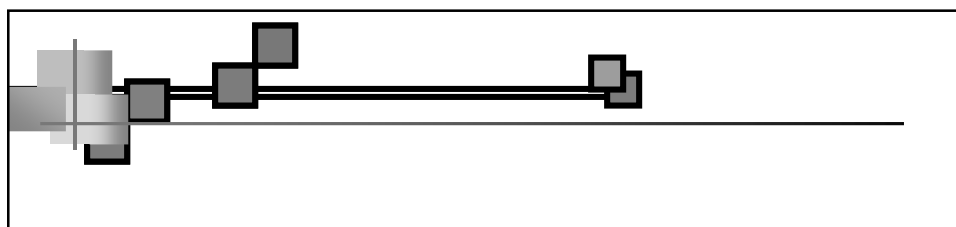


**TAGUCHI METHOD
for
DYNAMIC PROBLEMS**

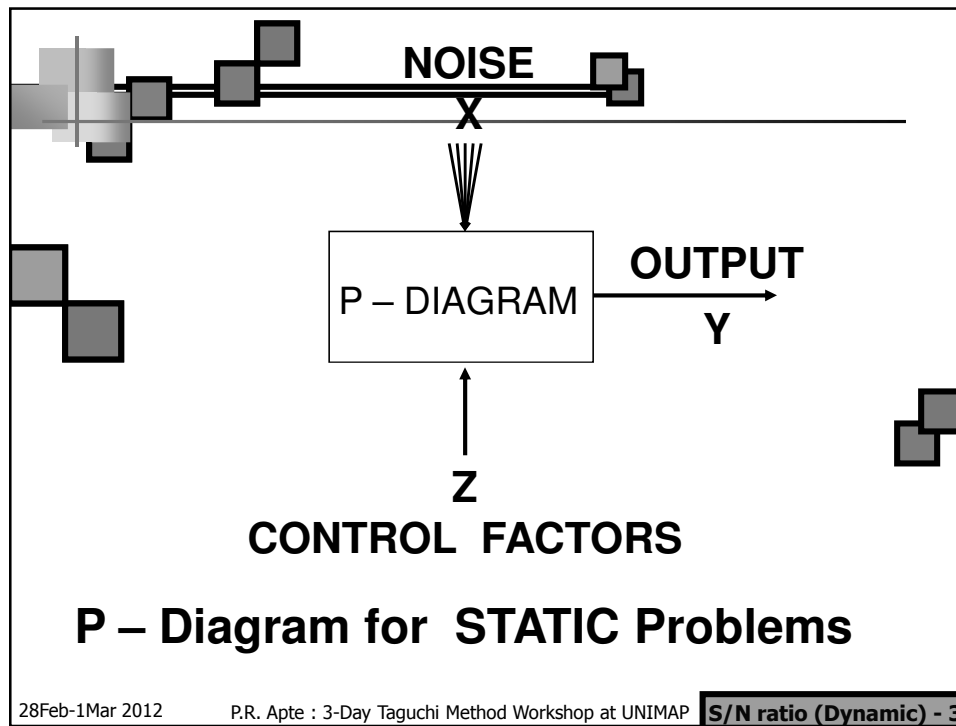
— ■ ■ ■ —

**Dr. P. R. Apte
IIT Bombay**



SIGNAL - TO - NOISE RATIO

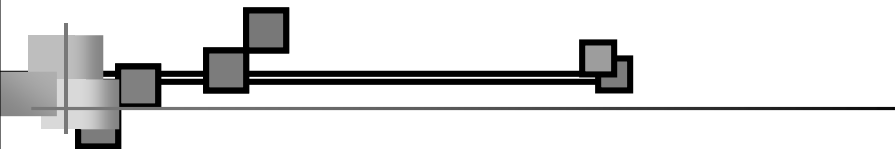
28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 2**



