 to 0.25
Conjunctiva	0.10	-0.04 to 0.23
Tip of nose	0.08	-0.07 to 0.22
Palate	0.11	-0.03 to 0.25

Moyer et al., Arch
Peds Adol Med 2000;
154:391



Results: 2

- Sensitivity of jaundice below the nipple line for TSB ≥ 12 mg/dL = 97%
- Specificity = 19%

Editor's Note: The take-home message for me is that no jaundice below the nipple line equals no bilirubin test, unless there's some other indication.

--Catherine D. DeAngelis, MD

Moyer et al., APAM 2000; 154:391



Issues: 1

- No information on the numbers of different types of examiners or their years of experience
 - Generalizability uncertain
- No 95% CI around sensitivity and specificity
 - Sensitivity based upon 67/69
 - 95% CI: 90% to 99.6%



Issues: 2

- Verification bias
 - Infants NOT jaundiced below the nipples not likely to have a TSB measured
 - Sensitivity (97%) too high, specificity (19%) too low

	TSB $\geq$ 12	TSB $<$ 12
Jaundice below nipples	a	b
No jaundice below nipples	c ↓	d ↓



Extreme verification bias: Does This Child Have Appendicitis?

JAMA. 2007;298:438-451

Table 2. Accuracy of Symptoms

Symptoms by Source	Sensitivity	Specificity	Positive Likelihood Ratio (95% Confidence Interval)	Negative Likelihood Ratio (95% Confidence Interval)
Pain Symptoms				
Symptom duration <24 h				
O'Shea et al, ³⁵ 1988	0.50	0.40	0.83 (0.55-1.2)	1.3 (0.82-1.9)
Lintula et al, ⁴⁸ 2005	0.44	0.46	0.82 (0.56-1.2)	1.2 (0.85-1.7)
Right lower quadrant pain				
Summary, level 3 studies			1.2 (1.0-1.5)	0.56 (0.43-0.73)
Pearl et al, ²⁰ 1995	0.96	0.05	1.0 (0.98-1.0)	0.73 (0.35-1.5)
Kharbanda et al, ³⁷ 2005	0.77	0.44	1.4 (1.2-1.6)	0.52 (0.38-0.72)
Mollitt et al, ⁵⁸ 1988	0.62	0.63	1.7 (0.97-3.0)	0.59 (0.33-1.1)

- RLQ Pain: Sensitivity = 96% Specificity = 5%
- RLQ pain was present in 96% of those with appendicitis and 95% of those without appendicitis.
- Likelihood Ratio = 1.0



Do S_3 and S_4 matter?

- RQ: How well do S_3 and S_4 predict abnormal (≥ 15 mm Hg) LVEDP?
- Design: cross-sectional study

ORIGINAL CONTRIBUTION

Association Between Phonocardiographic Third and Fourth Heart Sounds and Objective Measures of Left Ventricular Function

JAMA. 2005;293:2238-2244



Study Subjects

- Adults scheduled for non-emergency left-sided heart catheterization at UCSF 8/03 to 6/04
 - Excluded if poor phonocardiographic quality (N=8) or paced rhythm (N=2)



Measurements

- Test: S_3 (Y/N) and S_3 “confidence score” from computer analysis of phonocardiogram
- “Gold Standard”: Left ventricular end-diastolic pressure ≥ 15 mm/Hg at cath



Results: S₃ present/absent

	LVEDP ≥15	LVEDP < 15	Total
S3 present	17	4	21
No S3	24	45	69
Total	41	49	90

Positive PV = $17/21 = 81\%$

Negative PV = $45/69 = 65\%$

Sensitivity =
 $17/41 =$
41%;95% CI:
(26%, 58%)

Specificity =
 $45/49 =$
92%;95% CI
(80%, 98%)



Results: “Confidence Scores”

- Many “dichotomous” tests not really dichotomous, e.g.:
 - Definite
 - Probable
 - Possible
 - Absent
- Phonocardiogram software generates “confidence scores” for S_3 and S_4



Analysis: ROC Curve

- ROC = “Receiver Operating Characteristics”
- Illustrate tradeoff between sensitivity and specificity as the cutoff is changed
- Discrimination of test measured by area under the curve (AUROC = c)
 - Perfect test 1.0
 - Worthless test 0.5

