

**Bias in trials comparing paired  
continuous tests can cause  
researchers to choose the wrong  
screening modality**

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# Outline

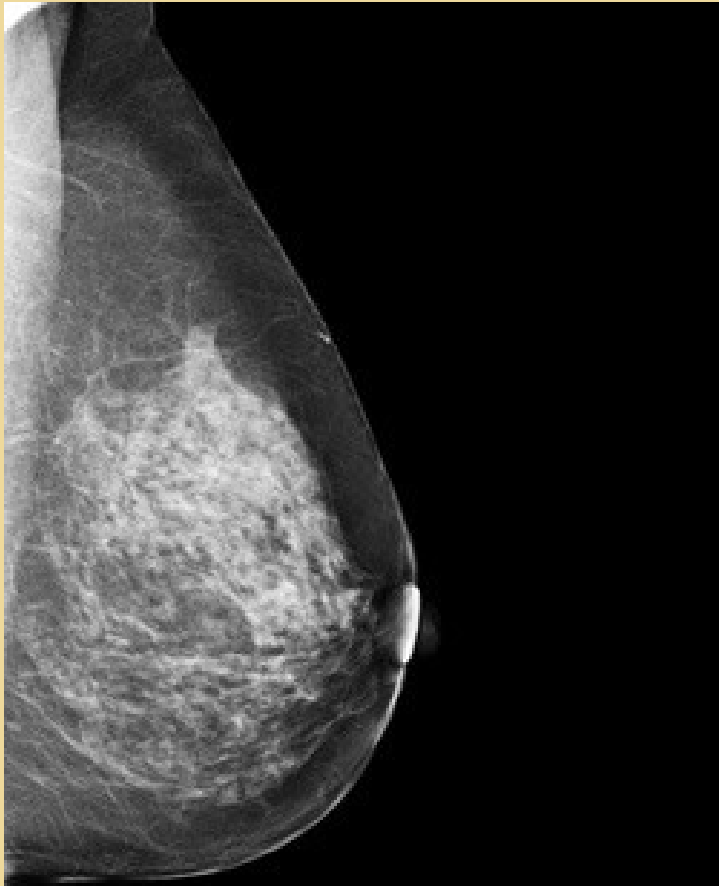
## Science

- **Scientific background**
- **Scientific question**
- **ROC curves**
- **Hypothesis testing**
- **Study design**

## Statistics

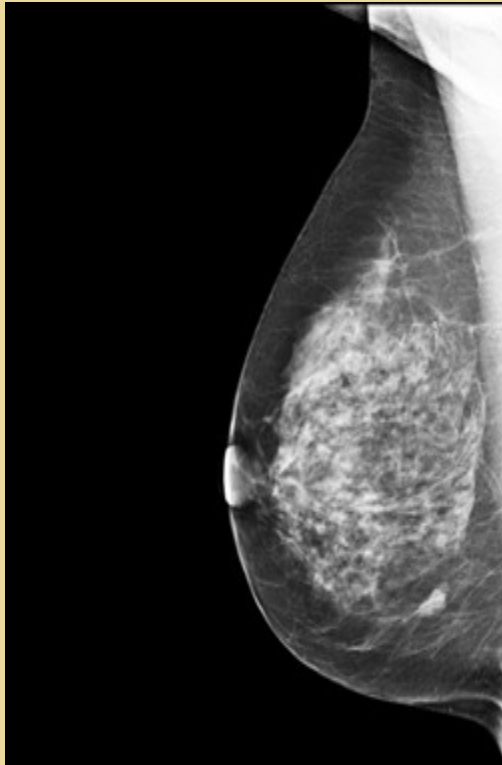
- **Limitations of design**
- **Is there bias?**
- **Assumptions**
- **Derivations**
- **Results**
- **Conclusions**

# Mammography

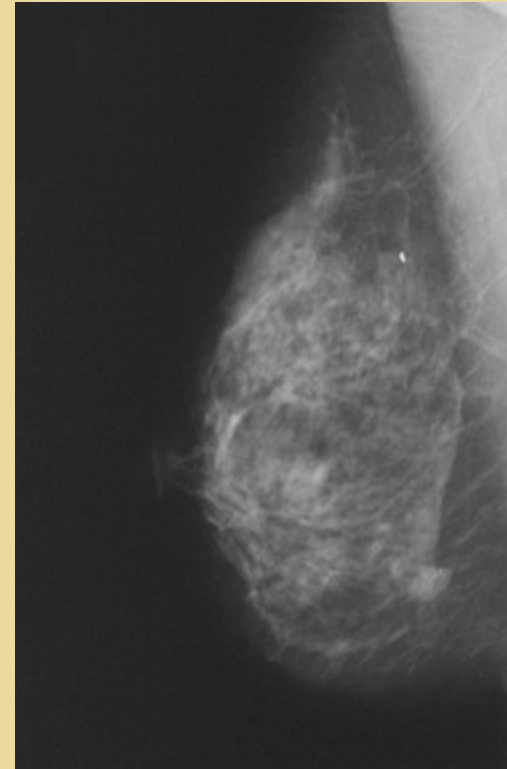


- **A screening technique for early detection of breast cancer**
- **An x-ray of the breast**
- **Screen film mammography uses film**
- **Digital mammography uses a digital detector**