QUADRATIC LOSS FUNCTION

- $Q = K' [(\mu - \mu_0)^2 + \sigma^2]$
- Quadratic Loss Function
 - Ideal measure for quality of products as it is shipped by the supplier to the customer
- Minimizing Quadratic Loss Function
 - leads to quality improvement
- Signal-to-Noise ratios are
Log form of Quadratic Loss Function

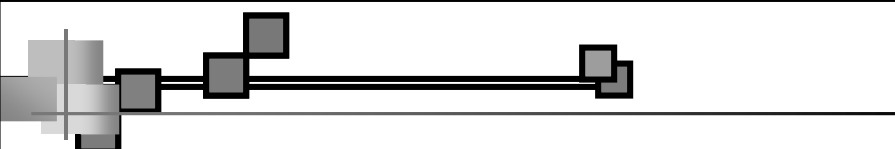
28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 4**



QUALITY LOSS AFTER ADJUSTMENT

- First Variance is reduced → (" σ^2 term" in 'Q')
- Then Mean is brought on Target without disturbing the Variance (σ^2) by a Scaling Factor
- Hence the correct Quality Loss measure is Q_a
 $Q_a = K \sigma^2$ for ($\mu = \mu_0$) and NOT
 $Q = K [(\mu - \mu_0)^2 + \sigma^2]$
- Hence always use Q_a
 and not Q for any estimation of quality

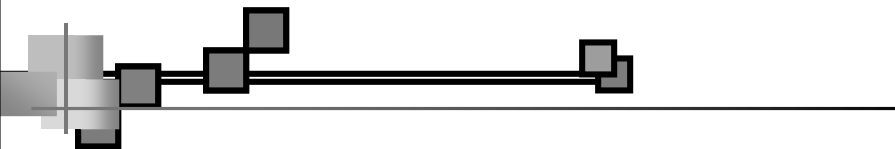
28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 5**



RELATIONSHIP BETWEEN S/N RATIO AND Q_a

- $Q = K' [(\mu - \mu_0)^2 + \sigma^2]$
- If mean is μ and is to be 'adjusted' to μ_0 ,
 - Adjust Thickness to ' μ_0 / μ ' times the earlier values
- $Q_a = K' [(\mu \cdot \{\mu_0 / \mu\} - \mu_0)^2 + (\sigma \cdot \{\mu_0 / \mu\})^2]$
- $Q_a = K' [(\mu_0 - \mu_0)^2 + (\sigma \cdot \{\mu_0 / \mu\})^2]$
- $Q_a = K' [(\sigma \cdot \{\mu_0 / \mu\})^2]$

28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 6**

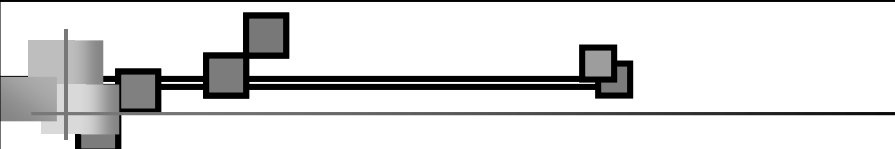


RELATIONSHIP BETWEEN S/N RATIO AND Q_a

- $Q_a = K' [(\sigma \cdot \{\mu_0 / \mu\})^2]$
- $Q_a = K' \cdot \{\mu_0\}^2 [(\sigma / \mu)^2]$
- $Q_a = K (\sigma / \mu)^2$
 - where K , new constant = $K' \cdot \{\mu_0\}^2$
- Q_a minimizing is equivalent to maximizing $\{1/Q_a\}$
- S/N Ratio, $\eta = \text{Log Form of } \{1/Q_a\}$

$$Q_{a'} = \eta = 10 \text{ Log}_{10} [\mu^2 / \sigma^2]$$


28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 7**



TAGUCHI'S TWO-STEP PROCEDURE

- What you need to do?
 1. Maximize $\eta = 10 \text{ Log}_{10} [\mu^2 / \sigma^2]$
 2. Adjust Mean on Target without disturbing the Variance by a Scaling Factor (eg. deposition time)
- Any target can be adjusted without having to re-optimize
 - Unconstrained optimization
 - Development of sub-systems to take place in parallel
 - R & D time reduced

