

*The Three-Phase Optimal Design Test  
Meets Reality:  
Lessons Available, Part One*

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# *Outline*

- ❖ Our Example Problem
- ❖ The Three-Phase Optimal Design Test
- ❖ Issues and How to Cope With Them
  - ◆ Phase I1 Test Points
  - ◆ Phase II and Phase III
  - ◆ Test Schedule and Range Availability

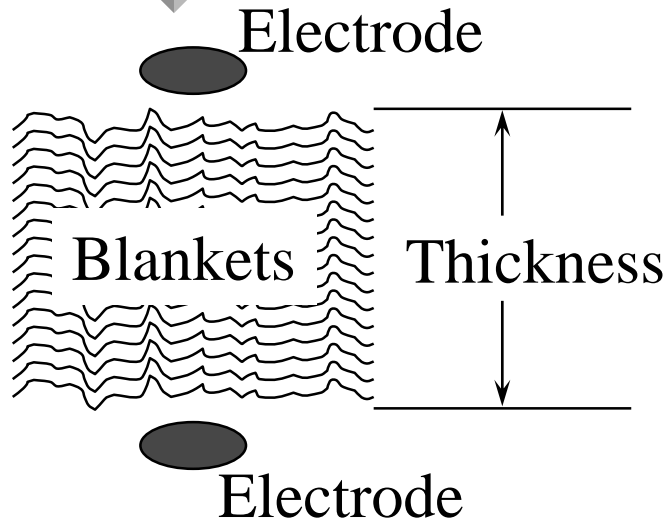


## *Our Example Problem*

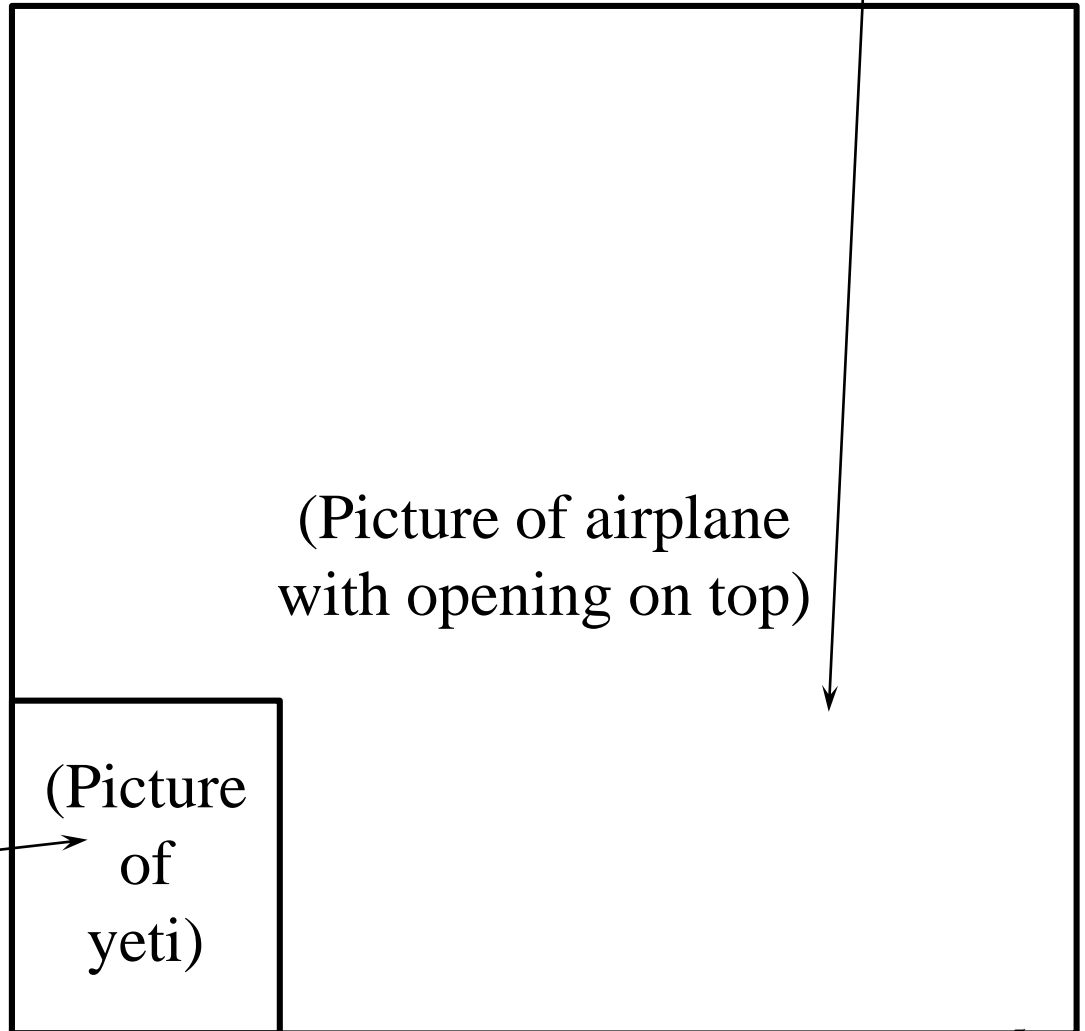
- ❖ Fictitious Weapon: Electro-Magnetic Pulse Against Thoroughly Hostile Yetis
  - ◆ Two high-voltage electrodes
  - ◆ Separated by stack of insulating blankets
  - ◆ Thicker stack → better chance of enough insulation between electrodes → better chance that charge does not bleed off slowly → better chance of electrical discharge when needed
  - ◆ Need thickness of stack required to give 99.99% chance of discharge at 95% confidence level



# *Our Example Problem (2)*



EMPATHY Aperture



Target



# *The Three-Phase Optimal Design Test*

- ❖ We have an input
  - Varies continuously – thickness of stack
- ❖ We have an output
  - One or zero – success or failure – on or off – discharge or no discharge
  - Probabilistic function of input
    - ◆ The same input can give different outputs in different tests
    - ◆ Probability of a one increases as input increases



## *The Three-Phase Optimal Design Test (2)*

### ❖ Invented by

- Jeff Wu of Georgia Institute of Technology
- Yubin Tian of Beijing Institute of Technology

### ❖ Published in the Journal of Statistical Planning and Inference, 2013

- <http://dx.doi.org/10.1016/j.jspi.2013.10.007>



## *The Three-Phase Optimal Design Test ( 3)*


- ❖ Phase I: Find the mean
  - Step I1: Obtain success and failure results
  - Step I2: Get an overlapping result
  - Step I3: Enhance the overlapping result
- ❖ Phase II: Optimize the mean and standard deviation
- ❖ Phase III (optional): Test at desired probability level to reduce uncertainty





## *The Three-Phase Optimal Design Test (4)*

- ❖ Assumes probability curve follows normal distribution
  
- ❖ Requires starting values:
  - Approximate lower and upper bounds of range
  - Approximate standard deviation of probability curve



## *Our Example Problem (3)*

### ❖ Simulations show:

- 1.6-meter stack of blankets is not enough insulation – no discharge
  - ◆ Lower end of “initial guess” interval
- 1.8-meter stack of blankets is enough insulation – discharge
  - ◆ Upper end of “initial guess” interval

