

## CS 325: Project 3

---

Colin Bradford

Charles Jenkins

Albert Le

May 25, 2015

### 1 PROBLEM 1

#### **Part A:**

##### **i. Linear Problem Formulation**

Let each route be represented as variables of the form "SourceDestination." For example a route from Plant 1 to Warehouse 1 would be "p1w1."

Objective function:

Minimize:

$$10 \text{ p1w1} + 15 \text{ p1w2} + 11 \text{ p2w1} + 8 \text{ p2w2} + 13 \text{ p3w1} + 8 \text{ p3w2} + 9 \text{ p3w3} + 14 \text{ p4w2} + 8 \text{ p4w3} + 5 \text{ w1r1} + 6 \text{ w1r2} + 7 \text{ w1r3} + 10 \text{ w1r4} + 12 \text{ w2r3} + 8 \text{ w2r4} + 10 \text{ w2r5} + 14 \text{ w2r6} + 14 \text{ w3r4} + 12 \text{ w3r5} + 12 \text{ w3r6} + 6 \text{ w3r7}$$

Subject To:

Supply Constraints:

$$\text{p1w1} + \text{p1w2} = 150$$

$$\text{p2w1} + \text{p2w2} = 450$$

$$\text{p3w1} + \text{p3w2} + \text{p3w3} = 250$$

$$\text{p4w2} + \text{p4w3} = 150$$

Demand Constraints:

$$\begin{aligned}w1r1 &= 100 \\w1r2 &= 150 \\w1r3 + w2r3 &= 100 \\w1r4 + w2r4 + w3r4 &= 200 \\w2r5 + w3r5 &= 200 \\w2r6 + w3r6 &= 150 \\w3r7 &= 100\end{aligned}$$

Balancing Constraints:

$$\begin{aligned}p1w1 + p2w1 + p3w1 - w1r1 - w1r2 - w1r3 - w1r4 &\leq 0 \\p1w2 + p2w2 + p3w2 + p4w2 - w2r3 - w2r4 - w2r5 - w2r6 &\leq 0 \\p3w3 + p4w3 - w3r4 - w3r5 - w3r6 - w3r7 &\leq 0\end{aligned}$$

Non-negativity Constraints:

$$\begin{aligned}p1w1, p1w2, p2w1, p2w2, p3w1, p3w2, p3w3, p4w2, p4w3, w1r1, w1r2, w1r3, w1r4, \\w2r3, w2r4, w2r5, w2r6, w3r4, w3r5, w3r6, w3r7 &\geq 0\end{aligned}$$

## ii. LINDO Code and Output

```
MIN 10 p1w1 + 15 p1w2 + 11 p2w1 + 8 p2w2 + 13 p3w1 + 8 p3w2 + 9 p3w3
    + 14 p4w2 + 8 p4w3 + 5 w1r1 + 6 w1r2 + 7 w1r3 + 10 w1r4 + 12 w2r3
    + 8 w2r4 + 10 w2r5 + 14 w2r6 + 14 w3r4 + 12 w3r5 + 12 w3r6 + 6 w3r7
ST
    p1w1 + p1w2 = 150
    p2w1 + p2w2 = 450
    p3w1 + p3w2 + p3w3 = 250
    p4w2 + p4w3 = 150
    w1r1 = 100
    w1r2 = 150
    w1r3 + w2r3 = 100
    w1r4 + w2r4 + w3r4 = 200
    w2r5 + w3r5 = 200
    w2r6 + w3r6 = 150
    w3r7 = 100
    p1w1 + p2w1 + p3w1 - w1r1 - w1r2 - w1r3 - w1r4 <= 0
    p1w2 + p2w2 + p3w2 + p4w2 - w2r3 - w2r4 - w2r5 - w2r6 <= 0
    p3w3 + p4w3 - w3r4 - w3r5 - w3r6 - w3r7 <= 0
    p1w1 > 0
    p1w2 > 0
    p2w1 > 0
    p2w2 > 0
    p3w1 > 0
    p3w2 > 0
```

```

p3w3 > 0
p4w2 > 0
p4w3 > 0
w1r1 > 0
w1r2 > 0
w1r3 > 0
w1r4 > 0
w2r3 > 0
w2r4 > 0
w2r5 > 0
w2r6 > 0
w3r4 > 0
w3r5 > 0
w3r6 > 0
w3r7 > 0
END

```

LP OPTIMUM FOUND AT STEP 13

OBJECTIVE FUNCTION VALUE

1) 17100.00

| VARIABLE | VALUE      | REDUCED COST |
|----------|------------|--------------|
| P1W1     | 150.000000 | 0.000000     |
| P1W2     | 0.000000   | 8.000000     |
| P2W1     | 200.000000 | 0.000000     |
| P2W2     | 250.000000 | 0.000000     |
| P3W1     | 0.000000   | 2.000000     |
| P3W2     | 150.000000 | 0.000000     |
| P3W3     | 100.000000 | 0.000000     |
| P4W2     | 0.000000   | 7.000000     |
| P4W3     | 150.000000 | 0.000000     |
| W1R1     | 100.000000 | 0.000000     |
| W1R2     | 150.000000 | 0.000000     |
| W1R3     | 100.000000 | 0.000000     |
| W1R4     | 0.000000   | 5.000000     |
| W2R3     | 0.000000   | 2.000000     |
| W2R4     | 200.000000 | 0.000000     |
| W2R5     | 200.000000 | 0.000000     |
| W2R6     | 0.000000   | 1.000000     |
| W3R4     | 0.000000   | 7.000000     |
| W3R5     | 0.000000   | 3.000000     |