28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 8**

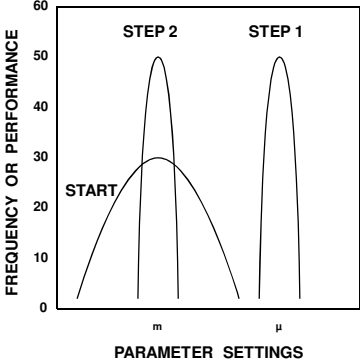


ROBUST DESIGN METHODOLOGY

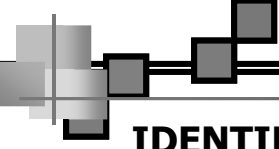
2 - STEP OPTIMIZATION

STEP 1 :
REDUCE VARIATION IRRESPECTIVE OF TARGET VALUE

STEP 2 :
ADJUST PERFORMANCE ON TARGET LEAVING VARIATION UNDISTURBED



28Feb-1Mar 2012
P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP
S/N Ratio (dynamic) 9




IDENTIFICATION OF SCALING FACTOR

- DOES EVERY CONTROL FACTOR HAVE EFFECT ON ' η ' AND ' μ ' ?
- FACTORS THAT HAVE SIGNIFICANT EFFECT ON ' η ' ---> MAXIMIZE ' η '
- FACTORS THAT HAVE SIGNIFICANT EFFECT ON ' μ ' BUT NO EFFECT ON ' η '

---> **SCALING FACTOR**
- FACTORS THAT NEITHER EFFECT ' η ' NOR ' μ '

---> NEUTRAL FACTORS
(OPERATIONAL EASE, COST ETC.)


28Feb-1Mar 2012
P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP
S/N ratio (Dynamic) - 10



S/N RATIOS FOR STATIC PROBLEMS

- **TYPES OF STATIC PROBLEMS**
 - SMALLER - THE - BETTER TYPE
 - NOMINAL - THE - BEST TYPE
 - LARGER - THE - BETTER TYPE
- **MORE TYPES**
 - SIGNED - TARGET TYPE
 - FRACTION DEFECTIVE TYPE
 - ORDERED CATEGORIES TYPE
 - CURVE OR VECTOR RESPONSE TYPE

28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 11**




KEY ACTIVITY OF ROBUST DESIGN

IS TO :

- **DETERMINE CORRECT S/N RATIO SO AS TO ACHIEVE ADDITIVITY**
- **DETERMINE PROPER ADJUSTMENT FACTORS TO BRING MEAN ON TARGET WITHOUT DISTURBING VARIANCE**

28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 12**




SMALLER - THE - BETTER TYPE PROBLEM

- QUALITY CHARACTERISTICS 0 TO ∞
(CONTINUOUS AND NON-NEGATIVE)
- '0' MOST DESIRED
- NO SCALING OR ADJUSTMENT FACTOR AS TARGET IS ALWAYS ZERO
- VARIANCE TENDS TO ZERO AS MEAN TENDS TO ZERO
- MINIMIZE QUALITY LOSS WITHOUT ADJUSTMENT
- OR MAXIMIZE

$$\eta = -10 \text{ Log}_{10} \left[\frac{1}{n} \sum (Y_1^2 + Y_2^2 + \dots + Y_n^2) \right]$$