### ❖ Estimated Standard Deviation

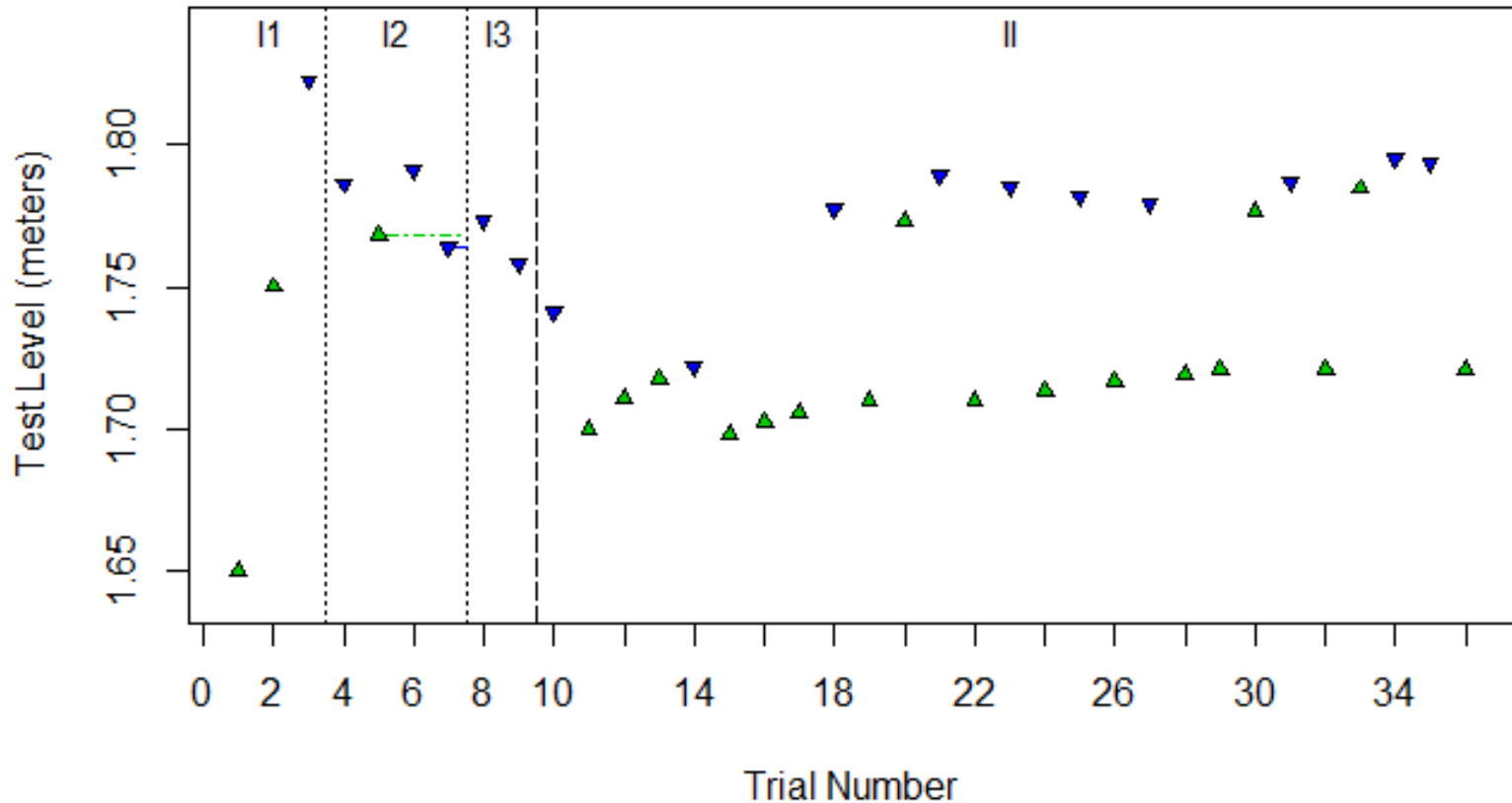
- Should be less than one sixth of range
- We use 0.015 meters



# Our Example Problem (4)

- ▼ - Discharge
- ▲ - No Discharge

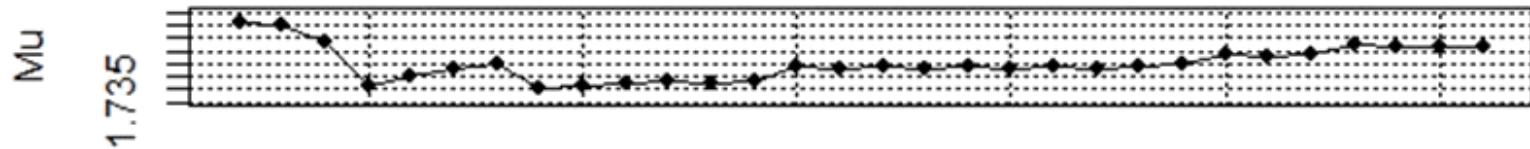
EMPATHY System Test  
 $\{\mu_{lo}, \mu_{hi}, \sigma_g | n_1, n_2, n_3 | p, res\}$   
 $\{1.6, 1.8, 0.015 | 9, 27, 0 | 0, 0\}$



# Our Example Problem (5)

EMPATHY System Test - Sequence of MLE'e

{1.6,1.8,0.015|9,27,0|0,0}



Nominal Values:

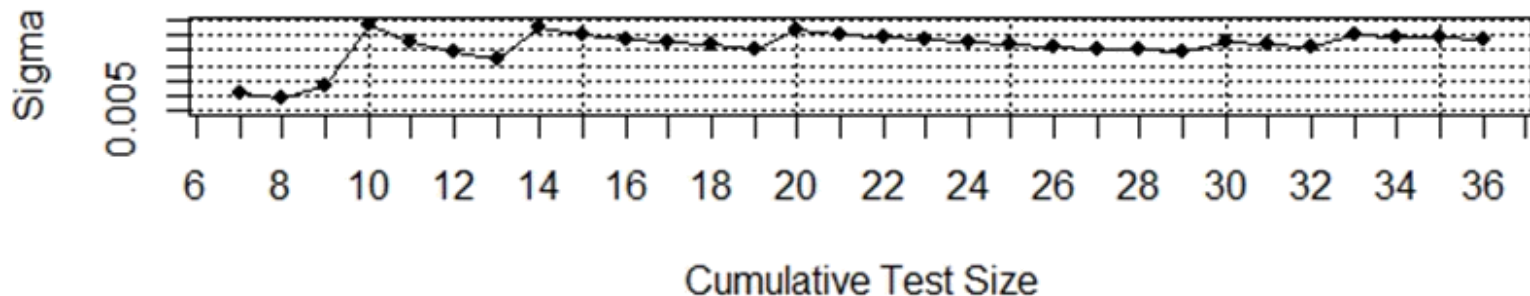
$\text{Mu} = 1.750$

$\text{Sigma} = 0.050$

Final Calculated Values:

$\text{Mu} = 1.757$

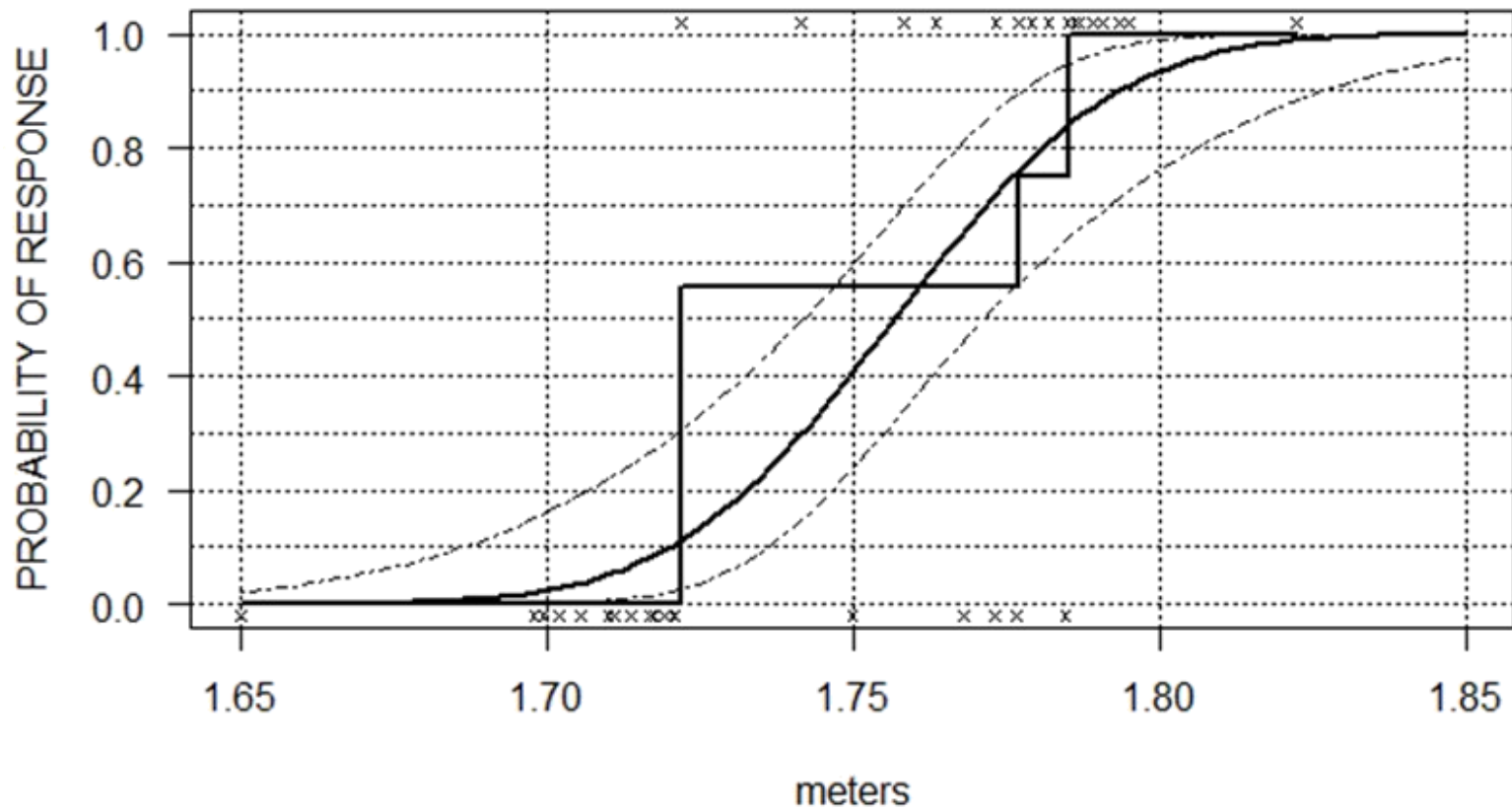
$\text{Sigma} = 0.029$



# Our Example Problem (6)

EMPATHY System Test: (Mu, Sig, n) = (1.757, 0.029, 36)

{1.6, 1.8, 0.015 | 9, 27, 0 | 0, 0}





- ❖ Phase I1 Test Point Selection
- ❖ Phase II and Phase III Test Quantity
- ❖ Test Schedule and Range Availability



## *Phase I1 Test Point Selection*

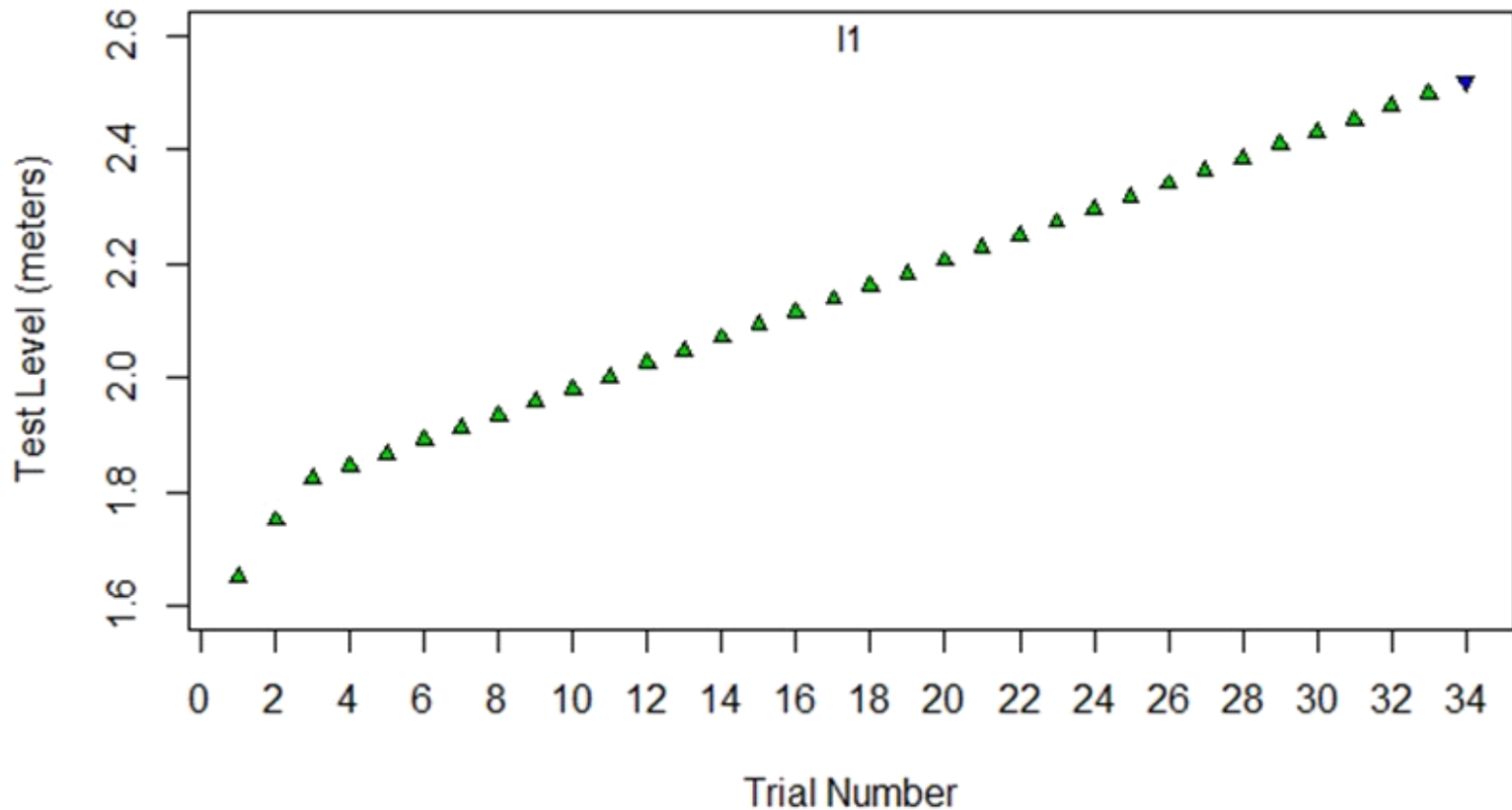
- ❖ If initial guess of test range is off
  - 3POD method moves away from initial guesses in steps of  $1.5\sigma_g$
  - Authors' Opinion:
    - ◆ Step size should increase after fourth or fifth step
    - ◆ Very off-nominal case – will not happen unless initial guesses are very wrong

The views and opinions expressed in this article are those of the authors and do not necessarily reflect the official policy or position of any agency of the Department of Defense.

# Example – Nominal Wu and Tian method

$$x_i = M_{hi} + 1.5(i - 2)\sigma_g$$

EMPATHY System Test  
 $\{\mu_{lo}, \mu_{hi}, \sigma_g | n_1, n_2, n_3 | p, res\}$   
 $\{1.6, 1.8, 0.015 | 0, 0, 0 | 0, 0\}$