# Different images produced by screen-film and digital mammography of the same breast



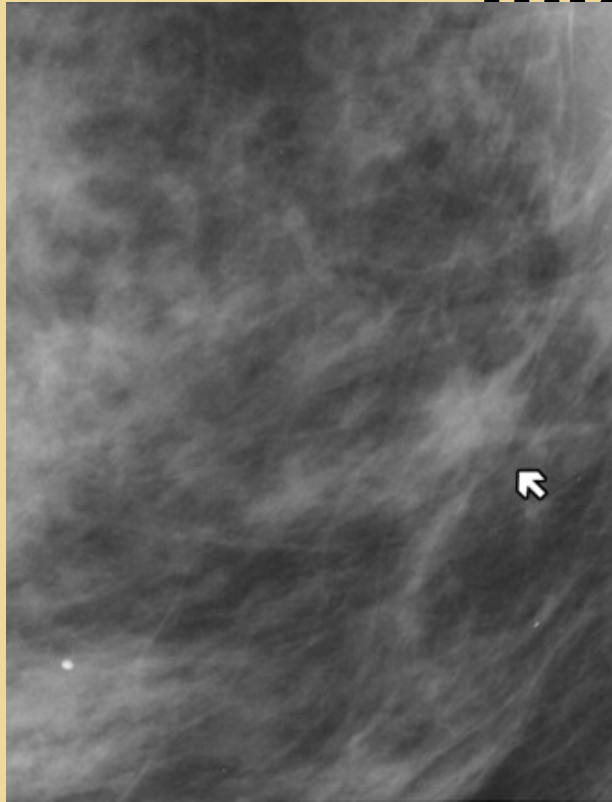
Full field digital  
mammogram



Screen-film  
mammogram

<http://www.hologic.com/wh/cc-0507>

# Invasive ductal carcinoma detected on digital but not screen film mammography



Full field digital  
mammogram



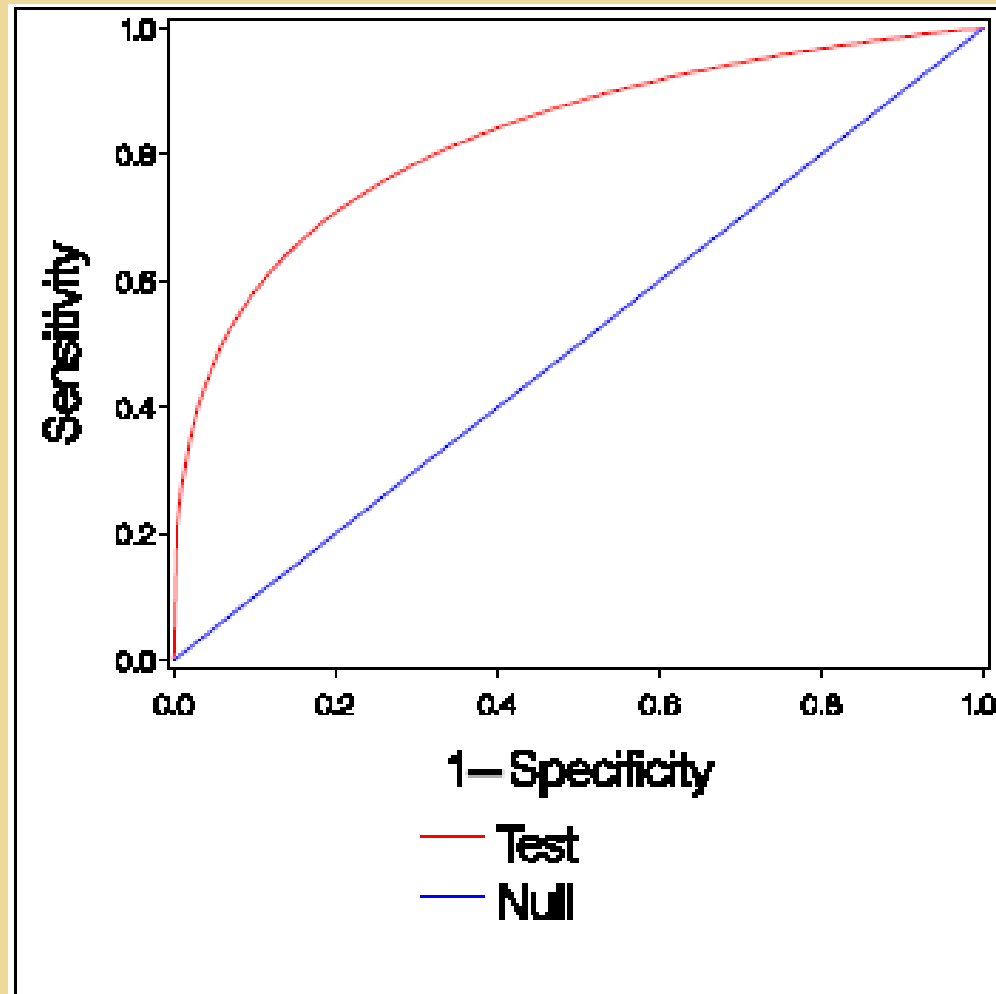
Screen-film  
mammogram

# Which screening method is best?

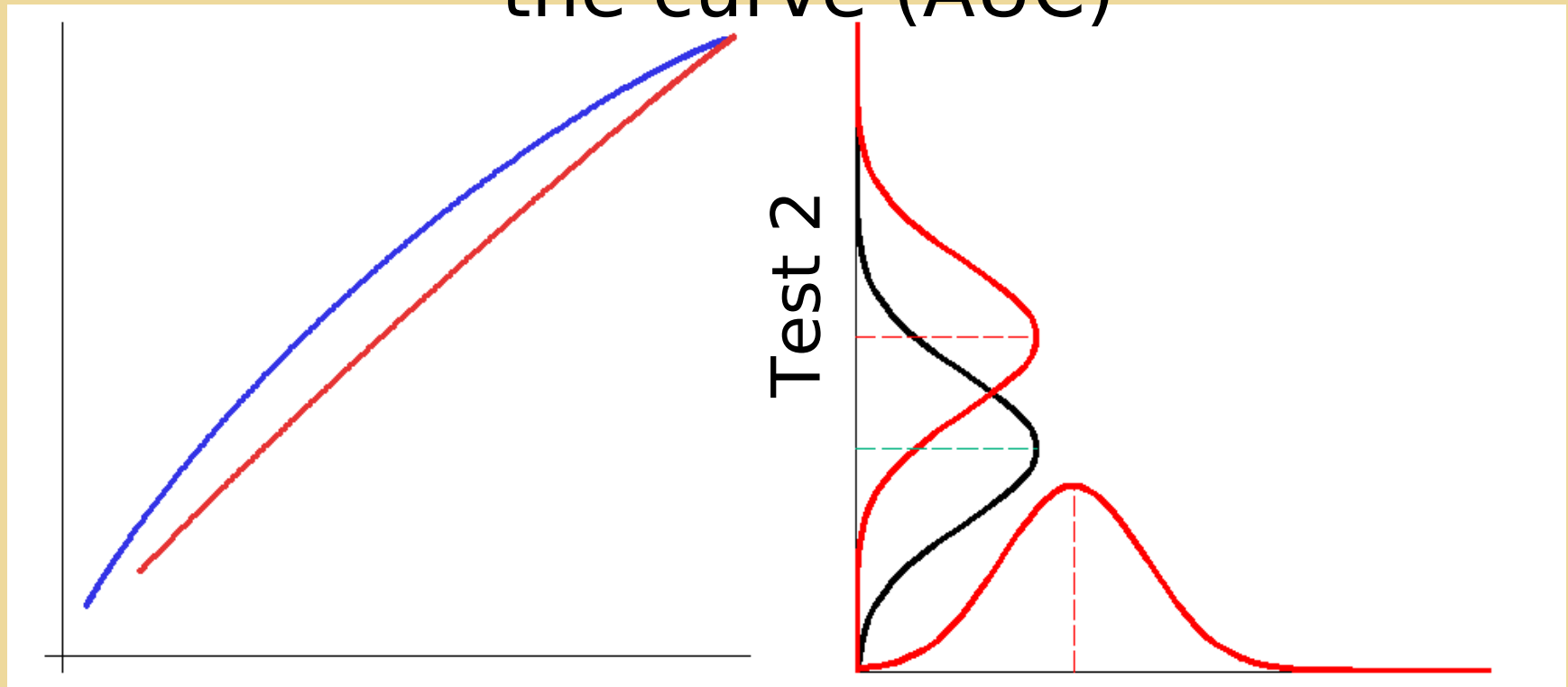
		Truth	
		+	-
Test	+	a	b
	-	c	d

$$\text{Sensitivity} = a / (a+c)$$

$$\text{Specificity} = d / (b+d)$$



# Difference between ROC distributions affects area under the curve (AUC)



Receiver operating characteristic curve (ROC)