28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 13**

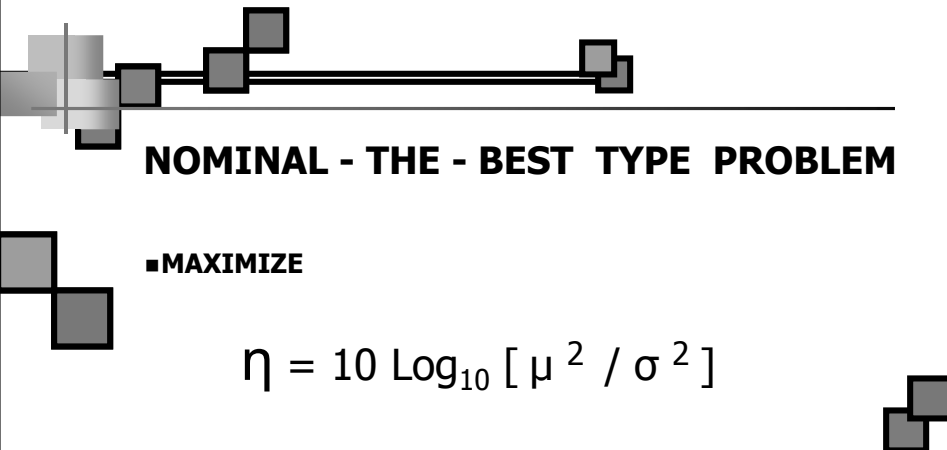


NOMINAL - THE - BEST TYPE PROBLEM

- QUALITY CHARACTERISTICS 0 TO ∞
(CONTINUOUS AND NON-NEGATIVE)
- MOST DESIRED OR TARGET VALUE IS NON-ZERO AND FINITE
- POSSIBLE TO FIND A SCALING OR ADJUSTMENT FACTOR
- WHEN MEAN IS ZERO, STANDARD DEVIATION IS ALSO ZERO
- MAXIMIZE

$$\eta = 10 \text{ Log}_{10} [\mu^2 / \sigma^2]$$

28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 14**



NOMINAL - THE - BEST TYPE PROBLEM

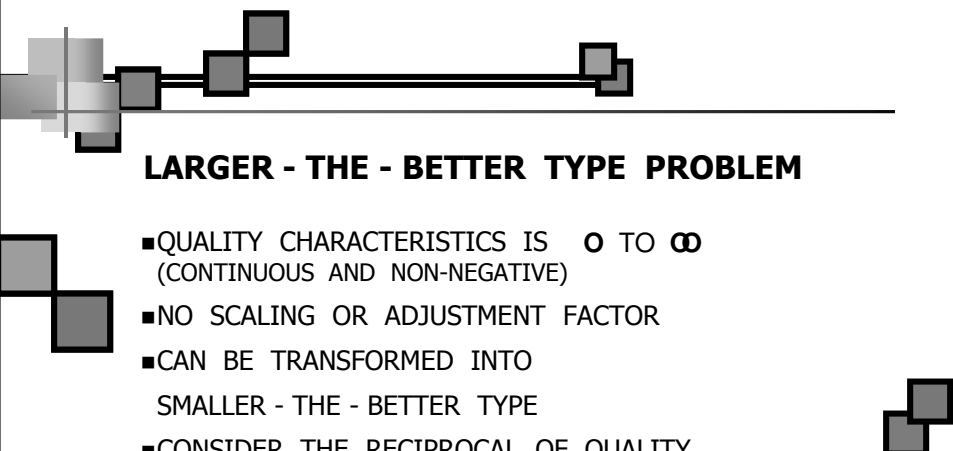
- MAXIMIZE

$$\eta = 10 \text{ Log}_{10} [\mu^2 / \sigma^2]$$

- USE TWO - STEP PROCEDURE

1. Minimize Variance $\{ \sigma^2 \}$
2. Adjust the mean ' μ ' on to target ' μ_0 '

28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 15**




LARGER - THE - BETTER TYPE PROBLEM

- QUALITY CHARACTERISTICS IS 0 TO ∞
(CONTINUOUS AND NON-NEGATIVE)
- NO SCALING OR ADJUSTMENT FACTOR
- CAN BE TRANSFORMED INTO
SMALLER - THE - BETTER TYPE
- CONSIDER THE RECIPROCAL OF QUALITY
CHARACTERISTICS
- MAXIMIZE

$$\eta = -10 \text{ Log}_{10} \left[\frac{1}{n} \sum (1/Y_1^2 + 1/Y_2^2 + \dots + 1/Y_n^2) \right]$$

