

# Statistician's Perspective of Multiplex Assays

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# Disclaimer

- The presentation reflects the views of the author and are not necessarily the views of the FDA.
- Statisticians rely on clinical and scientific colleagues to determine what is or is not appropriate performance for a test. Asking a statistician to tell you the sample size without providing more info is.....

# Outline

- Multiplex Assays
- Statistics 101 for Diagnostic devices
- Genetic tests
- Multiplex pathogen tests
- Conclusions

# Multiplex Assays

- “Two or more targets simultaneously detected via a common process of sample preparation, target or signal amplification, allele discrimination, and collective interpretation.”
- CLSI Guideline: MM17  
Verification and Validation of Multiplex Nucleic Acid Assays

# Examples

- Human genotyping
  - RBC Antigens (CBER) CYP450 Genes (CDRH)
- Multiple pathogen detection
  - Blood donor screening (CBER)
  - Respiratory virus panel (CDRH)
- Pathogen subtyping
  - HIV Genotyping (CBER)
  - Flu Genotyping (CDRH)

# Clinical Reference Standard

- “considered to be the best available method for establishing the presence or absence of the target condition...it can be a single test or method, or a combination of methods and techniques, including clinical follow-up”
- does not consider outcome of new test under evaluation (see *discrepant resolution* in FDA guidance (2007))

# Clinical Reference Standard: for “Target condition of interest”

- Presumes patients are from intended use population.
- Clinical reference standard is usually a review office decision

Can combine clinical (e.g. symptoms)  
and analytical results

- Genotyping for inherited genes:  
Bidirectional sequencing with quality check

# Some basics:

## Statistics 101 for Diagnostic Devices

- One marker at a time compared with  
clinical reference standard:

**Sensitivity=**

$P(\text{test : detected} \mid \text{target condition "A" there})$

**Specificity=**

$P(\text{test : not detected} \mid \text{target condition "A" not there})$

- Need two values per “output”

Need 95% confidence intervals for sensitivity and specificity  
(See FDA Guidance (2007))

Statistical methods for agreement measures similar.



# Estimates of “Sensitivity” / Specificity Score(CDRH) or Exact(CBER)

Number specimens	Observed Performance	95% (2-sided) Lower Conf. Bound
5	5/5=100%	56.5% 47.8%
30	30/30=100%	88.6% 88.7%
35	35/35=100%	90.1%
60	60/60=100%	94.0%
120	120/120=100%	96.9%
<b>10000</b>	<b>10000/10000</b>	<b>99.96%</b>

# Estimates of “PPA”/ “NPA” Score(CDRH) or Exact(CBER)

Number specimens	Observed Performance	95% (2-sided) Lower Conf. Bound
5	5/5=100%	56.5% 47.8%
30	30/30=100%	88.6% 88.7%
35	35/35=100%	90.1%
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## Considering prevalence in prospective studies: Negative and Positive Predictive values

- Negative Predictive Value (NPV):  
Num without condition of interest  
Number that test negative
- Positive Predictive value (PPV):  
Num with condition of interest  
Number that test positive
- NPV and PPV depend on prevalence
- Assumes: clinical reference standard

# Notation

	Interpretation via clinical reference std	
	Target condition +	Target condition -
Device output		
Target condition +	True Positive (TP)	False Positive (FP)
Target condition -	False Negative (FN)	True Negative (TN)

Prevalence  $(TP+TN)/(\text{Total sample size})$

Sensitivity  $=100*TP/(TP+FN)$ ; Specificity  $=100*TN/(TN+FP)$

PPV  $= 100*TP/(TP+ FP)$ ; NPV  $=100*TN/(TN+FN)$

# Prevalence 9%

	Interpretation via clinical reference std	
	Target condition +	Target condition -
Device output		
Target condition +	99	10
Target condition -	1	990

Prevalence  $100/1100 = 9\%$

SE =  $99/100 = 99\%$     SP =  $990/1000 = 99\%$

PPV =  $99/109 = 91\%$     NPV =  $990/991 = 99.9\%$

# Prevalence 1%

	Interpretation via clinical reference std	
Device output	Target condition +	Target condition -
Target condition +	99	100
Target condition -	1	9900

Prevalence  $100/10100 = 1\%$

SE =  $99/100 = 99\%$     SP =  $9900/10000 = 99\%$

PPV =  $99/199 = 50\%$     NPV =  $9900/9901 = 99.99\%$

# Guidances/Guidelines

- CLSI MM17 Multiplex; EP5 Precision
- FDA:

Pharmacogenetic tests and genetic tests for heritable markers

Multiplex instrumentation

Reporting of Results for Diagnostic Tests

Special control guidances

Note: Blood donor pathogen testing: BLA!

