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2.830J / 6.780J / ESD.63J Control of Manufacturing Processes (SMA 6303) Spring 2008

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## Name:

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### 2.830J/6.780J Control of Manufacturing Processes

Spring 2008
Quiz \#2
Thursday - April 24, 2008
In all problems, please show your work and explain your reasoning. Statistical tables for the cumulative standard normal distribution, percentage points of the $\chi^{2}$ distribution, percentage points of the $t$ distribution, and percentage points of the $F$ distribution (all from Montgomery, $5^{\text {th }}$ Ed.) are provided.

## Problem 1 [45\%]

An experiment is designed and executed, in which the design or input variable is $x$ and the output variable is $y$. The input range is normalized to $[-1,+1]$. Experiments are run in the order shown in Table 1 below, with the input setting and output result as given in the table.

Table 1: Full factorial DOE experiment results

| Run \# | $x$ | $y$ |
| :---: | ---: | ---: |
| 1 | -1 | 8 |
| 2 | 1 | 18 |
| 3 | -1 | 9 |
| 4 | 1 | 19 |
| 5 | -1 | 10 |
| 6 | 1 | 20 |

## Part (a) [5\%]

Fit a model of the form $y=\beta_{0}+\beta_{1} x$ to the data, and determine point estimates for $\beta_{0}$ and $\beta_{1}$.

## Part (b) [10\%]

Determine the standard error (std. err.) and $95 \%$ confidence intervals for the estimates of $\beta_{0}$ and $\beta_{1}$. Are both parameters significant to $95 \%$ confidence or better? Should you include both terms in the model?

Part (c) [5\%]
Following good practice, we next examine the residuals (differences between the model prediction values and measured values, for our data). In particular, we consider the residuals as a function of run order. What pattern in the residuals raises a concern? What modifications might you suggest to the experimental design or analysis in light of this?

## Part (d) [10\%]

Setting aside any reservations about the existing experimental design or the model, we next consider using the model to predict some values, for further experimentation and optimization.
(i) We are interested in how well the model predicts outputs, at different values for $x$. Derive a formula for the standard error $\left(s_{\hat{y}}\right)$ in the output estimate $\hat{y}_{i}$ as a function of the input value $x_{i}$.
(ii) Next, we consider a prediction at possible center point in the input space. Provide a $95 \%$ confidence interval prediction for the output value at the design space center point, i.e., give the point estimate and $95 \%$ confidence interval bounds for $\hat{y}(x=0)$.
(iii) Finally, we also consider an extrapolation of the model beyond the original range of experimentation. Provide a $95 \%$ confidence interval prediction for the output value at $x$ equal to 3 (in normalized units), i.e., give the point estimate and $95 \%$ confidence interval bounds for $\hat{y}(x=3)$. Comment on the confidence in model outputs as a function of how far we are extrapolating from our experimental region.

## Part (e) [10\%]

We now perform one additional experimental run to augment Table 1 . Setting the input $x$ to 0 , the output $y$ is experimentally observed to be equal to 7 . Based on this, perform and discuss a lack of fit analysis. To $95 \%$ confidence or better, does the model from part (a) show evidence of lack of fit?

## Part (f) [5\%]

Fit a new model, including the center point data point ( $x=0, y=7$ ). I.e., find $\alpha_{0}, \alpha_{1}$, and $\alpha_{2}$ for a model of the form $y=\alpha_{0}+\alpha_{1} \cdot x+\alpha_{2} \cdot x^{2}$. For this part, point estimates are sufficient. Note: it is possible to identify model coefficients by inspection, graphical, or other simplified means; fullscale set up and solution of regression equations is not necessary.

Problem 2 [20\%]
Consider the random-access memory chip shown below, having $R$ rows and $C$ columns:


We are interested in investigating the defect tolerance of the memory array. Small particles (which may be regarded as causing point defects) land on the memory chip during fabrication, with a per-area density of $D_{0}$. Particles landing on the datapath, row decoder or control logic do not cause faults (these circuits are very robustly designed), but when a defect lands on one of the memory cells, each cell having an area $A$, the entire row and the entire column of cells in which the afflicted cell sits are rendered inoperative.

Assume that the spatial density of defects is very tightly distributed, so that we can write the proportion of memory cells not hit by a particle during fabrication as $Y=\exp \left(-A D_{0}\right)$.