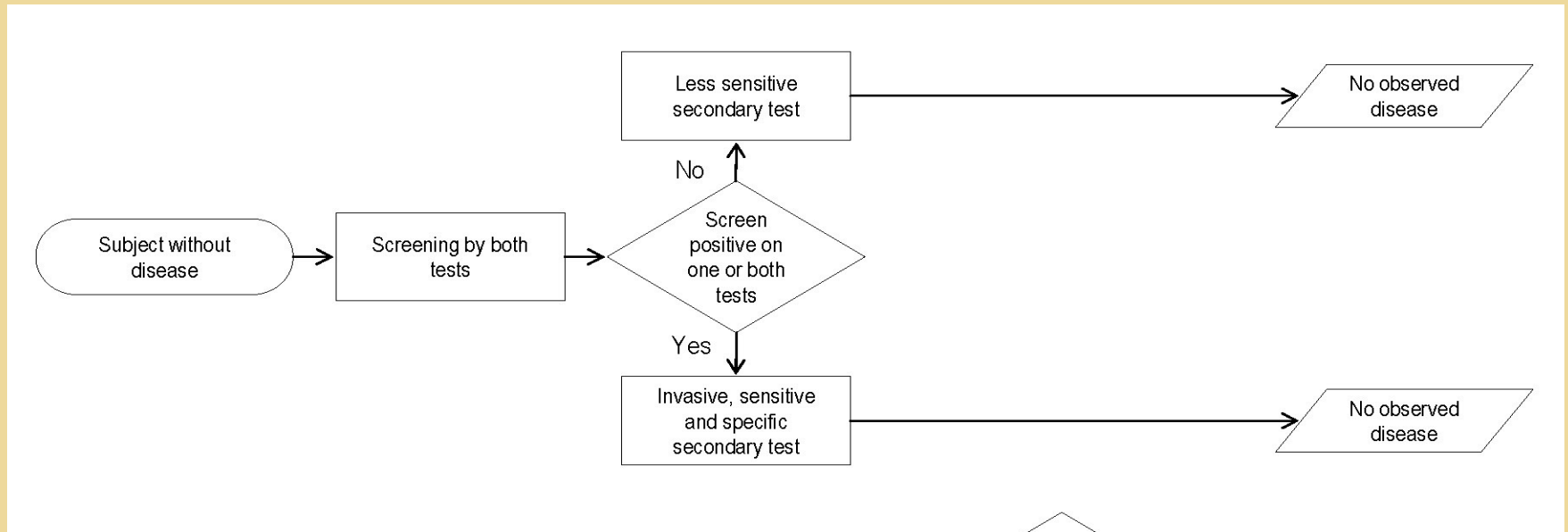
Test 1

Test 1 — Test 2 —

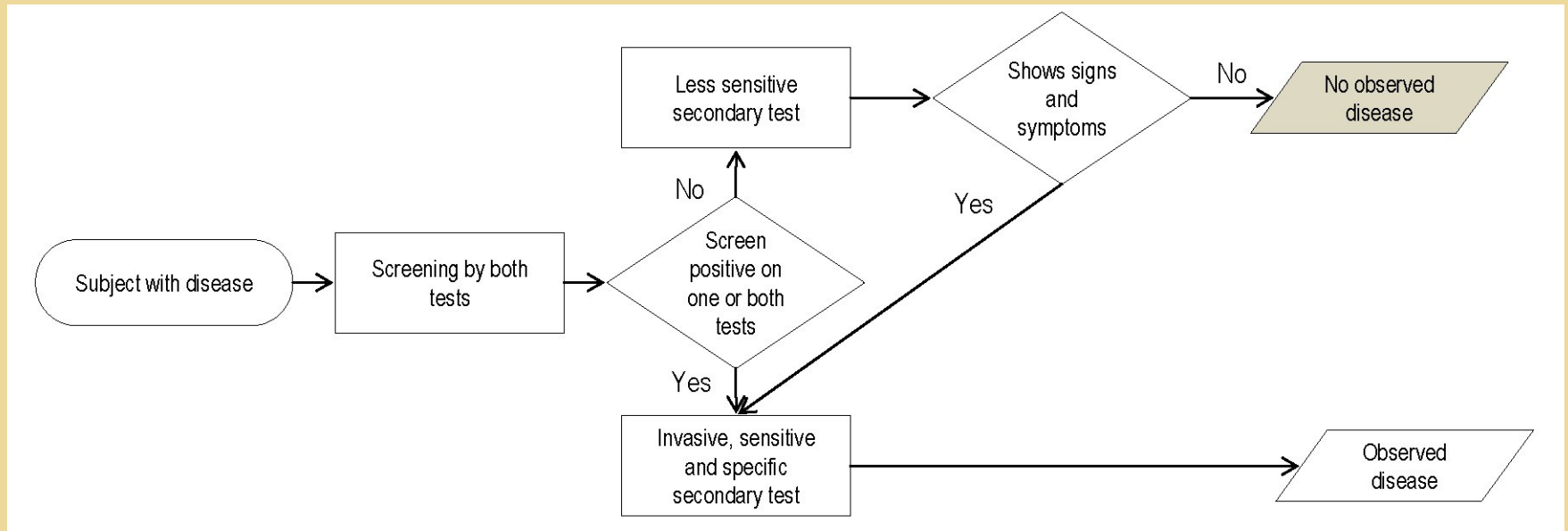
Disease — Non-diseased —  
d



# Design flowchart: participants without disease



# Design flowchart: participants with disease



# **Disease observed in one of four ways**

- **Screening test 1 is positive**
- **Screening test 2 is positive**
- **Both screening tests positive**
- **Both screening tests negative, but signs and symptoms occur**

# Question

- Is this trial design affected by **paired screening trial** bias?
- Can the study designer make the wrong decision as to which test is better?

# Two points of view

- **Omniscient**  
(know **true** disease status)
- **Study coordinator**  
(know only **observed** disease status)

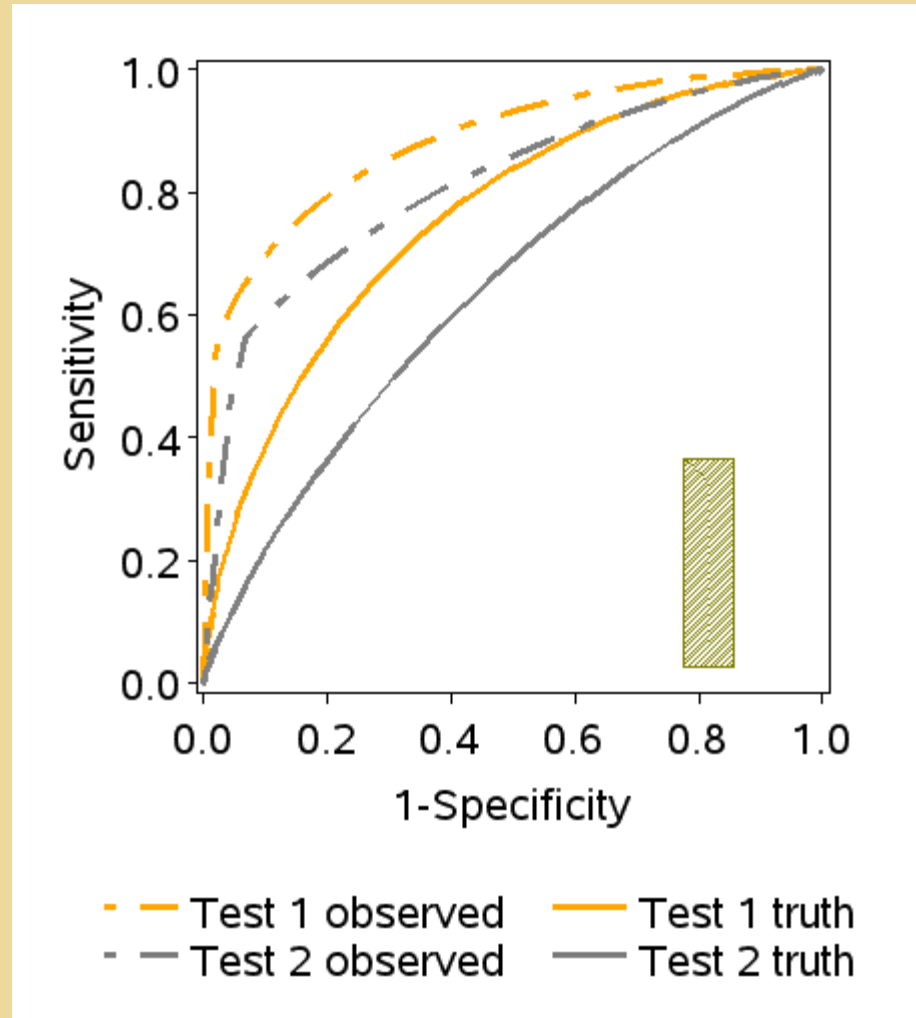
# Classify Participants by

- **Score on Test 1**
- **Score on Test 2**
- **Signs and symptoms**
- **Which secondary test used**
  - \***Infallible, invasive, sensitive and specific**
  - \***Non-invasive, but less sensitive**
- **Observed disease status**
- **True disease status**

# Derive

- **True** sensitivity for screening test 1
- **True** specificity for screening test 1
- **True** sensitivity for screening test 2
- **True** specificity for screening test 2
- **Observed** sensitivity for screening test 1
- **Observed** specificity for screening test 1
- **Observed** sensitivity for screening test 2
- **Observed** specificity for screening