28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 16**




SIGNED - TARGET TYPE PROBLEM

- QUALITY CHARACTERISTICS CAN TAKE POSITIVE AND NEGATIVE VALUES
- OFTEN, TARGET VALUE = ZERO
IF NOT, IT CAN BE MADE ZERO BY CHANGE OF REFERENCE
- WHEN MEAN **IS** ZERO, STANDARD DEVIATION IS **NOT** ZERO
- A SCALING OR ADJUSTMENT FACTOR EXISTS
- **MAXIMIZE**

$$\eta = - 10 \text{Log}_{10} [\sigma^2]$$

28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 17**



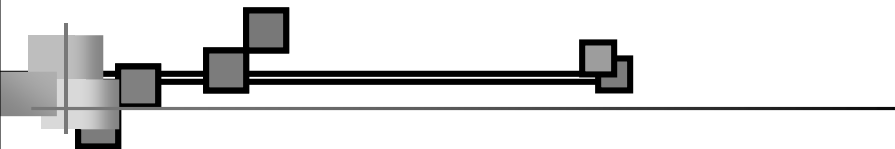
FRACTION DEFECTIVE TYPE PROBLEM

- QUALITY CHARACTERISTICS IS A FRACTION P (0 TO 1)
- TARGET VALUE = ZERO
- NO SCALING OR ADJUSTMENT FACTOR
- **MAXIMIZE**

$$\eta = - 10 \text{Log}_{10} [P / (1 - P)]$$

- OR MINIMIZE
 - NO. OF BAD PIECES TO PRODUCE ONE GOOD PIECE


28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 18**



ORDERED CATEGORICAL PROBLEM

- QUALITY CHARACTERISTICS TAKE ORDERED CATEGORICAL VALUES
(C1 = WORSE C2 = NO CHANGE
C3 = GOOD C4 = EXCELLENT)
- EXTREME CATEGORY C4 IS MOST DESIRED (TARGET VALUE)
- FORM CUMULATIVE CATEGORIES.
- TREAT EACH CATEGORY AS
- A FRACTION DEFECTIVE PROBLEM

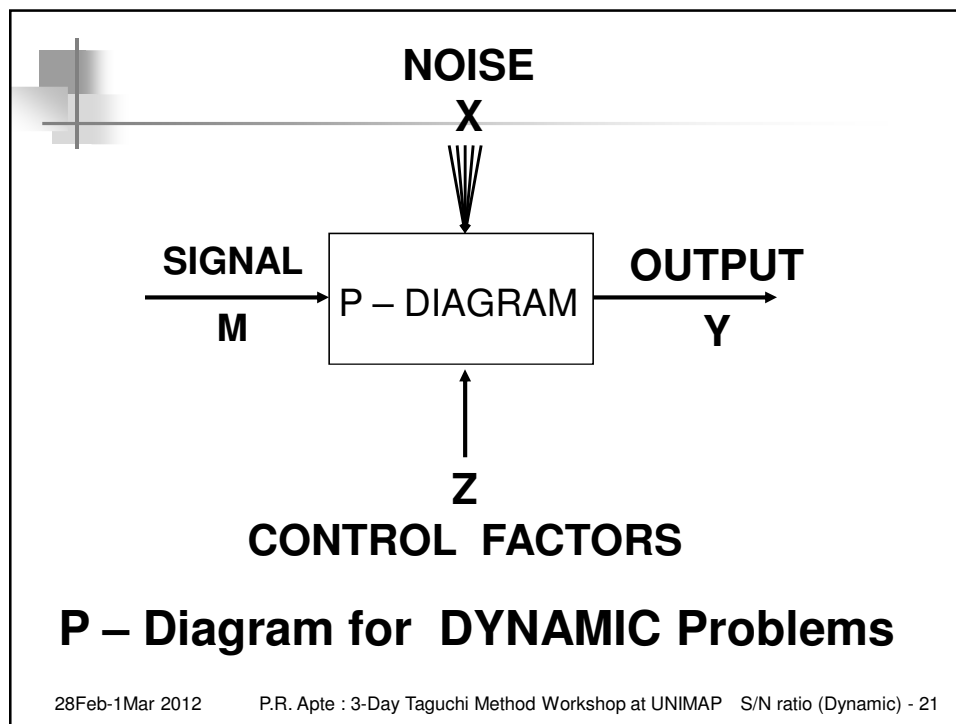
28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 19**