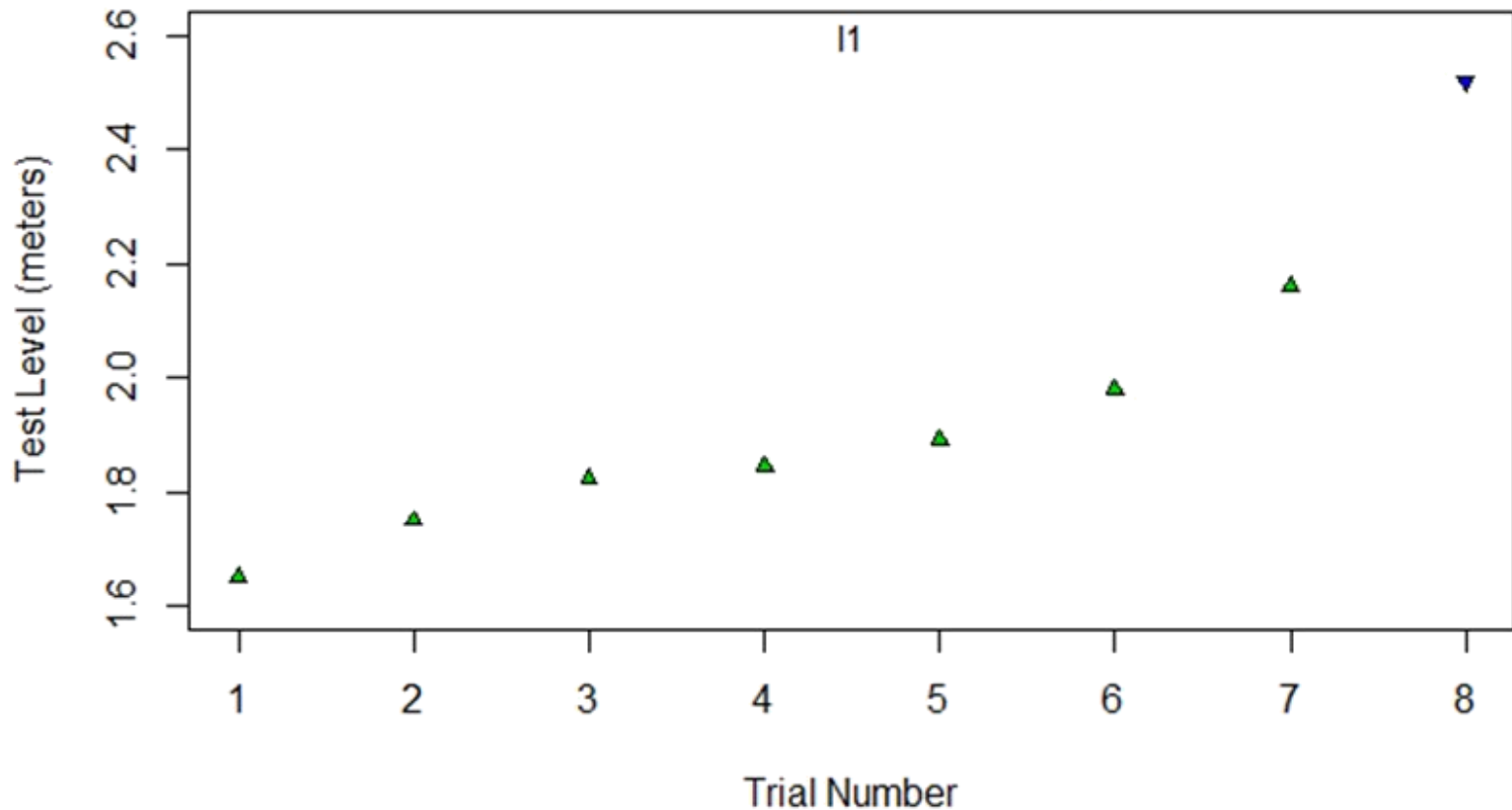




# Example – Proposed method

$$x_i = M_{hi} + 1.5 \times 2^{(i-3)} \sigma_g$$

EMPATHY System Test  
 $\{\mu_{lo}, \mu_{hi}, \sigma_g | n_1, n_2, n_3 | p, res\}$   
 $\{1.6, 1.8, 0.015 | 0, 0, 0 | 0, 0\}$






## *Phase II and Phase III*

### ❖ Phase II:

- Enhance estimate of mean value
- Estimate standard deviation
- Method: Choose test points that maximize Fisher Information Matrix determinant

### ❖ Phase III:


- Reduce uncertainty at specified probability value
- Robbins-Monro-Joseph (RMJ) Procedure: Choose test points at estimate of specified probability value



## *Phase II and Phase III (2)*

### ❖ Issue:

- Limited number of tests for Phase II and Phase III
- Extreme probability level desired
  - ◆ All tests are expected to give a discharge or all tests are expected not to give a discharge
  - ◆ Ambiguity: Are we aiming at
    - 99% level?
    - 99.9% level?
    - 99.99% level?



## *Phase II and Phase III (3)*

### ❖ Resolution

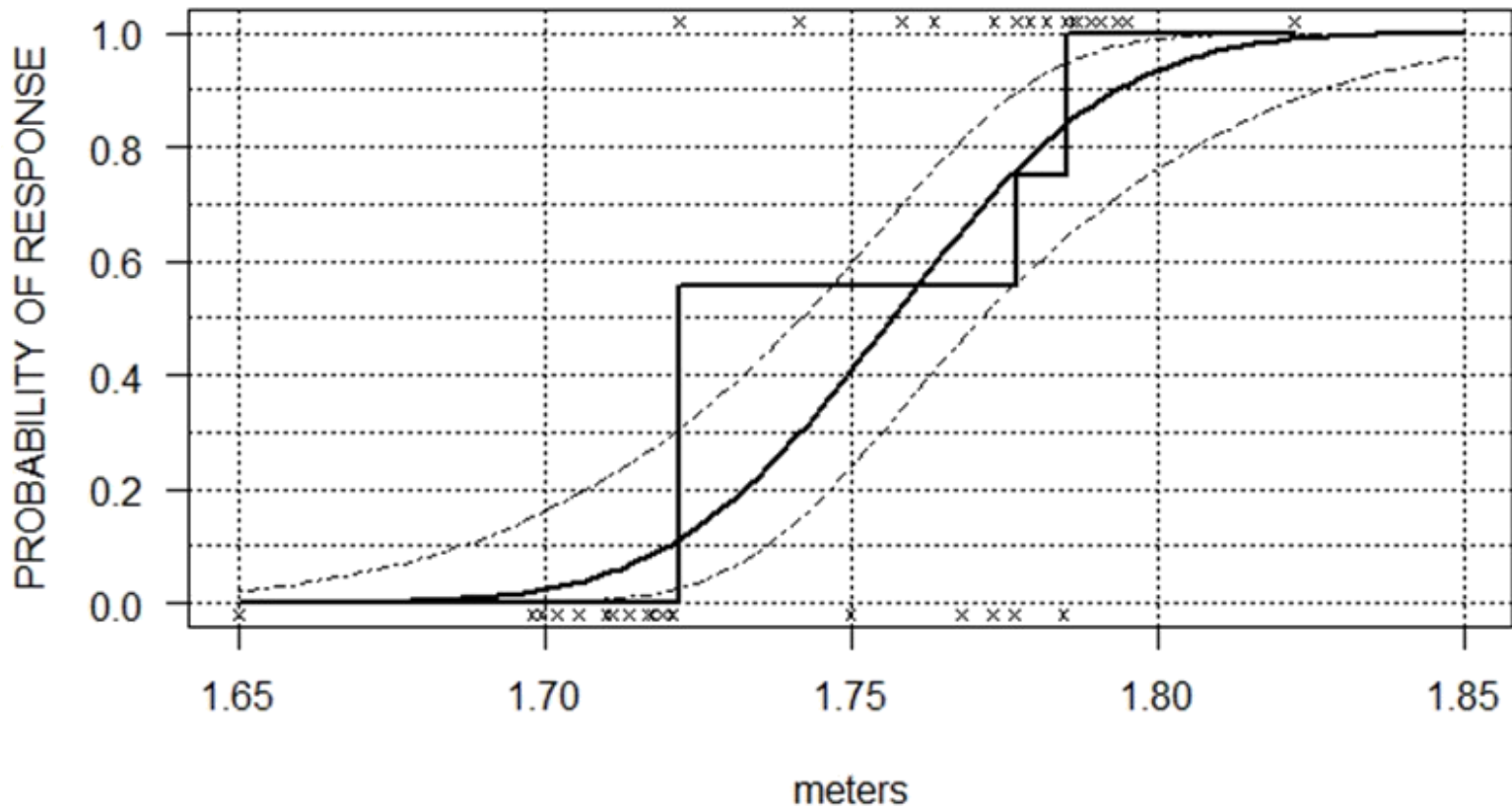
- Rule of thumb:

- ◆ If possible, select enough tests for Phase III that at least one “anomalous” result is expected
- ◆ If not possible, skip Phase III and use all tests for Phase II
  - Better definition of mean and standard deviation

# Example – Phase I/II – 36, Phase III – 0

EMPATHY System Test: (Mu, Sig, n) = (1.757, 0.029, 36)