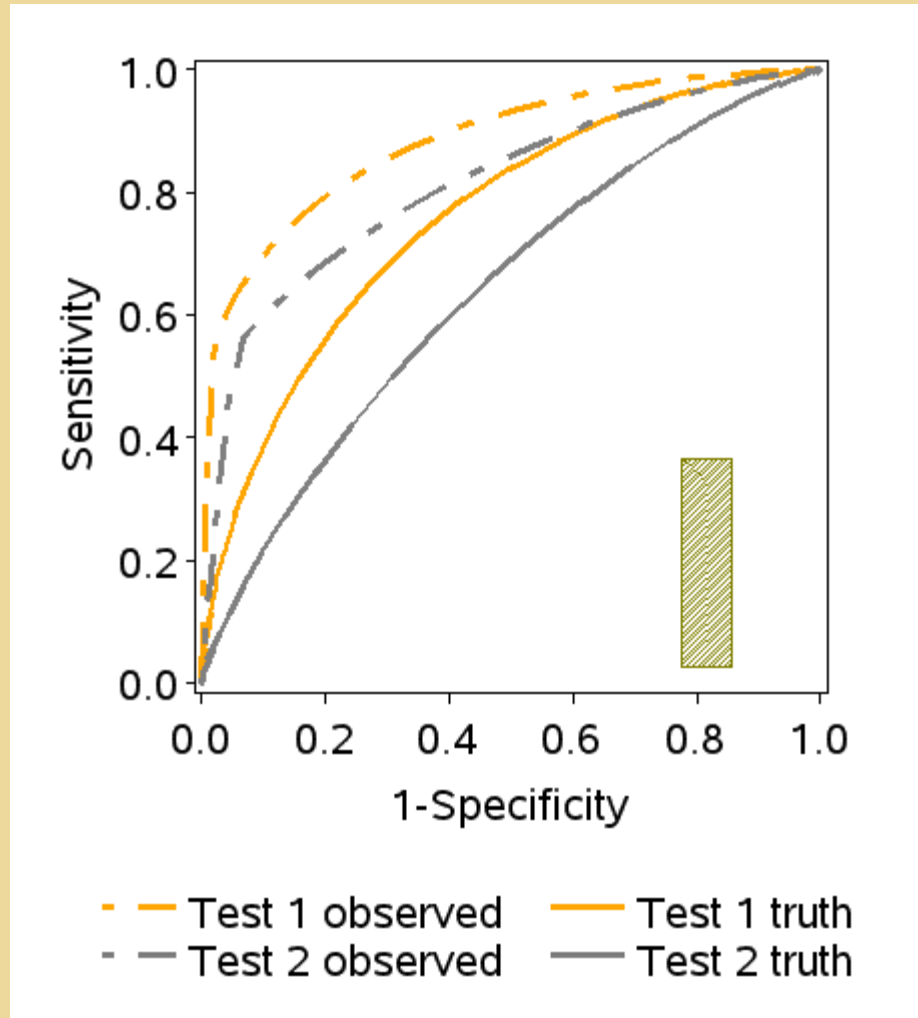
# Paired screening trial bias decreases



as the chance of signs and symptoms increases

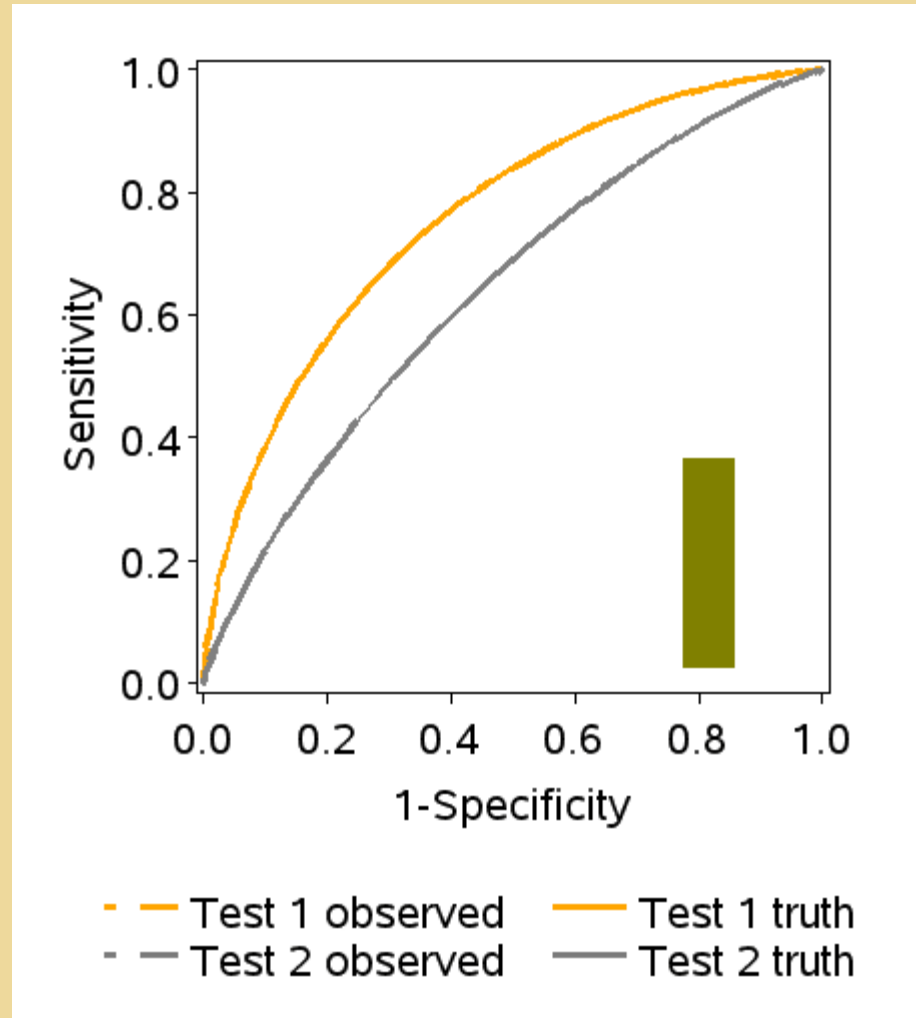


# Paired screening trial bias is high



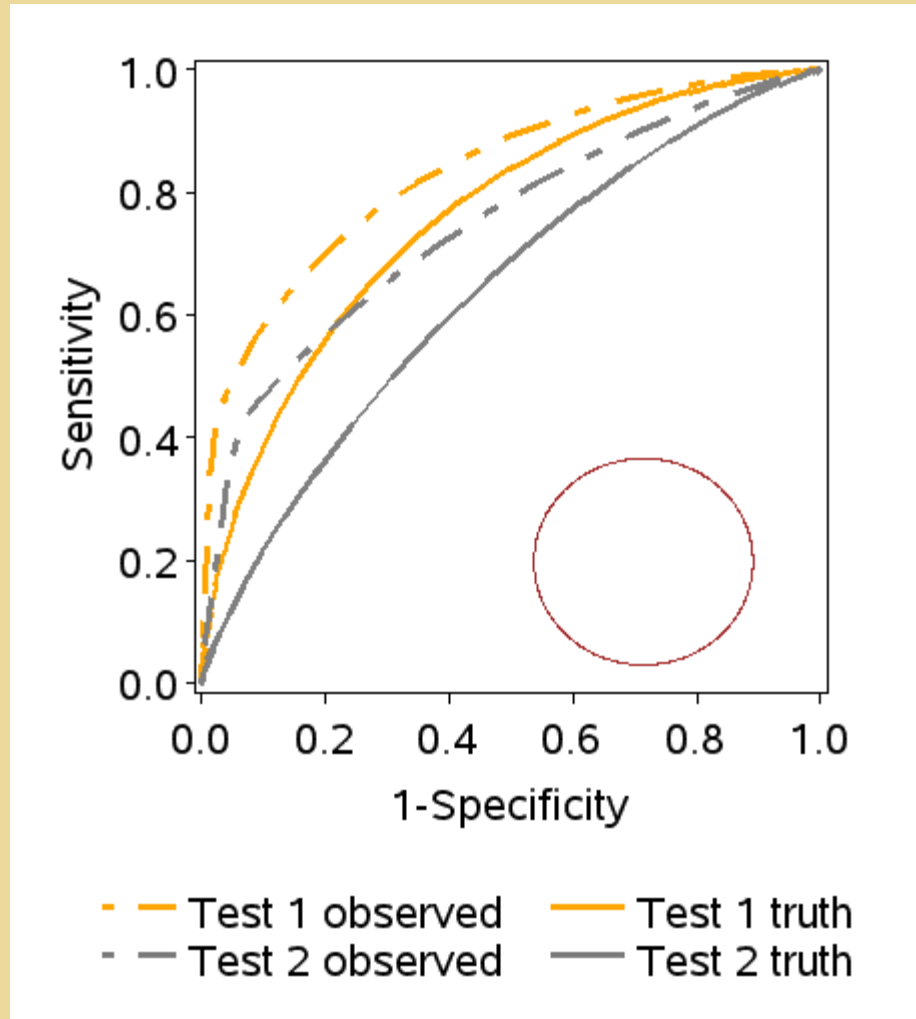
when the rate of signs and symptoms is low