CURVE OR VECTOR TYPE PROBLEM

- QUALITY CHARACTERISTICS IS A CURVE OR A VECTOR
- BROKEN INTO SEVERAL SCALAR PROBLEMS OF THE TYPE ALREADY DESCRIBED

28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 20**

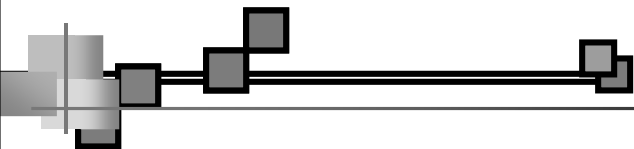


S/N RATIOS FOR DYNAMIC PROBLEMS

■ TYPES OF DYNAMIC PROBLEMS

- CONTINUOUS - CONTINUOUS TYPE (C - C)
- CONTINUOUS - DIGITAL TYPE (C - D)
- DIGITAL - CONTINUOUS TYPE (D - C)
- DIGITAL - DIGITAL TYPE (D - D)

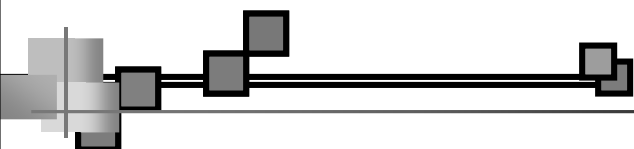
28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 22**



CONTINUOUS - CONTINUOUS TYPE PROBLEM

- BOTH SIGNAL FACTOR AND QUALITY CHARACTERISTICS TAKE POSITIVE OR NEGATIVE VALUES
- WHEN SIGNAL $M = 0$, QUALITY CHARACTERISTIC = 0
- IDEAL FUNCTION $y = M$
- SCALING FACTOR EXISTS TO ADJUST SLOPE (PROPORTIONALITY CONSTANT) BETWEEN 'y' AND 'M'