|      |            |          |
|------|------------|----------|
| W3R6 | 150.000000 | 0.000000 |
| W3R7 | 100.000000 | 0.000000 |

| ROW | SLACK OR SURPLUS | DUAL PRICES |
|-----|------------------|-------------|
| 2)  | 0.000000         | -10.000000  |
| 3)  | 0.000000         | -11.000000  |
| 4)  | 0.000000         | -11.000000  |
| 5)  | 0.000000         | -10.000000  |
| 6)  | 0.000000         | -5.000000   |
| 7)  | 0.000000         | -6.000000   |
| 8)  | 0.000000         | -7.000000   |
| 9)  | 0.000000         | -5.000000   |
| 10) | 0.000000         | -7.000000   |
| 11) | 0.000000         | -10.000000  |
| 12) | 0.000000         | -4.000000   |
| 13) | 0.000000         | 0.000000    |
| 14) | 0.000000         | 3.000000    |
| 15) | 0.000000         | 2.000000    |
| 16) | 150.000000       | 0.000000    |
| 17) | 0.000000         | 0.000000    |
| 18) | 200.000000       | 0.000000    |
| 19) | 250.000000       | 0.000000    |
| 20) | 0.000000         | 0.000000    |
| 21) | 150.000000       | 0.000000    |
| 22) | 100.000000       | 0.000000    |
| 23) | 0.000000         | 0.000000    |
| 24) | 150.000000       | 0.000000    |
| 25) | 100.000000       | 0.000000    |
| 26) | 150.000000       | 0.000000    |
| 27) | 100.000000       | 0.000000    |
| 28) | 0.000000         | 0.000000    |
| 29) | 0.000000         | 0.000000    |
| 30) | 200.000000       | 0.000000    |
| 31) | 200.000000       | 0.000000    |
| 32) | 0.000000         | 0.000000    |
| 33) | 0.000000         | 0.000000    |
| 34) | 0.000000         | 0.000000    |
| 35) | 150.000000       | 0.000000    |
| 36) | 100.000000       | 0.000000    |

NO. ITERATIONS= 13

### iii. Optimal Shipping Routes and Minimum Cost

The optimal shipping routes and quantity of refrigerators per route are:

| Route | Refrigerators |
|-------|---------------|
| P1W1  | 150           |
| P2W1  | 200           |
| P2W2  | 250           |
| P3W2  | 150           |
| P3W3  | 100           |
| P4W3  | 150           |
| W1R1  | 100           |
| W1R2  | 150           |
| W1R3  | 100           |
| W2R4  | 200           |
| W2R5  | 200           |
| W3R6  | 150           |
| W3R7  | 100           |

The optimal minimum cost is \$17,100

#### Part B:

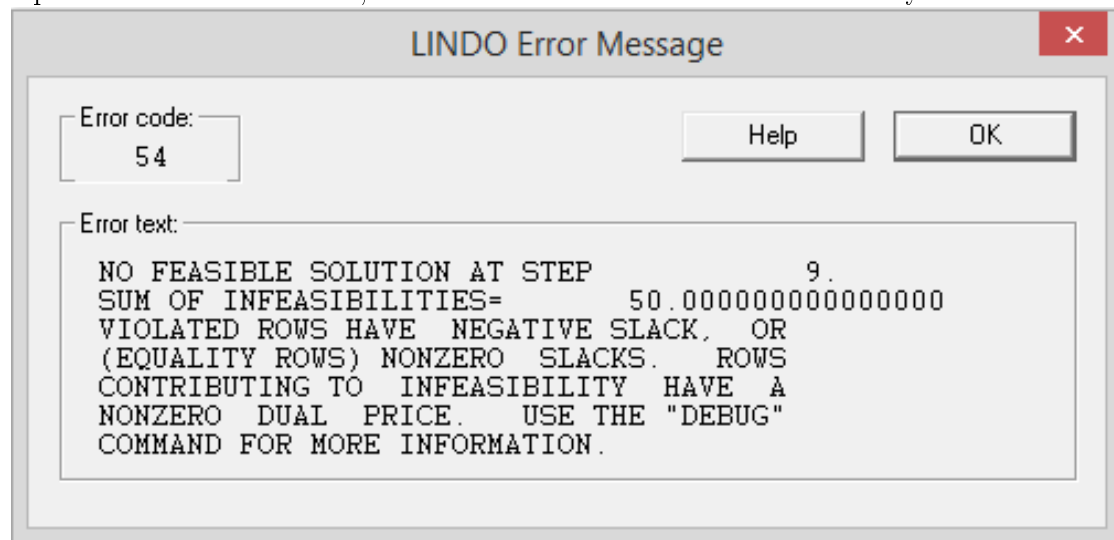
To remove Warehouse 2 and all its associated routes, we remove all variables in our equation that contain "w2" in it. The resulting LINDO code is as follows:

```
MIN 10 p1w1 + 11 p2w1 + 13 p3w1 + 9 p3w3 + 8 p4w3 + 5 w1r1 + 6 w1r2
    + 7 w1r3 + 10 w1r4 + 14 w3r4 + 12 w3r5 + 12 w3r6 + 6 w3r7
ST
p1w1 = 150
p2w1 = 450
p3w1 + p3w3 = 250
p4w3 = 150
w1r1 = 100
w1r2 = 150
w1r3 = 100
w1r4 + w3r4 = 200
w3r5 = 200
w3r6 = 150
w3r7 = 100
p1w1 + p2w1 + p3w1 - w1r1 - w1r2 - w1r3 - w1r4 <= 0
p3w3 + p4w3 - w3r4 - w3r5 - w3r6 - w3r7 <= 0
p1w1 > 0
p2w1 > 0
p3w1 > 0
```

```
p3w3 > 0
p4w3 > 0
w1r1 > 0
w1r2 > 0
w1r3 > 0
w1r4 > 0
w3r4 > 0
w3r5 > 0
w3r6 > 0
w3r7 > 0
```