# Paired screening trial bias is low



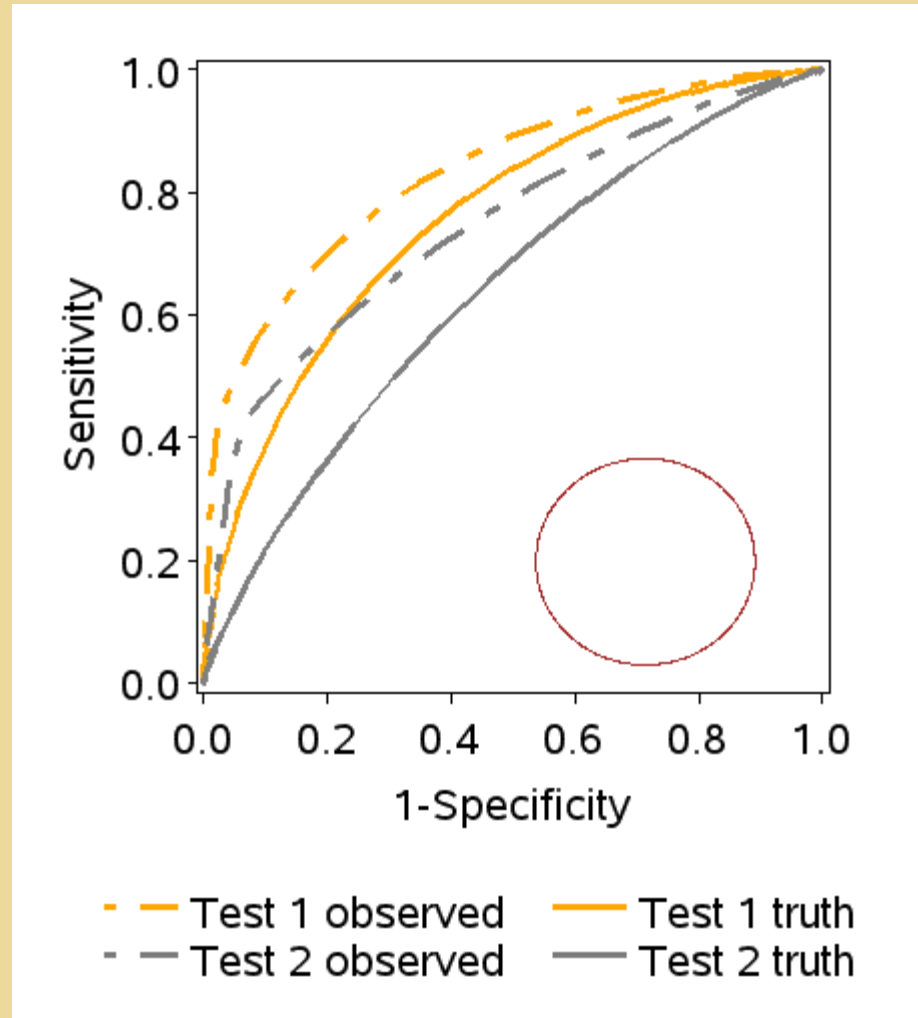
when the rate of signs and symptoms is high

# Paired screening trial bias increases



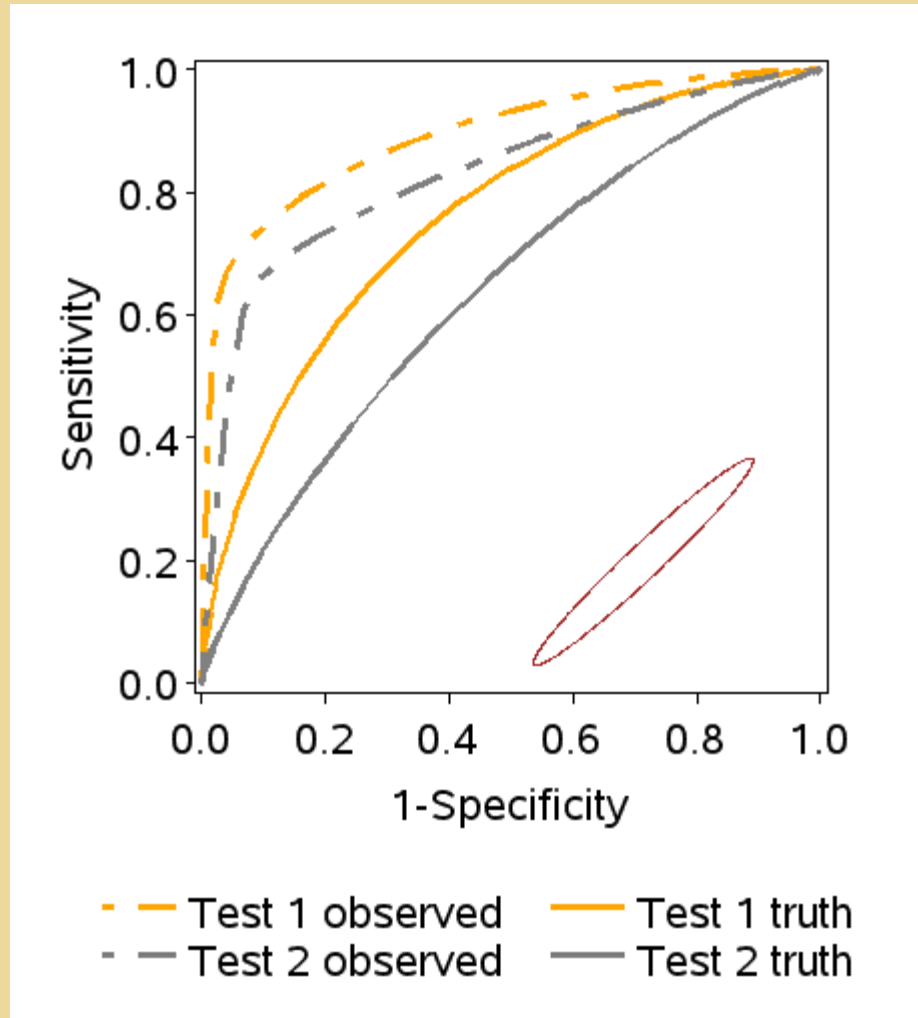
the correlation between screening tests increases