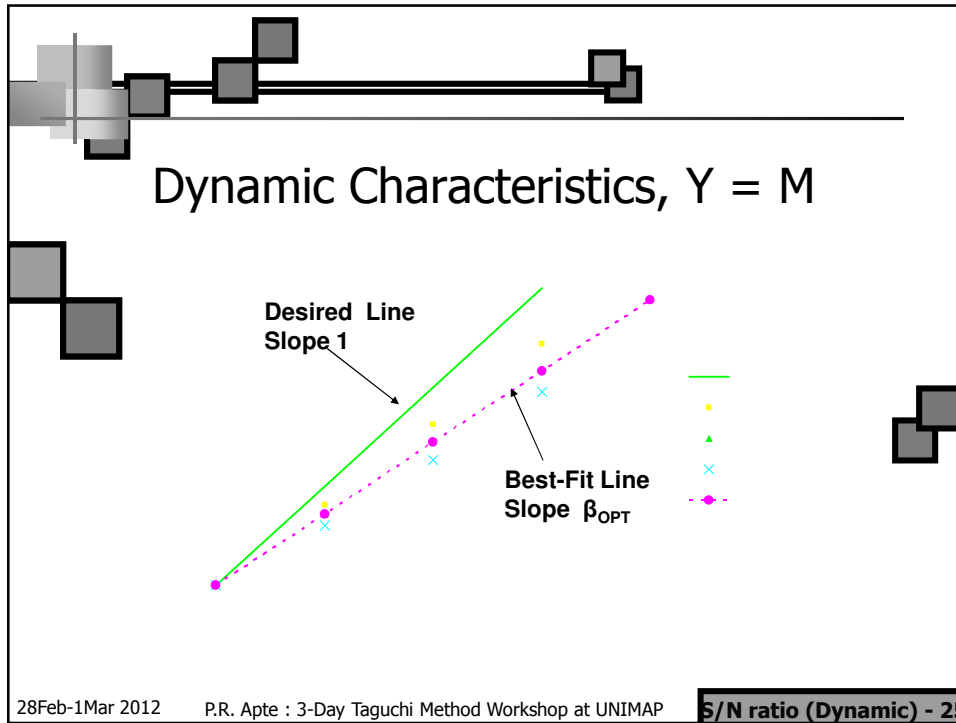
28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 23**



S/N RATIO FOR A C - C TYPE PROBLEM

- QUALITY CHARACTERISTIC 'y', FOLLOWS THE SIGNAL FACTOR 'M'
- $y = \beta M$ (usually β is taken as 1) $\rightarrow y = M$

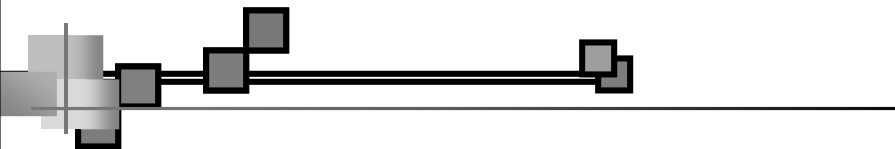
28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 24**



S/N RATIO FOR A C - C TYPE PROBLEM

- Quality Loss for each $Y_{ij} = K (Y_{ij} - M_i)$
- AVERAGE
$$Q_z = \frac{K}{m n} \sum_{l=1}^m \sum_{j=1}^n (Y_{ij} - M_i)^2$$
- QUALITY LOSS WITHOUT ADJUSTMENT HAS TWO COMPONENTS
 - LOSS DUE TO SLOPE NOT BEING EQUAL TO 1
 - LOSS DUE TO DEVIATION FROM LINARITY (VARIANCE)

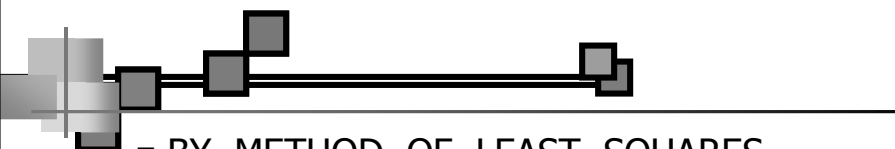
28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 26**



- REGRESSION OF 'Yij' UPON Mi
- Let straight line fitting the 'Yij' have a slope 'β'
- Quality Loss with respect to the straight line

$$Q_Z' = \frac{K}{m n} \sum_{l=1}^m \sum_{j=1}^n (Y_{ij} - \beta M_i)^2$$

28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 27**



- BY METHOD OF LEAST SQUARES
- (Differentiate wrt β and equate to zero)

$$\beta_{OPT} \text{ (slope of best fit line)} = \frac{\sum_{l=1}^m \sum_{j=1}^n (Y_{ij} M_i)}{\sum_{l=1}^m \sum_{j=1}^n M_i^2}$$