END

Upon execution of the code, we are met with these solution infeasibility notices:



LINDO Solver Status

×

Optimizer Status

Status:Infeasible

Iterations:4

Infeasibility:50

Objective:18800

Best IP:N/A

IP Bound:N/A

Branches:N/A

Elapsed Time:00:00:18

Update Interval:

1

Interrupt Solver

Close

There is no feasible solution here because Warehouse 3's total possible supply (400) is not capable of supporting the combined demand of R4, R5, R6, and R7 (650). On the other hand, Warehouse 1 is in fact capable of supporting R1, R2, R3, and R4 with its 850 supply to 550 demand ratio, but that still does not solve the larger supply chain deficit and feasibility issue. Overall, we need Warehouse 2 to supplement the supply to

R3, R4, R5, and R6 and sufficiently "spread the load" on the warehouses.

### Part C:

To simulate the limitation of 100 shipments (inbound and outbound) on Warehouse 2, we add two new constraints to our code for Part A. The constraints limit the inbound and outbound shipments to being less than or equal to 100.

LINDO Code and Output:

```
MIN 10 p1w1 + 15 p1w2 + 11 p2w1 + 8 p2w2 + 13 p3w1 + 8 p3w2 + 9 p3w3
    + 14 p4w2 + 8 p4w3 + 5 w1r1 + 6 w1r2 + 7 w1r3 + 10 w1r4 + 12 w2r3
    + 8 w2r4 + 10 w2r5 + 14 w2r6 + 14 w3r4 + 12 w3r5 + 12 w3r6 + 6 w3r7
ST
    p1w1 + p1w2 = 150
    p2w1 + p2w2 = 450
    p3w1 + p3w2 + p3w3 = 250
    p4w2 + p4w3 = 150
    w1r1 = 100
    w1r2 = 150
    w1r3 + w2r3 = 100
    w1r4 + w2r4 + w3r4 = 200
    w2r5 + w3r5 = 200
    w2r6 + w3r6 = 150
    w3r7 = 100
    p1w1 + p2w1 + p3w1 - w1r1 - w1r2 - w1r3 - w1r4 <= 0
    p1w2 + p2w2 + p3w2 + p4w2 - w2r3 - w2r4 - w2r5 - w2r6 <= 0
    p3w3 + p4w3 - w3r4 - w3r5 - w3r6 - w3r7 <= 0
    p1w1 > 0
    p1w2 > 0
    p2w1 > 0
    p2w2 > 0
    p3w1 > 0
    p3w2 > 0
    p3w3 > 0
    p4w2 > 0
    p4w3 > 0
    w1r1 > 0
    w1r2 > 0
    w1r3 > 0
    w1r4 > 0
    w2r3 > 0
    w2r4 > 0
    w2r5 > 0
```



```

w2r6 > 0
w3r4 > 0
w3r5 > 0
w3r6 > 0
w3r7 > 0
p1w2 + p2w2 + p3w2 + p4w2 <= 100
w2r3 + w2r4 + w2r5 + w2r6 <= 100
END

```

LP OPTIMUM FOUND AT STEP 7

OBJECTIVE FUNCTION VALUE

1) 18300.00

| VARIABLE | VALUE      | REDUCED COST |
|----------|------------|--------------|
| P1W1     | 150.000000 | 0.000000     |
| P1W2     | 0.000000   | 8.000000     |
| P2W1     | 350.000000 | 0.000000     |
| P2W2     | 100.000000 | 0.000000     |
| P3W1     | 0.000000   | 4.000000     |
| P3W2     | 0.000000   | 2.000000     |
| P3W3     | 250.000000 | 0.000000     |
| P4W2     | 0.000000   | 9.000000     |
| P4W3     | 150.000000 | 0.000000     |
| W1R1     | 100.000000 | 0.000000     |
| W1R2     | 150.000000 | 0.000000     |
| W1R3     | 100.000000 | 0.000000     |
| W1R4     | 150.000000 | 0.000000     |
| W2R3     | 0.000000   | 7.000000     |
| W2R4     | 50.000000  | 0.000000     |
| W2R5     | 50.000000  | 0.000000     |
| W2R6     | 0.000000   | 4.000000     |
| W3R4     | 0.000000   | 4.000000     |
| W3R5     | 150.000000 | 0.000000     |
| W3R6     | 150.000000 | 0.000000     |
| W3R7     | 100.000000 | 0.000000     |