# Paired screening trial bias is low



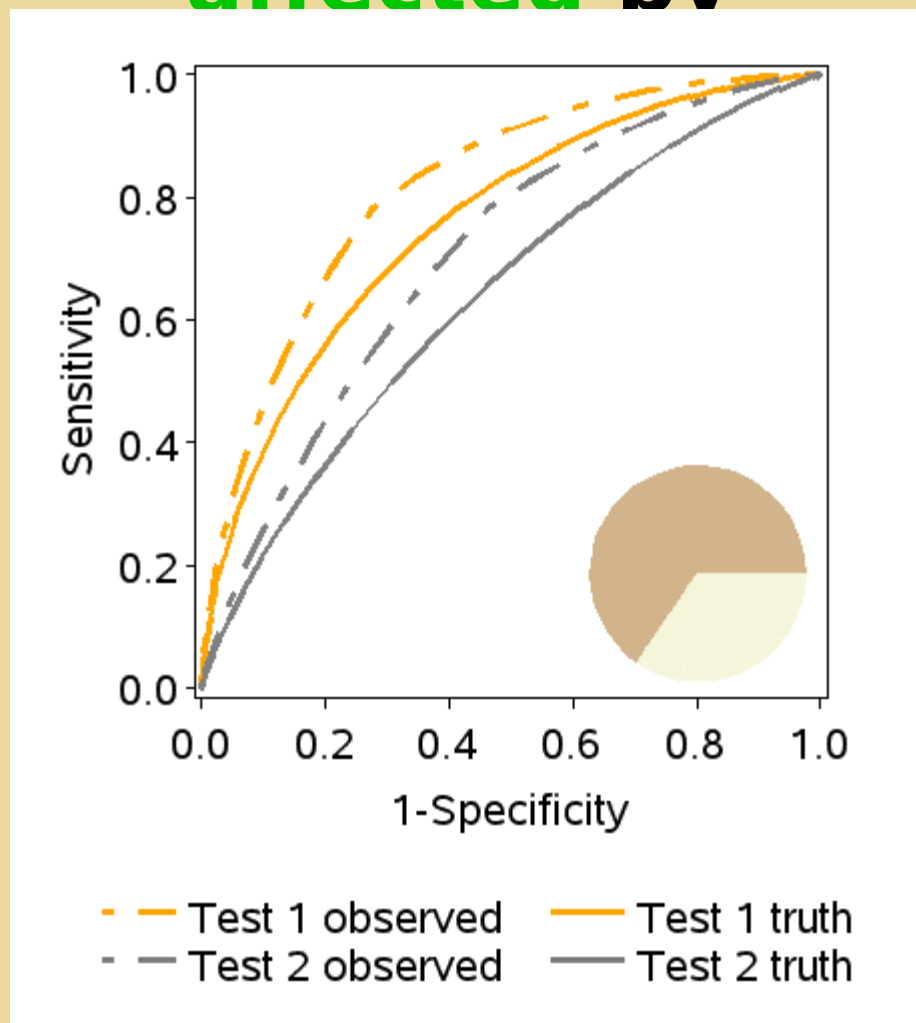
when the correlation is low

# Paired screening trial bias is high



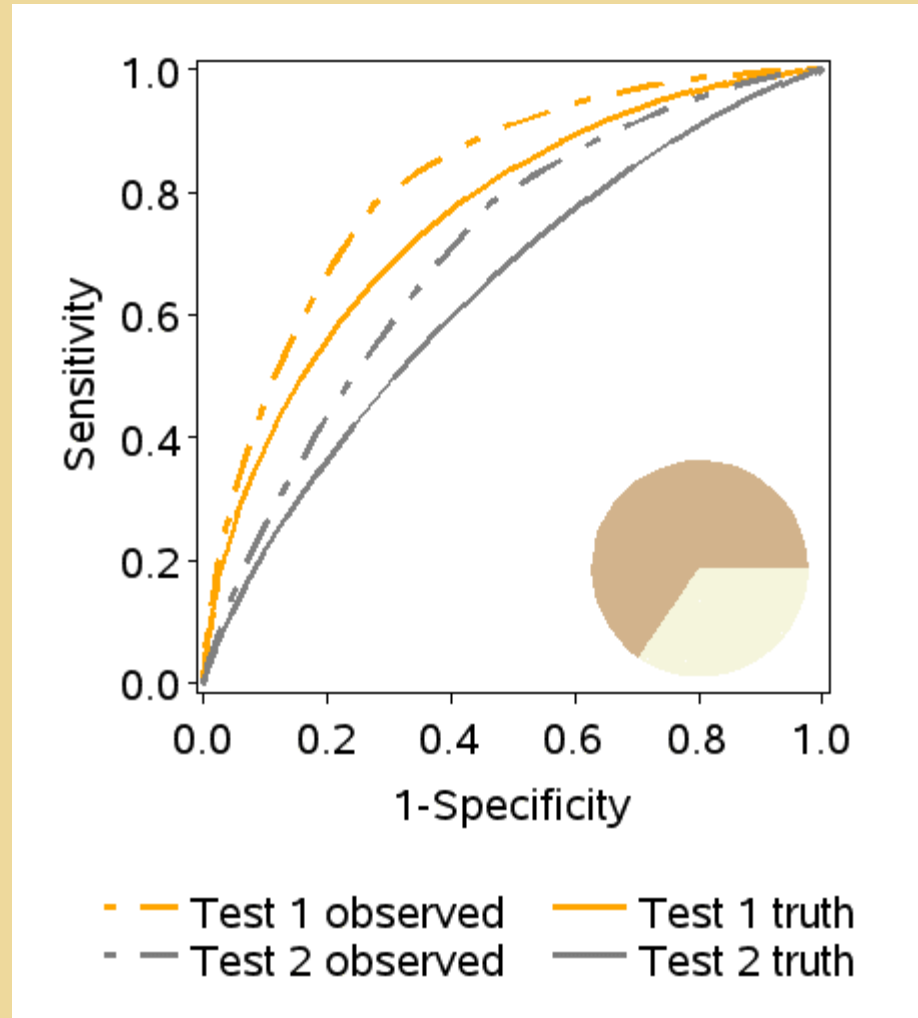
when the correlation is high

# Paired screening trial bias is strongly affected by



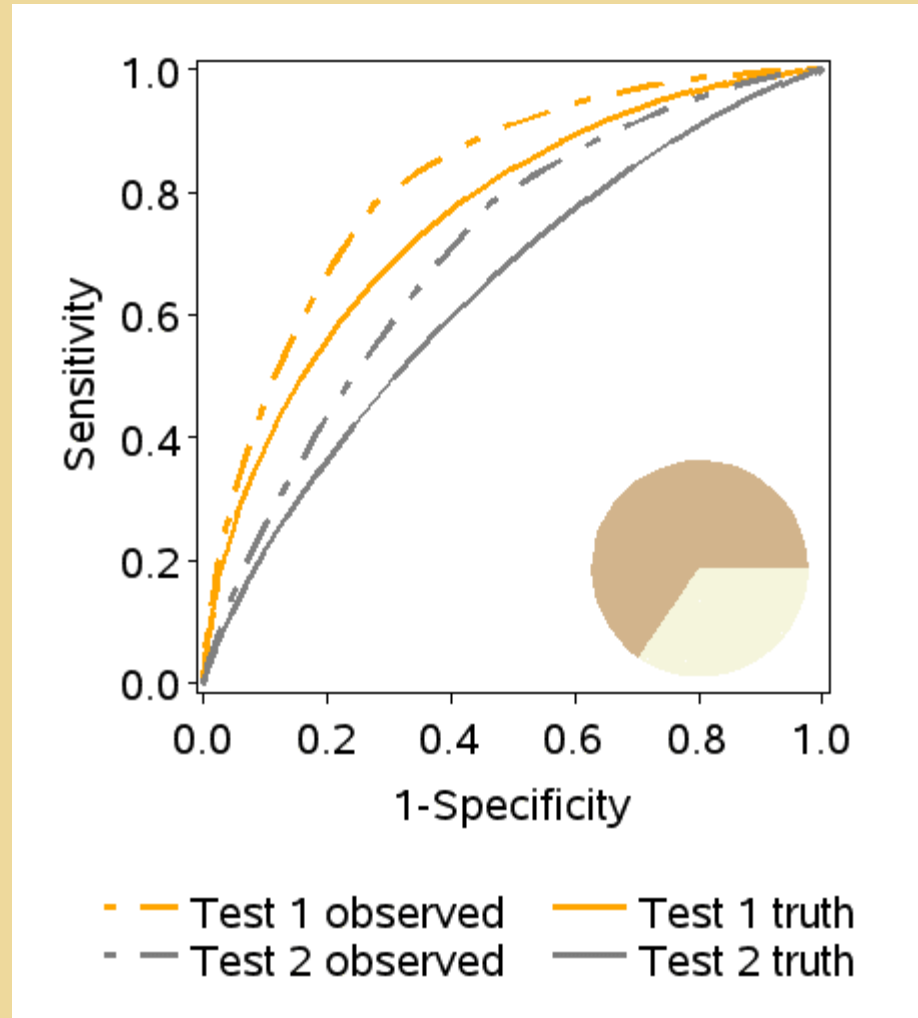
the threshold for recall for the infallible test

# Paired screening trial bias increases



as fewer cases are observed

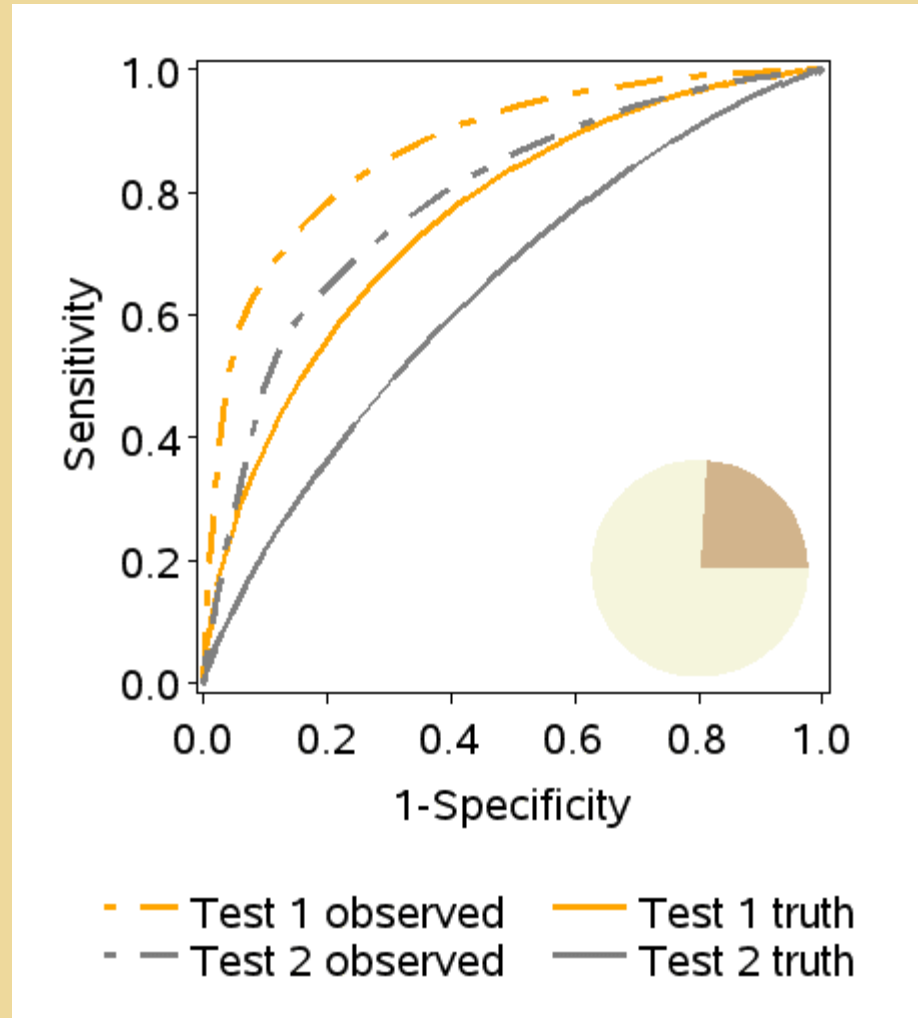
# Paired screening trial bias gets smaller