# Heritable Markers Guidance

- Some devices have multiple intended uses
- More than one study may be needed
  - e.g. carriers or those with congenital disease
- Rare alleles, mutations, genotypes:
  - Challenge
- Need supporting literature to justify reporting of specific mutations
- May still need big study. Role of banked specimens is review office decision.



# Heritable Markers Guidance: Device Design

- All elements of sample prep need to be documented
- Matrix type(s) specified
- Test platform and technology, buffers, etc
- How much DNA and/or sample is needed to run the test? What proof do you have?
- Internal and external controls?

# What **statisticians** need to know

- What does your device report
- Which genotypes/SNPs/Alleles does it detect
- What algorithms does it use to interpret results...was it clearly defined before the start of the study?
  - e.g. how were cutoffs established?
  - how many of each genotype, etc are you anticipating in your study?
- Are there ambiguous results?

# Factors likely to influence study size

- Number of outputs per gene
  - Relevance of Haplotype versus SNP
- Number of genes
- Rareness of some results
  - Appropriateness of enriched studies?
- Heterogeneity across ethnic groups
  - Capture diverse study sites
- Clinical consequences of mistakes

# Blood RBC Genotyping

- Donors and patients that are mismatched:  
Patients can die or build up antibodies faster
- There are 29 systems for typing red blood cells:  
ABO    Rh+/-    ..... Kell JMH

Cannot rely solely on a genotyping test:

Patients may receive blood from multiple donors  
at once or may need repeat transfusions

Blood often divided into component parts:

More patients impacted by errors

# Interpreting RBC Genotyping assays

- One SNP at a time?
- Phenotype?  
Serology is better understood
- Overall concordance is insufficient:  
**one number does not capture performance**
- Need: Probability “device reports genotype mapping to correct result for serotype class” given “patient’s serotype”

# Interpreting the Assays

- For common phenotypes:  
95% Lower confidence bound >99%
- Rare genotypes or phenotypes: talk to CBER
- If only comparing to traditional serology, can only claim agreement on the label
- Also report agreement to serology on patient level
- Expect to provide supporting literature.

# Precision studies

- Panel members: with true genotype known
  - Common genotypes
  - Genotypes that challenge the device
  - External controls
- Capture all assay steps (e.g. DNA extraction) (MM17)
- 4 sites (3 external and one internal)
- Sources:  
sites, operators, instruments, day to day and lot to lot  
role of “confounding”: good and bad

# Multiplex pathogen assays

- Blood donor screening

If you are going to test 5 pathogens..

convenience and efficiency of single device

- Concerns over devices that test for lots of bugs:

How many false positives? (Alarm fatigue?)

Matrix may not be optimized for all

- Recognizing co-infections (see MM17)



# Analytic Studies (CBER)

- Limit of detection (probit analysis..3 lots)  
Calculated for WHO standard  
Validated for other genotypes
- Levels for precision studies: driven by LOD.
- Analytic specificity:  
will other pathogens mess up my test?
- Endogenous and Exogenous interferents  
Exogenous interferents: fewer in healthy pop?

# Conclusions

Be realistic when designing the device

Consider doing HW on frequency of various genotypes or pathogens your device will detect.. does this vary by site?

Submit a pre-IDE including analytical and clinical studies.

For genetic markers or devices that capture lots of pathogens:

Unlikely: a simple formula for sample size

# References

- Pepe (2003) The Statistical Evaluation of Medical Tests for Classification and Prediction Oxford Press
- Zhou et al (2002) Statistical Methods in Diagnostic Medicine Wiley

## More references

- Instrumentation for Clinical Multiplex Test Systems: Guidance for Industry and FDA Staff

[http://www.fda.gov/  
MedicalDevices/DeviceRegulationandGuidance/GuidanceDoc  
uments/ucm077819.htm](http://www.fda.gov/MedicalDevices/DeviceRegulationandGuidance/GuidanceDocuments/ucm077819.htm) 2005

- Pharmacogenetic tests and genetic tests for heritable markers June 2007
- FDA posts guidances on public website.

# Still More references

- FDA(2007) Guidance for Industry and FDA Staff: Statistical Guidance on Reporting Results from Studies Evaluating Diagnostic Tests. March 2007
- FDA (2008) Draft Guidance: Establishing Performance Characteristics of In Vitro Diagnostic Devices for the Detection or Detection and Differentiation of Influenza Viruses. February 2008
- FDA (2009) Guidance for Industry and FDA Staff: Class II Special Controls Guidance Documents: Respiratory Virus Panel Multiplex Nucleic Acid Assay October 2009

Slides not presented

## Other Considerations for Precision Studies for “Heritable Genotype” Devices

- Specimen type, amt of specimen per result and stability (5 days?)
- Numbers:
  - measurements from single sample
  - results per run; results per day
- Logistics of switching operators; switching lots, etc.
- EP5 principles useful but EP5 more focused on plasma and serum sample assays.
- Can assess accuracy for each panel member