28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 28**

- – BEST ADJUSTMENT
- Multiply all ' Y_{ij} ' by $(1/\beta_{OPT})$
- SUCH THAT
- Quality loss after adjustment

$$Q_a' = \frac{K}{m n} \sum_{l=1}^m \sum_{j=1}^n \left(\frac{Y_{ij}}{\beta_{OPT}} - \beta M_i \right)^2$$

[ADJUSTMENT FACTOR IS $(1/\beta_{OPT})$]

28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 29**

- Quality after adjustment, ' Q_a' '


$$Q_a' = \frac{K}{m n} \sum_{l=1}^m \sum_{j=1}^n \left[\frac{(Y_{ij} - \beta M_i)^2}{\beta_{OPT}^2} \right]$$

$$Q_a' = \frac{1}{\beta_{OPT}^2} \left[\frac{K}{m n} \sum_{l=1}^m \sum_{j=1}^n (Y_{ij} - \beta M_i)^2 \right]$$

$$Q_a' = \frac{\sigma_e^2}{\beta_{OPT}^2}$$

This is σ_e^2

28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 30**



- Quality after adjustment, 'Q_a'


$$Q_a = \frac{\sigma_e^2}{\beta_{OPT}^2}$$

- Minimize, 'Q_a' (or maximize 1/ 'Q_a')

$$\eta = 10 \text{ Log}_{10} \left[\frac{\beta_{OPT}^2}{\sigma_e^2} \right]$$

(REDUCES NON-LINEARITY ALONG WITH REDUCTION IN SENSITIVITY TO NOISE FACTORS)

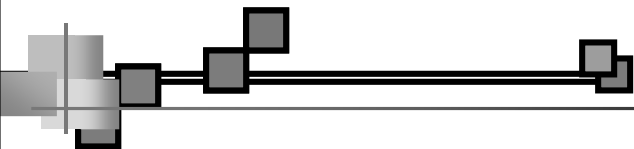
28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 31**



TWO STEP PROCEDURE to Optimize Dynamic Problems

- STEP 1
 - MAXIMIZE $\eta = 10 \text{ Log}_{10} \left[\frac{\beta_{OPT}^2}{\sigma_e^2} \right]$
- STEP 2
 - ADJUST SLOPE BY SUITABLE SCALING FACTOR

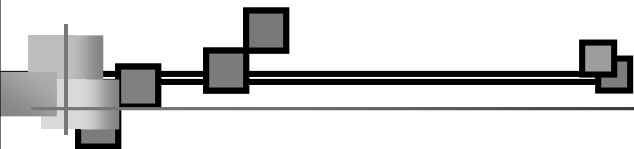
28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 32**



CONTINUOUS - DIGITAL TYPE (C - D)

- TEMPERATURE CONTROLLER
 - INPUT TEMPERATURE SETTING - CONTINUOUS
 - OUTPUT OF HEATING UNIT - ' ON ' OR ' OFF '
 - DIVIDE INTO TWO SEPARATE PROBLEMS
ONE FOR ' ON ' FUNCTION
OTHER FOR ' OFF ' FUNCTION
 - EACH ONE CONTINUOUS - CONTINUOUS TYPE OR
NOMINAL - THE - BEST TYPE PROBLEM

28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 33**



DIGITAL - CONTINUOUS TYPE (D - C)

- DIGITAL TO ANALOG CONVERTER
 - CONVERSION TO ' 0 ' AND ' 1 '
 - DIVIDE INTO TWO SEPARATE PROBLEMS
ONE FOR ' 0 ' FUNCTION
OTHER FOR ' 1 ' FUNCTION
 - EACH ONE CONTINUOUS - CONTINUOUS TYPE OR
NOMINAL - THE - BEST TYPE PROBLEM

28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP **S/N ratio (Dynamic) - 34**

Thank You

28Feb-1Mar 2012 P.R. Apte : 3-Day Taguchi Method Workshop at UNIMAP 5/N ratio (Dynamic) - 35