as more cases are observed



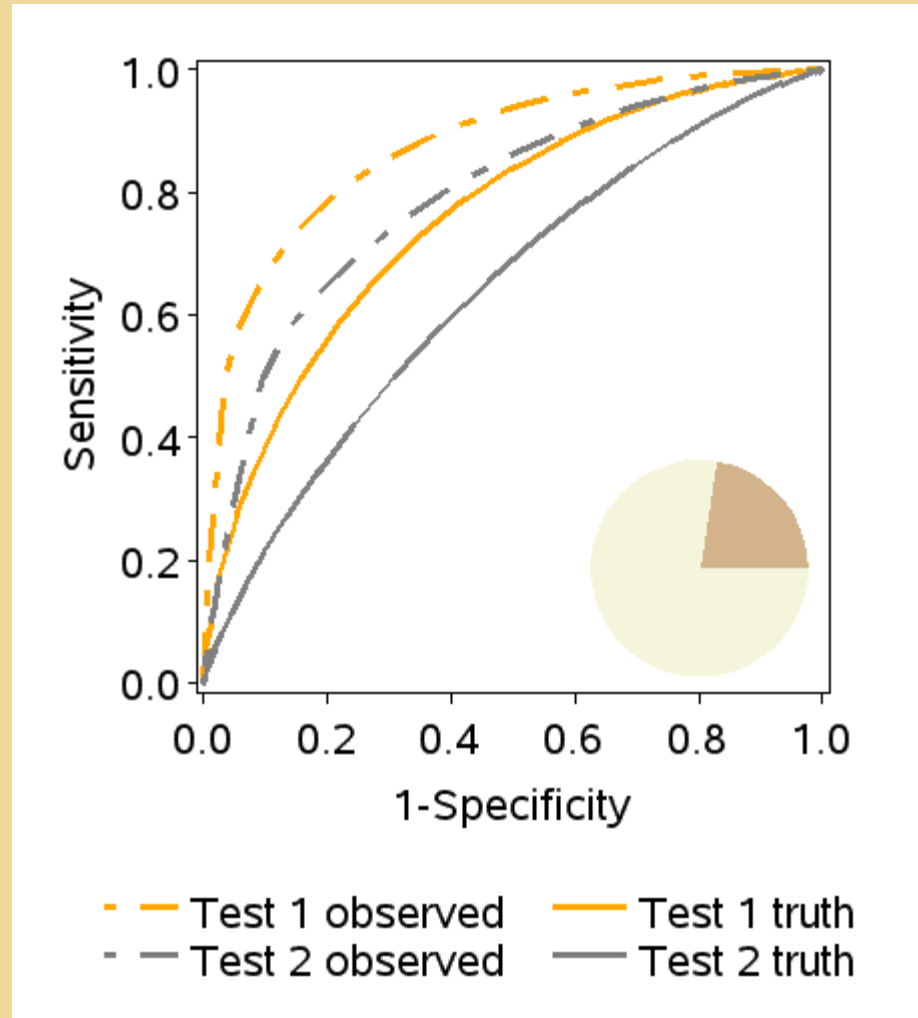
# Paired screening trial bias gets larger



as fewer cases are observed

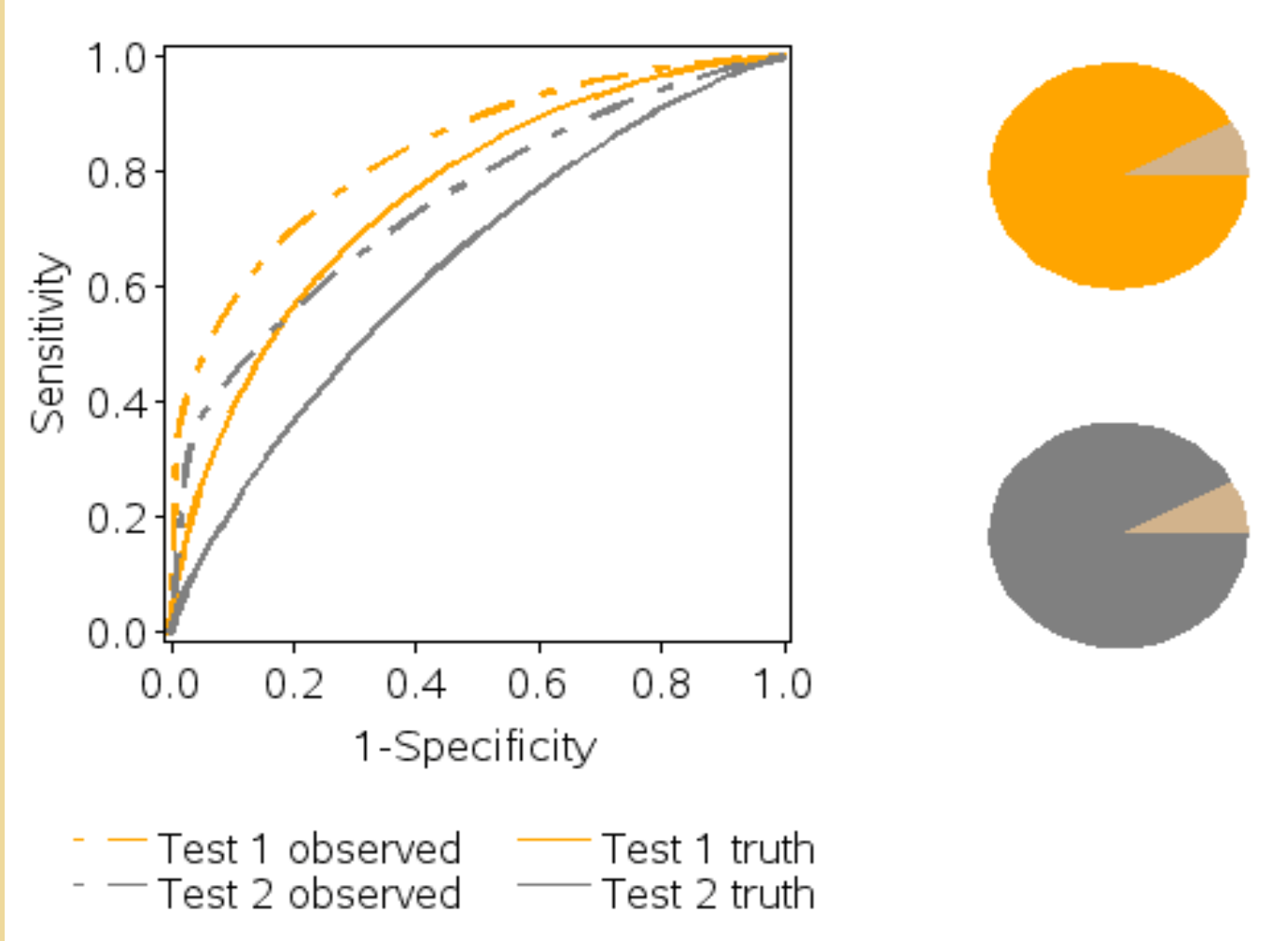
until...