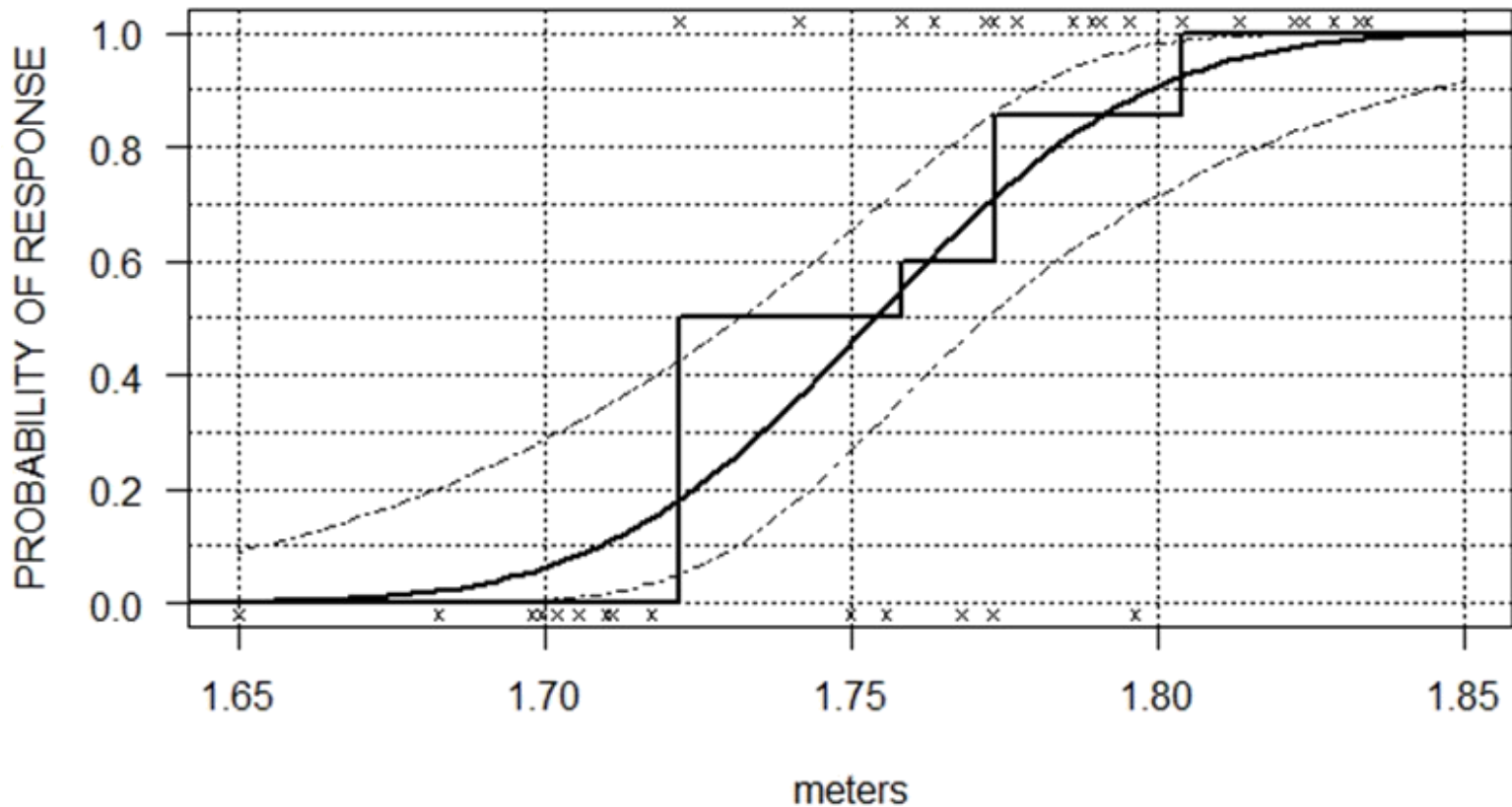
{1.6, 1.8, 0.015 | 9, 27, 0 | 0, 0}



# Example – Phase I/II – 20, Phase III – 16 / 0.9

EMPATHY System Test: (Mu, Sig, n) = (1.754, 0.035, 36)

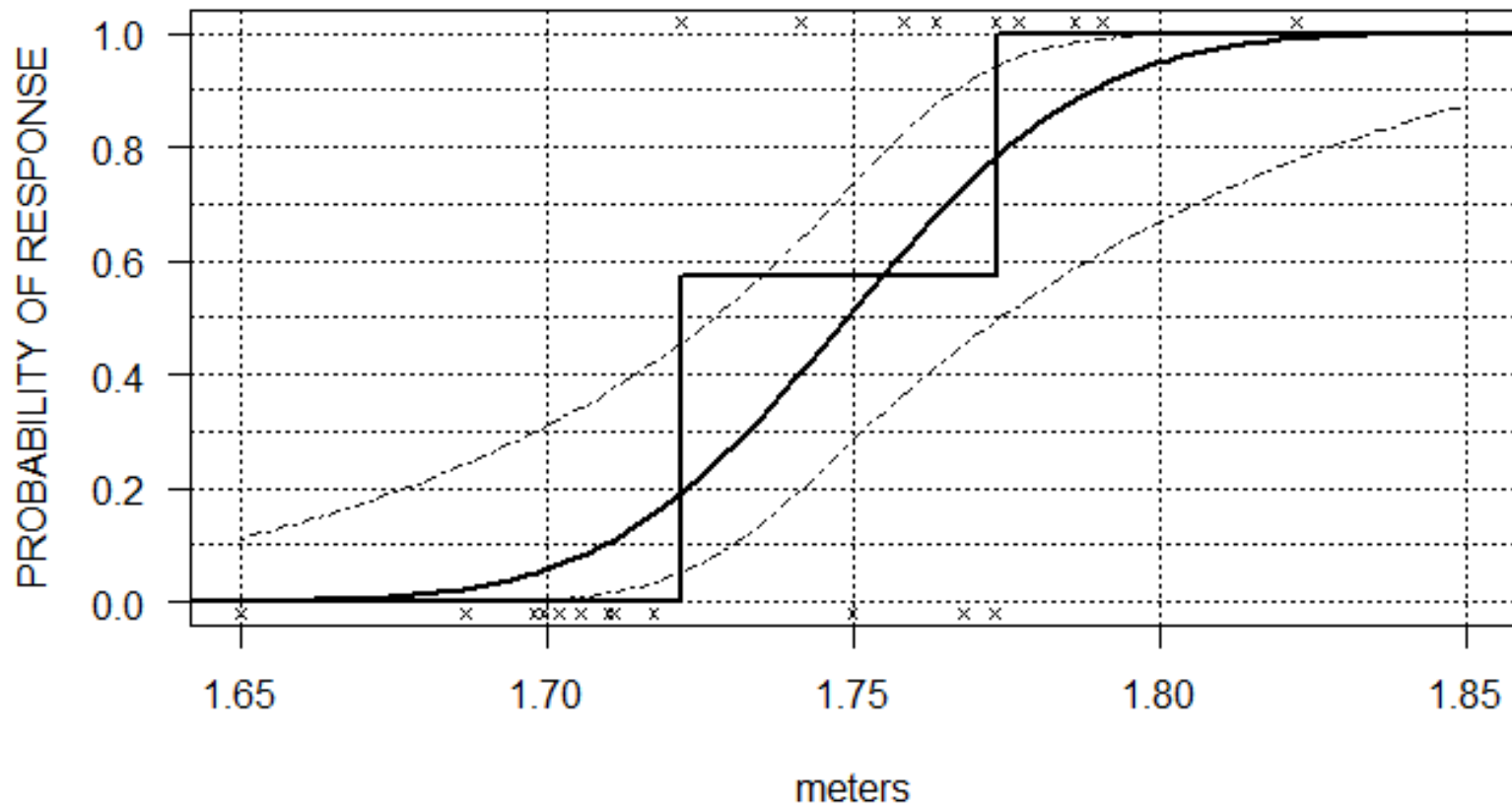
{1.6,1.8,0.015|9,11,16|.9,0}



# Example – Phase I/II – 20, Phase III – 16 / 0.9999

EMPATHY System Test: ( $\mu$ ,  $\sigma$ ,  $n$ ) = (1.749, 0.031, 36)

{1.6, 1.8, 0.015 | 9, 11, 16 | .9999, 0}





# *Testing Schedule and Test Range Availability*

## ❖ Issues:

- Test range time is expensive
  - ◆ Much more expensive than test items
- Program schedule is paramount
  - ◆ Making a single test item takes significant time
  - ◆ Can create multiple test items in parallel





## *Testing Schedule and Range Availability (2)*

### ❖ Resolution: Phase I

- Moderate speedup needed
  - ◆ Two tests per day
    - ◆ Case 1: 3POD specifies two tests at once
      - Create two test items
    - ◆ Case 2: 3POD specifies one test at a time
      - Create three test items:
        - Item for next test
        - Item for test after next if next test gives One
        - Item for test after next if next test gives Zero
      - Double testing speed, waste one test item in three