| ROW | SLACK OR SURPLUS | DUAL PRICES |
|-----|------------------|-------------|
| 2)  | 0.000000         | -20.000000  |
| 3)  | 0.000000         | -21.000000  |
| 4)  | 0.000000         | -19.000000  |

|     |            |            |
|-----|------------|------------|
| 5)  | 0.000000   | -18.000000 |
| 6)  | 0.000000   | 5.000000   |
| 7)  | 0.000000   | 4.000000   |
| 8)  | 0.000000   | 3.000000   |
| 9)  | 0.000000   | 0.000000   |
| 10) | 0.000000   | -2.000000  |
| 11) | 0.000000   | -2.000000  |
| 12) | 0.000000   | 4.000000   |
| 13) | 0.000000   | 10.000000  |
| 14) | 0.000000   | 13.000000  |
| 15) | 0.000000   | 10.000000  |
| 16) | 150.000000 | 0.000000   |
| 17) | 0.000000   | 0.000000   |
| 18) | 350.000000 | 0.000000   |
| 19) | 100.000000 | 0.000000   |
| 20) | 0.000000   | 0.000000   |
| 21) | 0.000000   | 0.000000   |
| 22) | 250.000000 | 0.000000   |
| 23) | 0.000000   | 0.000000   |
| 24) | 150.000000 | 0.000000   |
| 25) | 100.000000 | 0.000000   |
| 26) | 150.000000 | 0.000000   |
| 27) | 100.000000 | 0.000000   |
| 28) | 150.000000 | 0.000000   |
| 29) | 0.000000   | 0.000000   |
| 30) | 50.000000  | 0.000000   |
| 31) | 50.000000  | 0.000000   |
| 32) | 0.000000   | 0.000000   |
| 33) | 0.000000   | 0.000000   |
| 34) | 150.000000 | 0.000000   |
| 35) | 150.000000 | 0.000000   |
| 36) | 100.000000 | 0.000000   |
| 37) | 0.000000   | 0.000000   |
| 38) | 0.000000   | 5.000000   |

NO. ITERATIONS= 7

We see that this is a feasible solution, though it raises our optimal cost from \$17,100 to \$18,300.

The optimal shipping routes and quantity of refrigerators per route are:

| Route | Refrigerators |
|-------|---------------|
| P1W1  | 150           |
| P2W1  | 350           |
| P2W2  | 100           |

|      |     |
|------|-----|
| P3W3 | 250 |
| P4W3 | 150 |
| W1R1 | 100 |
| W1R2 | 150 |
| W1R3 | 100 |
| W1R4 | 150 |
| W2R4 | 50  |
| W2R5 | 50  |
| W3R5 | 150 |
| W3R6 | 150 |
| W3R7 | 100 |

#### Part D:

For some cost  $c_{ab}$  and some route  $x_{ab}$  where their subscripts represent the route from a to b, the objective function is:

$$\text{Min}(\sum_p \sum_w c_{pw} x_{pw} + \sum_w \sum_r c_{wr} x_{wr})$$

*s.t.*

(Supply Constraint) For each source node p, where s is supply:  $\sum_w x_{pw} = s_p$

(Demand Constraint) For each destination node r, where d is demand:  $\sum_w x_{wr} = d_r$

(Balancing Constraint) For each intermediate node w:  $\sum_p x_{pw} - \sum_r x_{wr} \leq 0$

(Non-negativity Constraint) For all nodes p and r:  $x_{pw}, x_{wr} \geq 0$

## 2 PROBLEM 2

#### Part A:

##### i. Linear Problem Formulation

Let each ingredient be represented as variables using the first two letters of the ingredient's name. For example spinach is "sp."

Objective function:

Minimize:

$$21 \text{ to} + 16 \text{ le} + 40 \text{ sp} + 41 \text{ ca} + 41 \text{ su} + 120 \text{ sm} + 164 \text{ ch} + 884 \text{ oi}$$

Subject To:

Nutrition Constraints:

$$0.85 \text{ to} + 1.62 \text{ le} + 2.86 \text{ sp} + 0.93 \text{ ca} + 23.4 \text{ su} + 16 \text{ sm} + 9 \text{ ch} \geq 15$$

$$0.33 \text{ to} + 0.20 \text{ le} + 0.39 \text{ sp} + 0.24 \text{ ca} + 48.7 \text{ su} + 5 \text{ sm} + 2.6 \text{ ch} + 100 \text{ oi} \geq 2$$