# Paired screening trial bias decreases



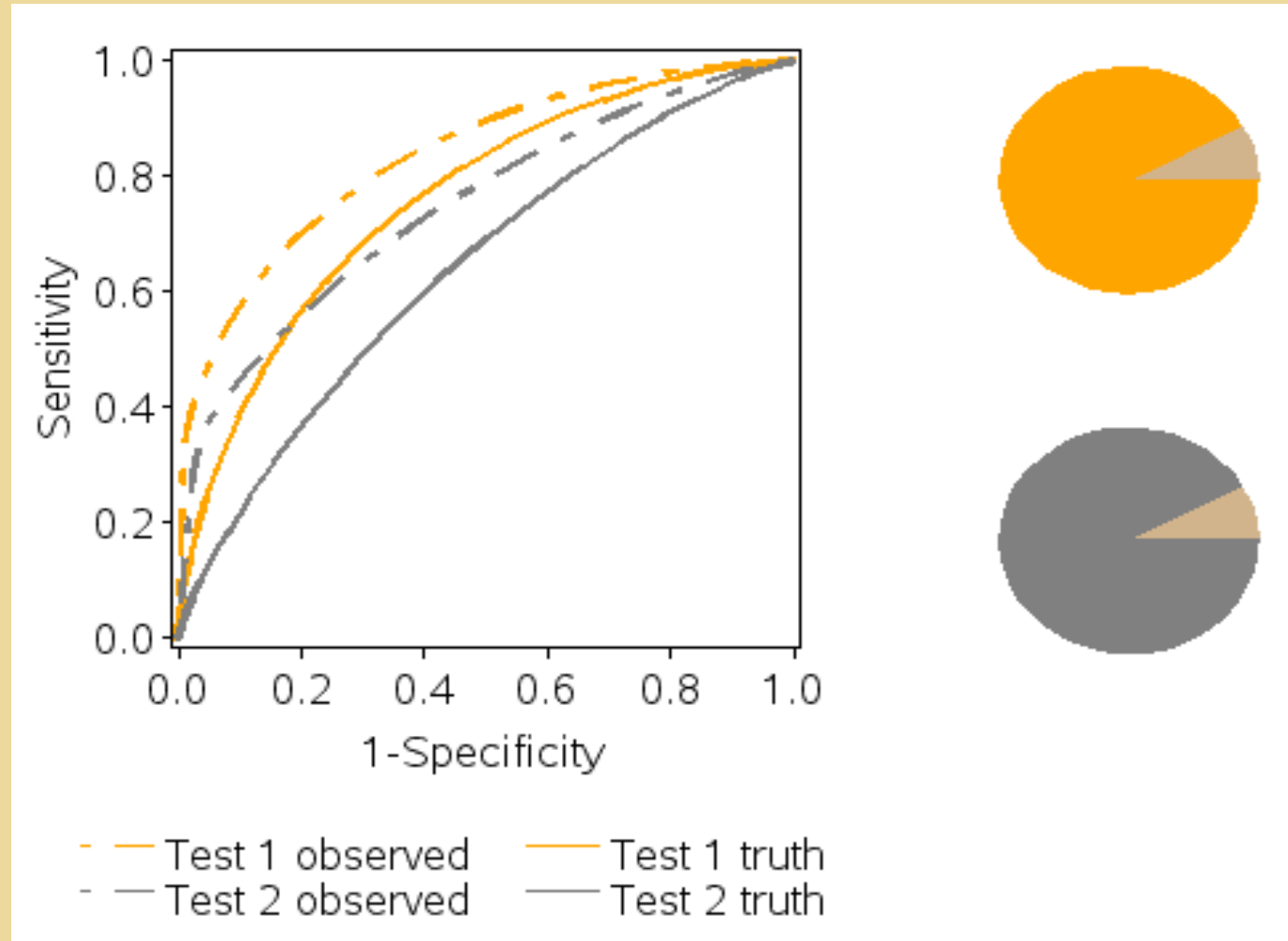
as fewer cases are found

The scientific conclusion **may change** when



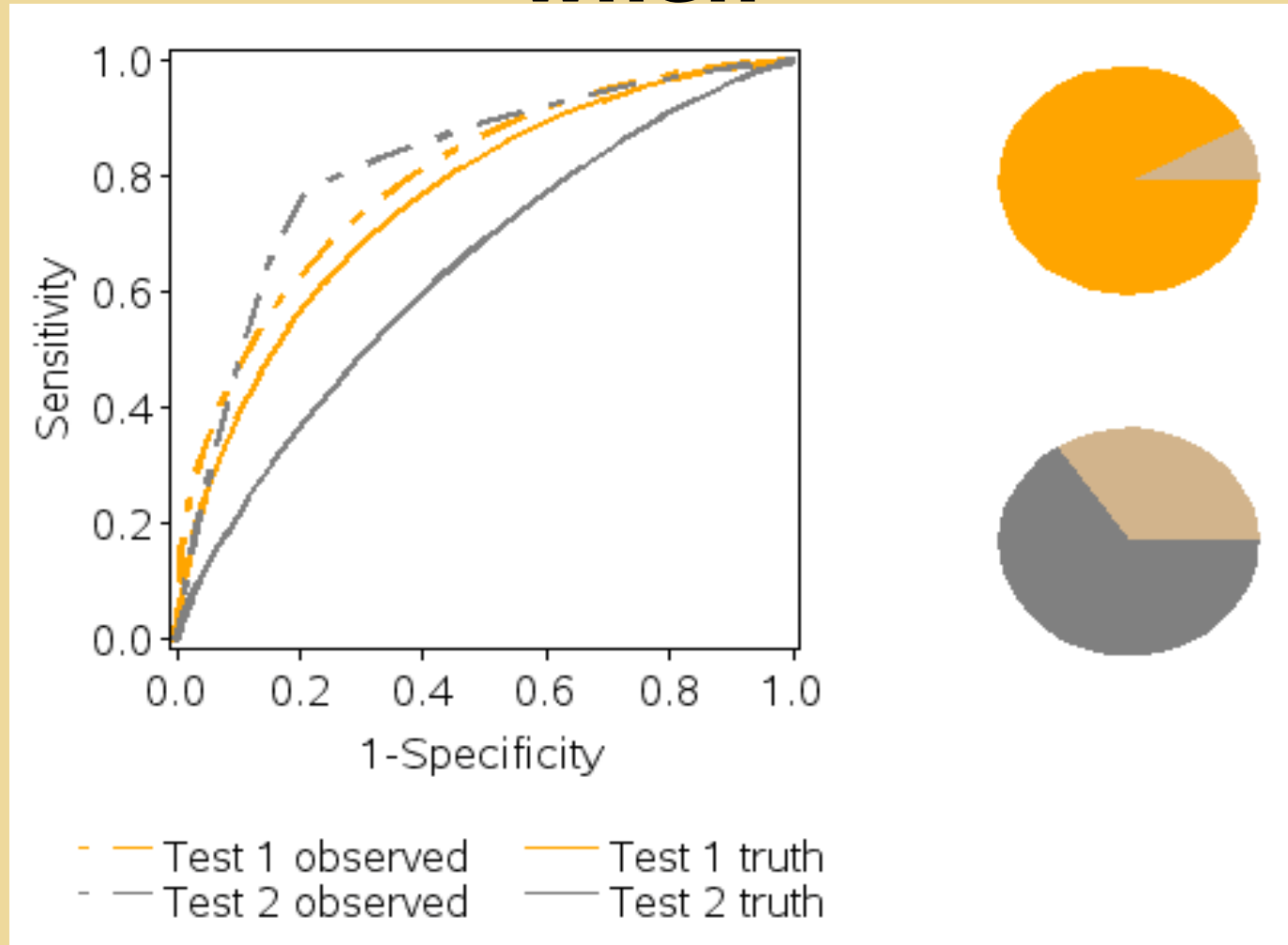
the chance of a case being recalled differs

# The scientific conclusion is **correct** when



the chance of a case being recalled is the same

# The scientific conclusion is **wrong** when



the chance of a case being recalled differs

# Conclusions: Paired screening trial bias

- **Decreases** as chance of signs and symptoms for those with disease increases
- **Increases** as correlation between screening tests increases
- Is **strongly affected** by the threshold for recall for the infallible test

# Conclusions

- **Paired screening trial bias** can lead the study designer to decide screening Test 1 is better than screening Test 2, when in fact, screening Test 2 is better than screening Test 1
- **Decisions made in paired screening trials affect the health of millions of people**
- **There is a need for mathematical bias correction**

# References

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