## *Testing Schedule and Range Availability (3)*

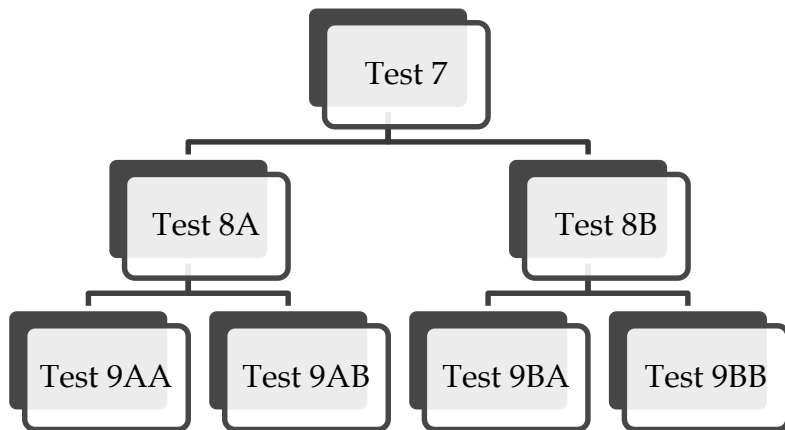
### ❖ Resolution: Phase I (2)

- Larger speedup needed
  - ◆ Three tests per day
  - ◆ Create seven test items:
    - Item for next test
    - Item for test after next if next test gives One
    - Item for test after next if next test gives Zero
      - One/Zero results may give same test point
    - Items for third test given One/One, One/Zero, Zero/One, Zero/Zero results
  - ◆ Triple testing speed, waste half the test items

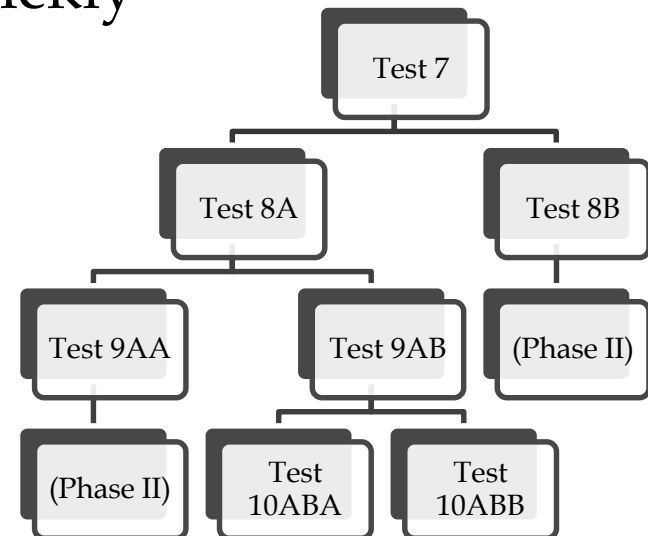
# Testing Schedule and Range Availability (4)

## ❖ Resolution: Phase I (3)

- Larger speedup case
  - ◆ Can predict test points tree to uneven depth
  - ◆ Finish Phase I more quickly



VS





## *Testing Schedule and Range Availability (5)*

### ❖ Resolution: Phase II


- Predict up to six tests in advance using 3POD method
  - ◆ Assume likelier outcome happens each time
- Create test items at each test point and test simultaneously
- Why it works:
  - ◆ Phase II places test points near “ $\mu \pm 1.2 \sigma$ ”
  - ◆ “ $\mu$ ” and “ $\sigma$ ” do not change quickly in Phase II



## *Testing Schedule and Range Availability (6)*

### ❖ Resolution: Phase III

- Predict up to six tests in advance using 3POD method
  - ◆ Assume likelier outcome happens each time
- Create test items at each test point and test simultaneously
- Why it works:
  - ◆ Phase III test points determined by “ $\mu + k \sigma$ ”
  - ◆ “ $\mu + k \sigma$ ” does not change quickly in Phase III

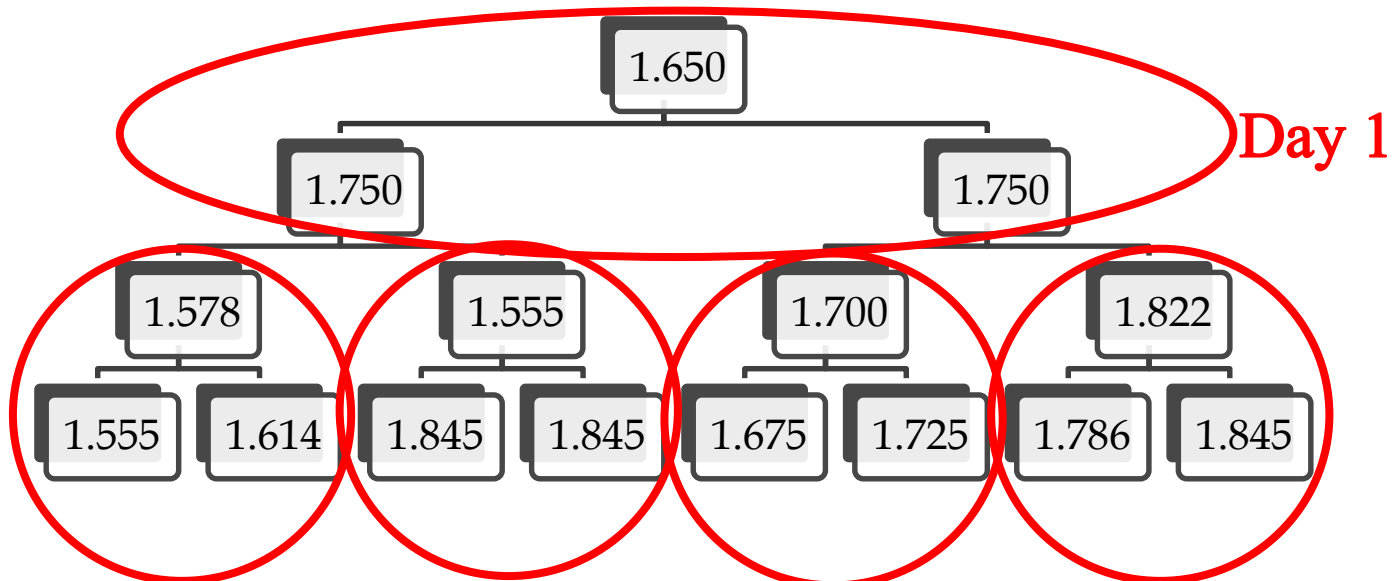
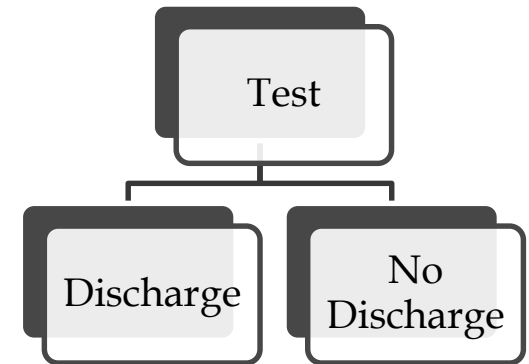