$0.33 \text{ to} + 0.20 \text{ le} + 0.39 \text{ sp} + 0.24 \text{ ca} + 48.7 \text{ su} + 5 \text{ sm} + 2.6 \text{ ch} + 100 \text{ oi} \leq 8$   
 $4.64 \text{ to} + 2.37 \text{ le} + 3.63 \text{ sp} + 9.58 \text{ ca} + 15 \text{ su} + 3 \text{ sm} + 27 \text{ ch} \geq 4$   
 $9 \text{ to} + 28 \text{ le} + 65 \text{ sp} + 69 \text{ ca} + 3.8 \text{ su} + 120 \text{ sm} + 78 \text{ ch} \leq 200$   
 $\text{le} + \text{sp} - .4\text{le} - .4\text{sp} - .4\text{to} - .4\text{ca} - .4\text{su} - .4\text{sm} - .4\text{ch} - .4\text{oi} \geq 0$

Non-negativity Constraints:

$\text{le}, \text{sp}, \text{to}, \text{ca}, \text{su}, \text{sm}, \text{ch}, \text{oi} \geq 0$

## ii. LINDO Code and Output

```

MIN 21 to + 16 le + 40 sp + 41 ca + 41 su + 120 sm + 164 ch + 884 oi
ST
    0.85 to + 1.62 le + 2.86 sp + 0.93 ca + 23.4 su + 16 sm + 9 ch >= 15
    0.33 to + 0.20 le + 0.39 sp + 0.24 ca + 48.7 su + 5 sm + 2.6 ch + 100 oi >= 8
    0.33 to + 0.20 le + 0.39 sp + 0.24 ca + 48.7 su + 5 sm + 2.6 ch + 100 oi <= 200
    4.64 to + 2.37 le + 3.63 sp + 9.58 ca + 15 su + 3 sm + 27 ch >= 4
    9 to + 28 le + 65 sp + 69 ca + 3.8 su + 120 sm + 78 ch <= 200
    le + sp - .4le - .4sp - .4to - .4ca - .4su - .4sm - .4ch - .4oi >= 0
    le > 0
    sp > 0
    to > 0
    ca > 0
    su > 0
    sm > 0
    ch > 0
    oi > 0
END

```

LP OPTIMUM FOUND AT STEP 8

OBJECTIVE FUNCTION VALUE

1) 103.3371

| VARIABLE | VALUE    | REDUCED COST |
|----------|----------|--------------|
| TO       | 0.000000 | 16.520000    |
| LE       | 0.561163 | 0.000000     |
| SP       | 0.000000 | 13.916369    |
| CA       | 0.000000 | 35.535095    |
| SU       | 0.084189 | 0.000000     |
| SM       | 0.757556 | 0.000000     |
| CH       | 0.000000 | 96.583527    |
| OI       | 0.000000 | 1212.744385  |

| ROW | SLACK OR SURPLUS | DUAL PRICES |
|-----|------------------|-------------|
| 2)  | 0.000000         | -8.632957   |
| 3)  | 6.000000         | 0.000000    |
| 4)  | 0.000000         | 3.269654    |
| 5)  | 0.865455         | 0.000000    |
| 6)  | 93.060745        | 0.000000    |
| 7)  | 0.000000         | -4.447570   |
| 8)  | 0.561163         | 0.000000    |
| 9)  | 0.000000         | 0.000000    |
| 10) | 0.000000         | 0.000000    |
| 11) | 0.000000         | 0.000000    |
| 12) | 0.084189         | 0.000000    |
| 13) | 0.757556         | 0.000000    |
| 14) | 0.000000         | 0.000000    |
| 15) | 0.000000         | 0.000000    |

NO. ITERATIONS= 8

The minimum amount of calories a salad can contain while meeting the nutrition constraints is 103.3371 calories.

The optimal ingredient mix is:

| Ingredient | Amount   |
|------------|----------|
| LE         | 0.561163 |
| SU         | 0.084189 |
| SM         | 0.757556 |

iii. The cost of this salad is:  $0.561163 \cdot .75 + 0.084189 \cdot .45 + 0.757556 \cdot 2.15 = \$2.0875 \approx \$2.09$

**Part B:**

- i.
- ii.
- iii.

**Part C:**

- i.
- ii.
- iii.

### 3 PROBLEM 3

**Part A:**

### i. General Problem Statement

Objective:

$\text{Min } \sum_{i=1}^n b_i$ , for some  $b_i$  representing  $|y_i - (a_1 x_i + a_0)|$  for each  $i = 1 \dots n$

s.t.