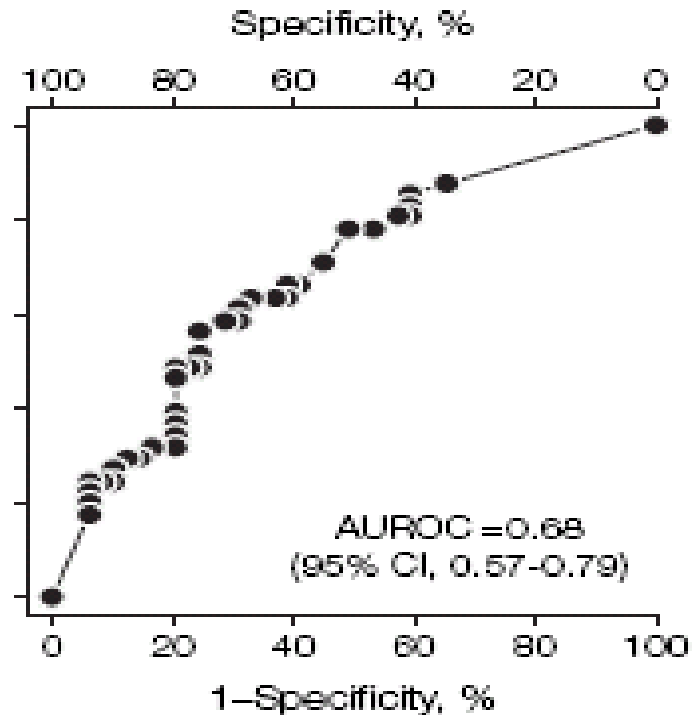
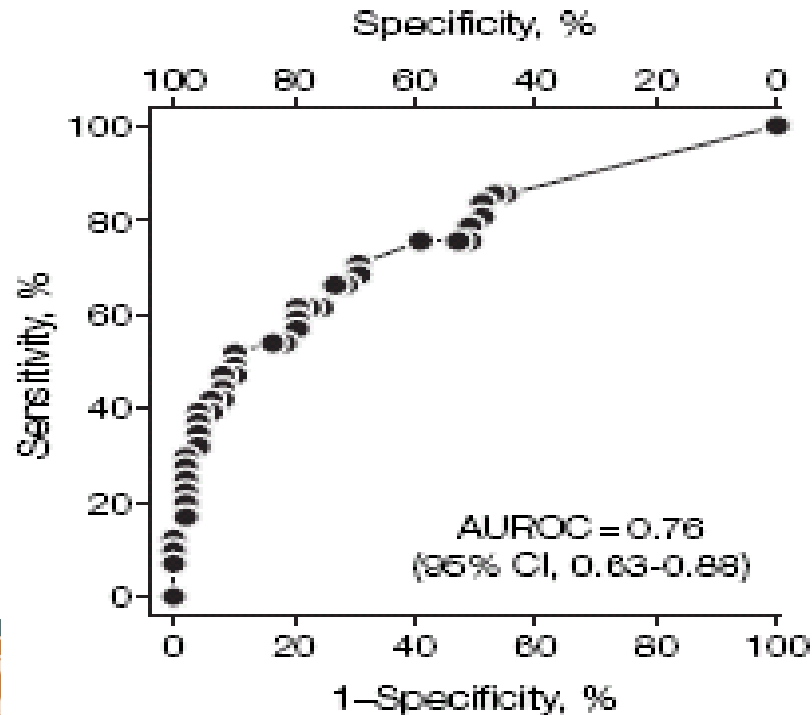


Results: S_3 & S_4 Confidence Scores

Left Ventricular End-Diastolic Pressure

S_3

S_4



TIP

- If you are doing a study of test accuracy, Google STARD Checklist
- STARD= Standards for Reporting of Diagnostic Accuracy
- (Like CONSORT for clinical trials)



Summary: Think about

- The *question* you are trying to answer and why.
- *Sampling* of subjects, and maybe of people doing or interpreting the test
- Measurements – optimal or “real life”?
- Analysis – Kappa, Weighted Kappa, Sensitivity, Specificity, Likelihood Ratios, ROC curves, with confidence intervals
- Acknowledge limitations, think about the effect they would have on results



Good Luck!



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