## *Our Example Problem (7)*

### ❖ EMPATHY system:

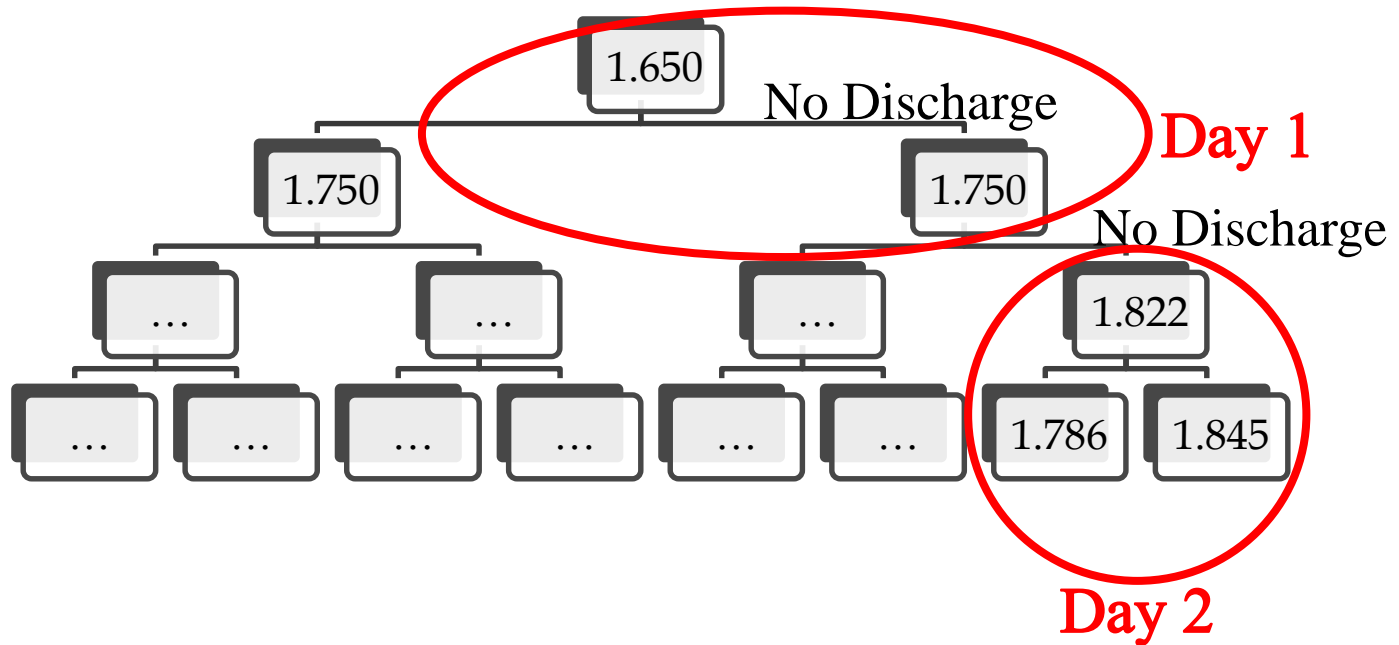
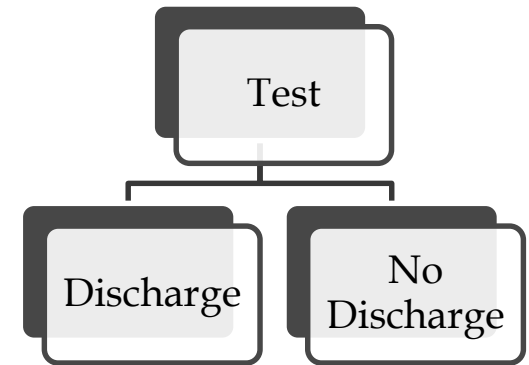
- Blankets settle overnight to final thickness
- Required 16-hour interval between making test article and performing test
- One can remove blankets from unused test articles and create new test articles from the electrodes

*Example: Start of Day 1*

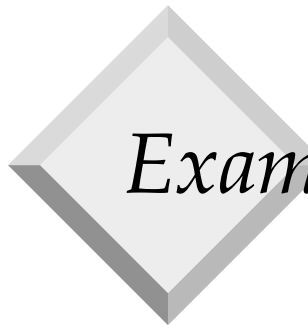


**Day 2 is one of these—figure out which one at the end of Day 1 testing**

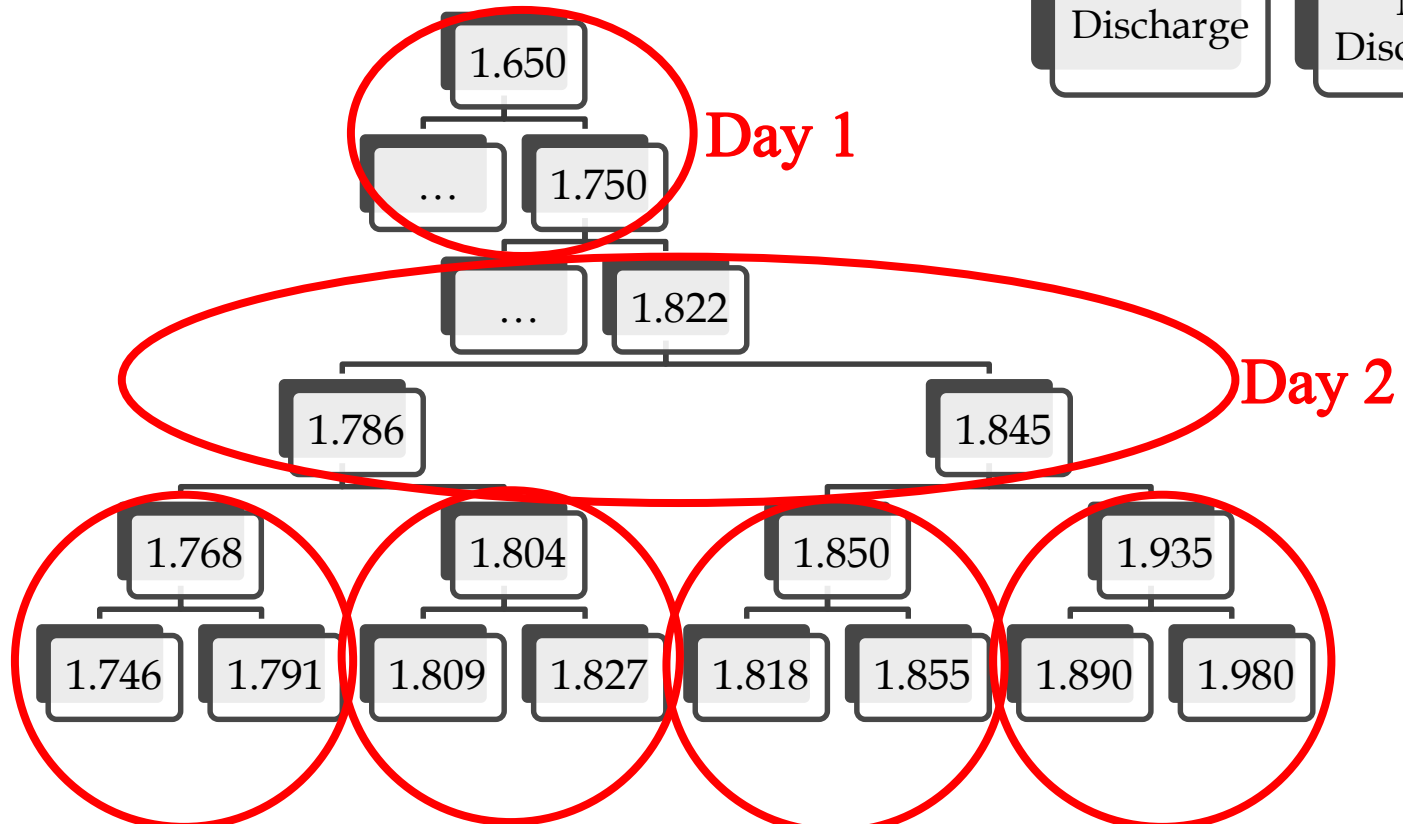
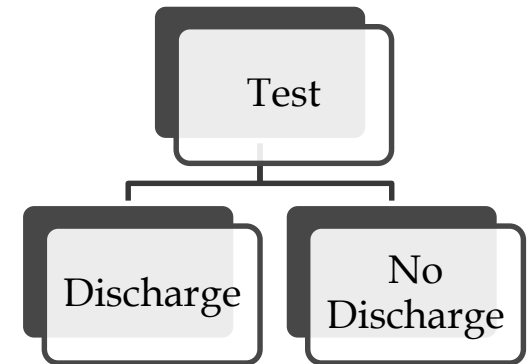
*Example: End of Day 1*