For each  $i = 1 \dots n$ ,  $b_i - (y_i - (a_1 x_i + a_0)) \geq 0$

For each  $i = 1 \dots n$ ,  $b_i + (y_i - (a_1 x_i + a_0)) \geq 0$

### ii. LINDO Code and Output

```
MIN b1 + b2 + b3 + b4 + b5 + b6 + b7
```

```
ST
```

```
    b1 + 1 a1 + a0 >= 5
```

```
    b1 - 1 a1 - a0 >= -5
```

```
    b2 + 1 a1 + a0 >= 3
```

```
    b2 - 1 a1 - a0 >= -3
```

```
    b3 + 2 a1 + a0 >= 13
```

```
    b3 - 2 a1 - a0 >= -13
```

```
    b4 + 3 a1 + a0 >= 8
```

```
    b4 - 3 a1 - a0 >= -8
```

```
    b5 + 4 a1 + a0 >= 10
```

```
    b5 - 4 a1 - a0 >= -10
```

```
    b6 + 5 a1 + a0 >= 14
```

```
    b6 - 5 a1 - a0 >= -14
```

```
    b7 + 6 a1 + a0 >= 18
```

```
    b7 - 6 a1 - a0 >= -18
```

```
    b1 > 0
```

```
    b2 > 0
```

```
    b3 > 0
```

```
    b4 > 0
```

```
    b5 > 0
```

```
    b6 > 0
```

```
    b7 > 0
```

```
END
```

```
LP OPTIMUM FOUND AT STEP      7
```

```
OBJECTIVE FUNCTION VALUE
```

```
1)      12.25000
```

| VARIABLE | VALUE    | REDUCED COST |
|----------|----------|--------------|
| B1       | 2.000000 | 0.000000     |
| B2       | 0.000000 | 0.250000     |

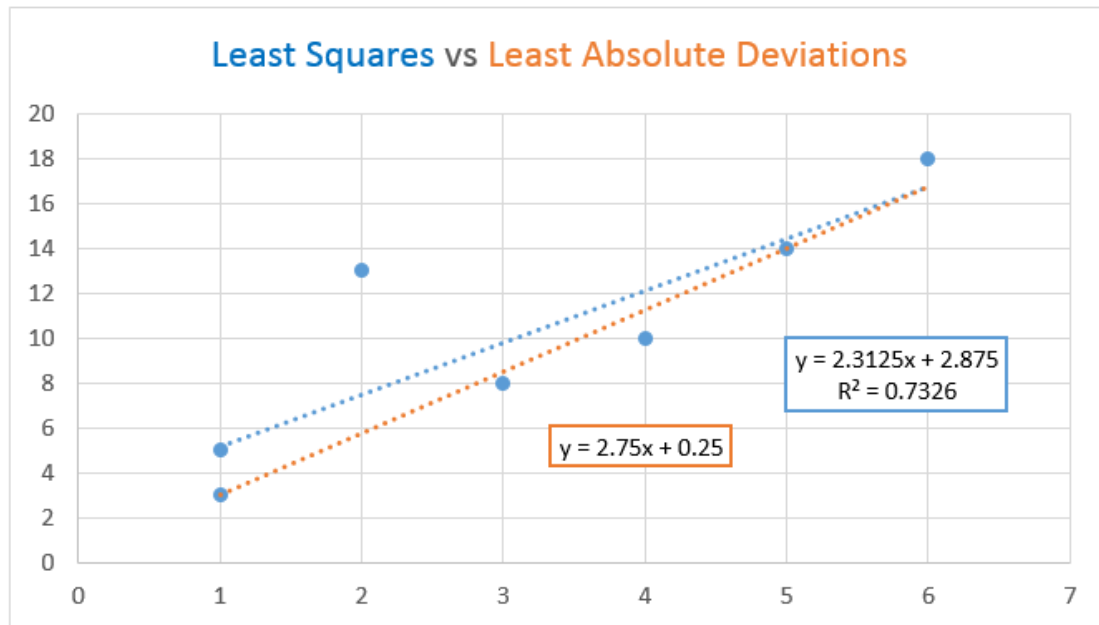
|    |          |          |
|----|----------|----------|
| B3 | 7.250000 | 0.000000 |
| B4 | 0.500000 | 0.000000 |
| B5 | 1.250000 | 0.000000 |
| B6 | 0.000000 | 0.750000 |
| B7 | 1.250000 | 0.000000 |
| A1 | 2.750000 | 0.000000 |
| A0 | 0.250000 | 0.000000 |

| ROW | SLACK OR SURPLUS | DUAL PRICES |
|-----|------------------|-------------|
| 2)  | 0.000000         | -1.000000   |
| 3)  | 4.000000         | 0.000000    |
| 4)  | 0.000000         | 0.000000    |
| 5)  | 0.000000         | -0.750000   |
| 6)  | 0.000000         | -1.000000   |
| 7)  | 14.500000        | 0.000000    |
| 8)  | 1.000000         | 0.000000    |
| 9)  | 0.000000         | -1.000000   |
| 10) | 2.500000         | 0.000000    |
| 11) | 0.000000         | -1.000000   |
| 12) | 0.000000         | 0.000000    |
| 13) | 0.000000         | -0.250000   |
| 14) | 0.000000         | -1.000000   |
| 15) | 2.500000         | 0.000000    |
| 16) | 2.000000         | 0.000000    |
| 17) | 0.000000         | 0.000000    |
| 18) | 7.250000         | 0.000000    |
| 19) | 0.500000         | 0.000000    |
| 20) | 1.250000         | 0.000000    |
| 21) | 0.000000         | 0.000000    |
| 22) | 1.250000         | 0.000000    |

NO. ITERATIONS= 7

The sum of the absolute deviations was 12.25.