## Part (a) [3\%]

Write down an expression in terms of $Y, R$, and $C$ for the number, $F$, of individual memory cells hit by particles during fabrication.

Part (b) [10\%]
Write down expressions in terms of $Y, R$ and $C$ for (i) the proportion of columns that are operative after fabrication, and (ii) the proportion of rows operative.

## Part (c) [7\%]

Write down an expression in terms of $Y, R$ and $C$ for the overall proportion, $P$, of memory cells that is available for use after fabrication.

Part (d) [optional; for up to 5 bonus percentage points]
Show that the proportion of usable memory cells is maximized when the memory array is square.

## Problem 3 [35\%]

Part (a) [20\%]
Measurements are made of the threshold voltages of MOSFET devices at three randomly chosen locations on each of three wafers themselves chosen randomly from a lot. The deviations of the measured threshold voltages from their target value are shown below. Complete the nested variance analysis. Cells requiring a value to be inserted have a thick border. Some calculations have already been done for you.

| Wafer \# | Site \# | Threshold voltage deviation (mV) | Wafer average (mV) | Squared deviations of point from grand ave. $\left(m V^{2}\right)$ | Squared deviations of wafer ave. from grand ave. $\left(\mathrm{mV}^{2}\right)$ | Squared deviations of point from wafer ave. $\left(\mathrm{mV}^{2}\right)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 1 | 1 |  | 1 |  | 1 |
| 1 | 2 | 2 |  | 0 |  | 0 |
| 1 | 3 | 3 | 2 | 1 | 0 | 1 |
| 2 | 1 | 2 |  | 0 |  | 0 |
| 2 | 2 | 2 |  | 0 |  | 0 |
| 2 | 3 | 2 | 2 | 0 | 0 | 0 |
| 3 | 1 | 4 |  | 4 |  | 4 |
| 3 | 2 | 0 |  | 4 |  | 4 |
| 3 | 3 | 2 | 2 | 0 | 0 | 0 |
|  |  |  |  |  |  |  |
|  |  | Grand average: | 2 |  |  |  |
|  |  |  |  |  |  |  |
|  |  |  | SS_D | 10 |  |  |
|  |  |  | SS_W |  | 0 |  |
|  |  |  | SS_E |  |  | 10 |


| ANOVA (in $\mathbf{m V}^{2}$ ) |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Source | Degrees of Freedom | SS | MS | $\mathrm{F}_{0}$ | $\mathrm{~F}_{\text {crit }}$ (5\% level) |  |
| WAFER |  |  |  |  |  |  |
| ERROR |  |  |  | N/A | N/A |  |
| C TOTAL |  |  |  | N/A | N/A |  |


| VARIANCE COMPONENTS (in mV ${ }^{2}$ ) |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Variation source | MS | \# data in SS | Observed <br> variance | Estimated <br> variance |  |
| ERROR (site-to-site) |  |  |  |  |  |
| WAFER (wafer-to-wafer) |  |  |  |  |  |
| TOTAL |  |  |  |  |  |

Part (b) [5\%]
What do you conclude from the nested variance analysis above?

Part (c) [10\%]
Now you are given threshold voltage deviation data from the same process, but this time taken from nine separate wafers. From each wafer one measurement is taken at one of three specified (not randomly chosen) locations. The objective is to check for evidence of any systematic (fixed) relationship between threshold voltage deviation and position on the wafer. Complete the ANOVA below.


| Wafer \# | Site (location on wafer) | Threshold voltage deviation ( mV ) | Per-location average (mV) |
| :---: | :---: | :---: | :---: |
| 1 | 1 | 1 | 7/3 |
| 2 | 1 | 2 |  |
| 3 | 1 | 4 |  |
| 4 | 2 | 2 | 4/3 |
| 5 | 2 | 2 |  |
| 6 | 2 | 0 |  |
| 7 | 3 | 3 | 7/3 |
| 8 | 3 | 2 |  |
| 9 | 3 | 2 |  |
|  |  | grand average: | 2 |


| Source of variation | Sum of <br> squares | Degrees of <br> freedom | Mean <br> square | $F_{0}$ | $F_{\text {crit }}$ (5\% level) |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Between groups |  |  |  |  |  |
| Within groups |  |  |  | N/A | N/A |
| Total |  |  | N/A | N/A | N/A |

## Part (c), cont'd.

Is there evidence at the $95 \%$ confidence level of a significant systematic dependence of threshold voltage on site location?