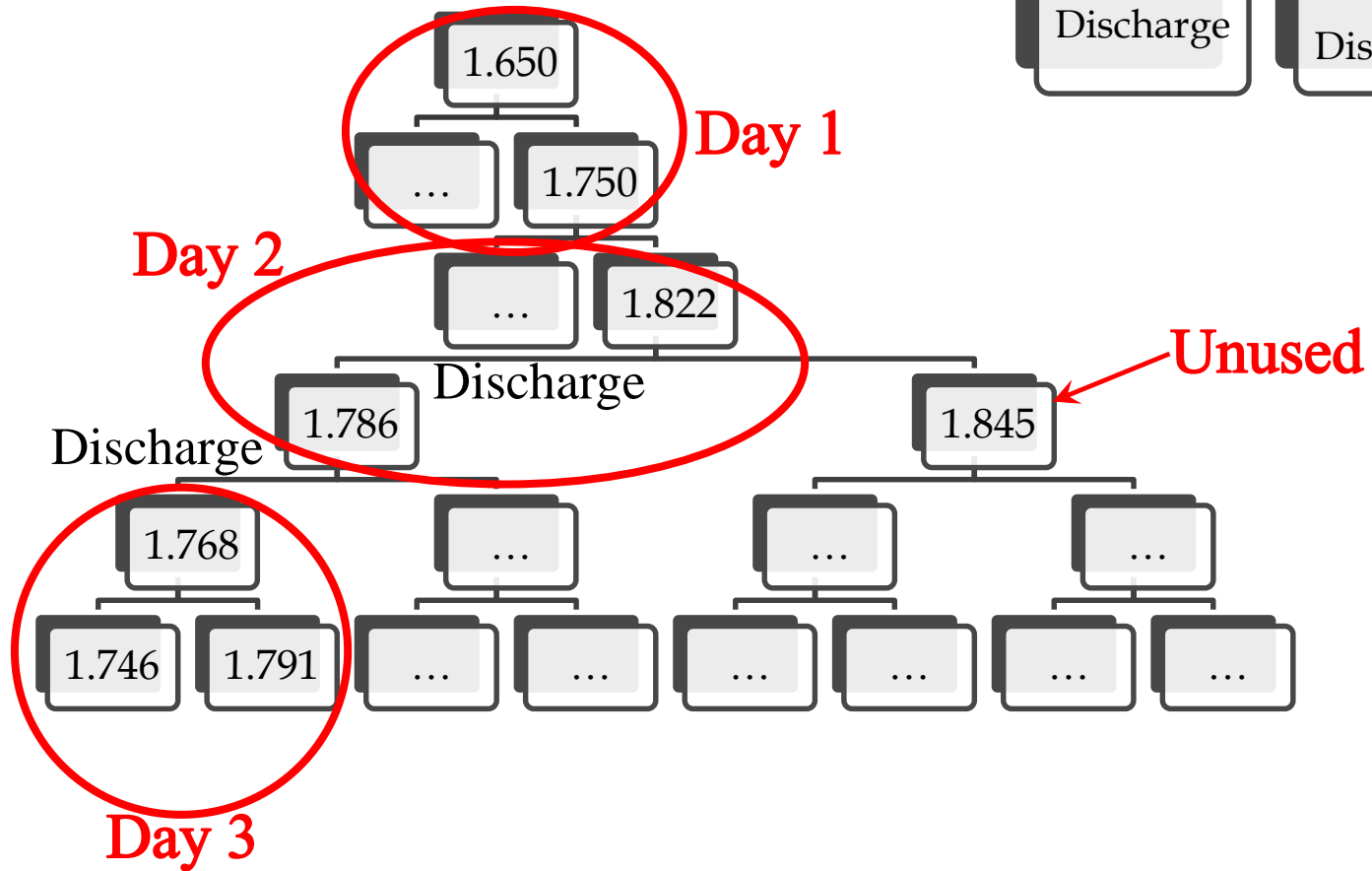
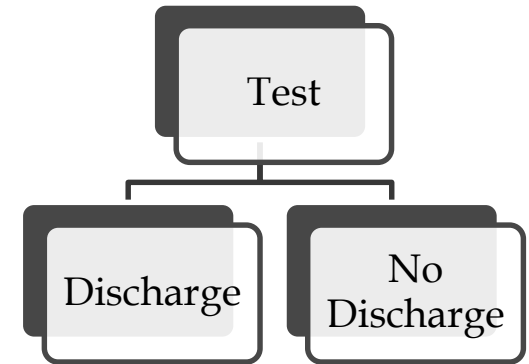


# Example: Start of Day 2



Day 3 is one of these—figure out which one at the end of Day 2 testing

# Example: End of Day 2

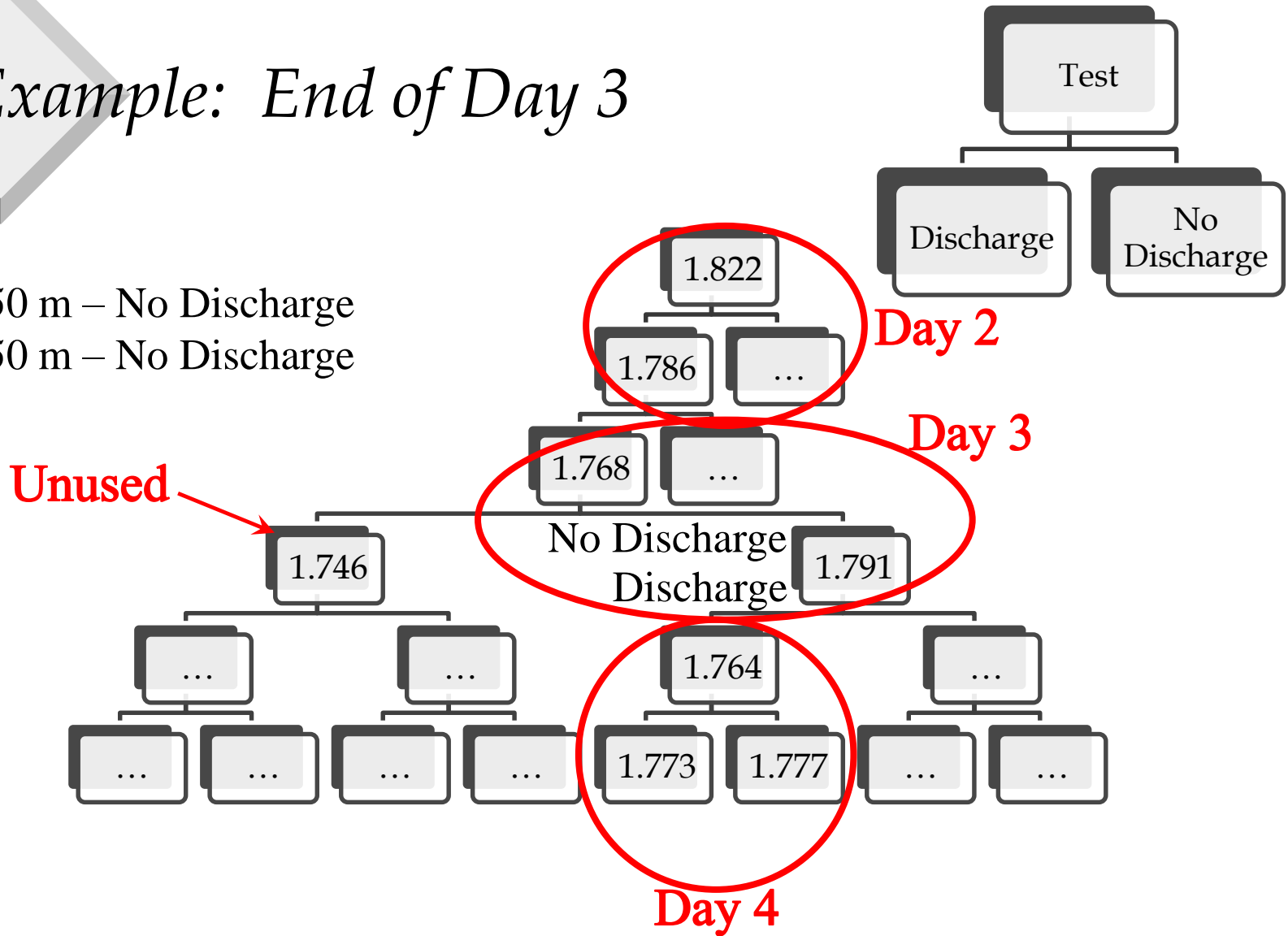


# Example: End of Day 3

Day 1:

1.650 m – No Discharge

1.750 m – No Discharge





*Example: End of Day 4*

❖ Test Day 4:

- Test 7:  $T = 1.76362 \text{ m} \rightarrow$  Discharge
- Test 8:  $T = 1.77337 \text{ m} \rightarrow$  Discharge

❖ Test Points for Day 5:

- Test 9:  $T = 1.75837 \text{ m}$
- Test 10:

- ◆ If Test 9 is Discharge:  $T = 1.74150 \text{ m}$
- ◆ If Test 9 is No Discharge:  $T = 1.77515 \text{ m}$

Phase I3

Phase II



*Example: End of Day 5*

❖ Test Day 5:

- Test 9:  $T = 1.75837$  m  $\rightarrow$  Discharge } Phase I3
- Test 10:  $T = 1.77337$  m  $\rightarrow$  Discharge } Phase II

❖ Test Points for Day 6:

- $T = 1.74150$  m,  $1.74510$  m,  $1.77368$  m,  
 $1.74853$  m,  $1.77119$  m,  $1.75080$  m
- If test schedule is not pressing, make only first four test items
  - ◆ Synchronizes test days with multiples of six tests



## *Conclusions*

- ❖ 3POD method can be successfully applied to a “real-world” situation
  
- ❖ “Lessons Learned?”
  - Lessons are available
  - Learning them is everybody’s job