### iii. Graph



The LAD approach creates a line that has a steeper slope and lesser y-intercept than the least squares line. The line more tightly follows the path of the majority of the data points and seems to be less affected by the outlier at  $x = 2$ .

## Part B:

### i. General Problem Statement

Objective:

$\text{Min } b$ , for some  $b$  representing  $\text{Max}|y_i - (a_1x_i + a_0)|$

s.t.

For each  $i = 1 \dots n$ ,  $b + a_1x_i + a_0 \geq y_i$

For each  $i = 1 \dots n$ ,  $b - a_1x_i - a_0 \geq -y_i$

### ii. LINDO Code and Output

MIN  $b$

ST

$b + 1 a_1 + a_0 \geq 5$

$b - 1 a_1 - a_0 \geq -5$

$b + 1 a_1 + a_0 \geq 3$

$b - 1 a_1 - a_0 \geq -3$

$b + 2 a_1 + a_0 \geq 13$

$b - 2 a_1 - a_0 \geq -13$

$b + 3 a_1 + a_0 \geq 8$

$b - 3 a_1 - a_0 \geq -8$

$b + 4 a_1 + a_0 \geq 10$



```

b - 4 a1 - a0 >= -10
b + 5 a1 + a0 >= 14
b - 5 a1 - a0 >= -14
b + 6 a1 + a0 >= 18
b - 6 a1 - a0 >= -18
b > 0
END

LP OPTIMUM FOUND AT STEP      3

      OBJECTIVE FUNCTION VALUE

    1)      3.833333

VARIABLE           VALUE          REDUCED COST
    B              3.833333           0.000000
    A1              2.333333           0.000000
    A0              4.500000           0.000000

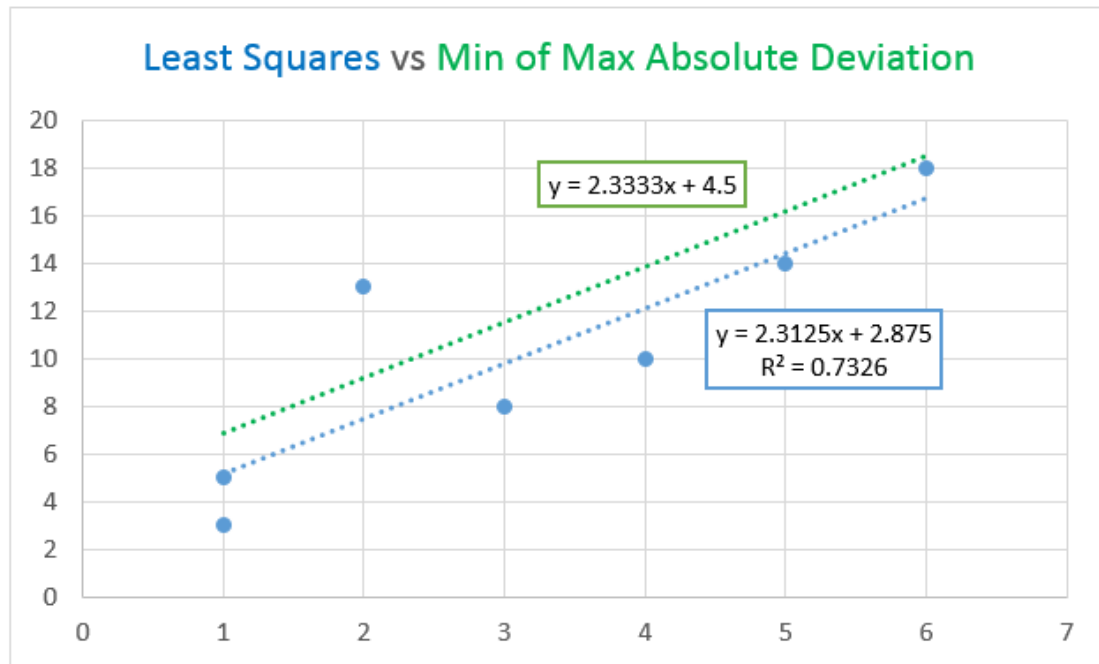
      ROW    SLACK OR SURPLUS      DUAL PRICES
    2)           5.666667           0.000000
    3)           2.000000           0.000000
    4)           7.666667           0.000000
    5)           0.000000          -0.333333
    6)           0.000000          -0.500000
    7)           7.666667           0.000000
    8)           7.333333           0.000000
    9)           0.333333           0.000000
   10)           7.666667           0.000000
   11)           0.000000          -0.166667
   12)           6.000000           0.000000
   13)           1.666667           0.000000
   14)           4.333333           0.000000
   15)           3.333333           0.000000
   16)           3.833333           0.000000

NO. ITERATIONS=           3

```

The min of the max absolute deviations was 3.833333.

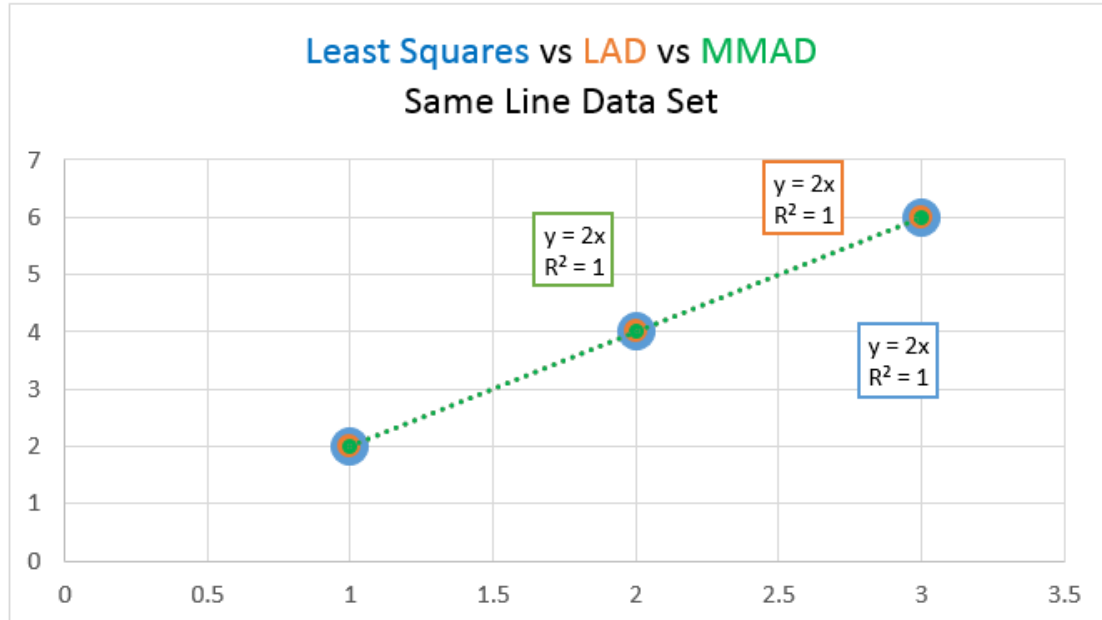
### iii. Graph



The MMAD approach gives a line that appears to be more affected by the outlier at  $x = 2$  with a much higher y-intercept than the LAD and least squares approaches. It's slope however, is only slightly steeper than the least squares line.

#### iv. Same Line Data Set

Yes, the data set  $(x,y) = [(1,2), (2,4), (3,6)]$  computes the same line for all three methods.



LAD Method:

MIN b1 + b2 + b3

ST

b1 + 1 a1 + a0 >= 2  
b1 - 1 a1 - a0 >= -2  
b2 + 2 a1 + a0 >= 4  
b2 - 2 a1 - a0 >= -4  
b3 + 3 a1 + a0 >= 6  
b3 - 3 a1 - a0 >= -6  
b1 > 0  
b2 > 0  
b3 > 0

END

LP OPTIMUM FOUND AT STEP 1

OBJECTIVE FUNCTION VALUE

1) 0.0000000E+00

| VARIABLE | VALUE    | REDUCED COST |
|----------|----------|--------------|
| B1       | 0.000000 | 1.000000     |
| B2       | 0.000000 | 1.000000     |
| B3       | 0.000000 | 1.000000     |
| A1       | 2.000000 | 0.000000     |
| A0       | 0.000000 | 0.000000     |

| ROW | SLACK OR SURPLUS | DUAL PRICES |
|-----|------------------|-------------|
| 2)  | 0.000000         | 0.000000    |
| 3)  | 0.000000         | 0.000000    |
| 4)  | 0.000000         | 0.000000    |
| 5)  | 0.000000         | 0.000000    |
| 6)  | 0.000000         | 0.000000    |
| 7)  | 0.000000         | 0.000000    |
| 8)  | 0.000000         | 0.000000    |
| 9)  | 0.000000         | 0.000000    |
| 10) | 0.000000         | 0.000000    |

NO. ITERATIONS= 1

MMAD Method:

```

MIN b
ST
  b + 1 a1 + a0 >= 2
  b - 1 a1 - a0 >= -2
  b + 2 a1 + a0 >= 4
  b - 2 a1 - a0 >= -4
  b + 3 a1 + a0 >= 6
  b - 3 a1 - a0 >= -6
  b > 0
END

LP OPTIMUM FOUND AT STEP      1

```

# OBJECTIVE FUNCTION VALUE

1)           0.0000000E+00

| VARIABLE | VALUE    | REDUCED COST |
|----------|----------|--------------|
| B        | 0.000000 | 1.000000     |
| A1       | 2.000000 | 0.000000     |
| A0       | 0.000000 | 0.000000     |

| ROW | SLACK OR SURPLUS | DUAL PRICES |
|-----|------------------|-------------|
| 2)  | 0.000000         | 0.000000    |
| 3)  | 0.000000         | 0.000000    |
| 4)  | 0.000000         | 0.000000    |
| 5)  | 0.000000         | 0.000000    |
| 6)  | 0.000000         | 0.000000    |
| 7)  | 0.000000         | 0.000000    |
| 8)  | 0.000000         | 0.000000    |

NO. ITERATIONS=           1

Least Squares Line was produced in Excel (see graph above) rather than LINDO.

## **Part C:** Objective:

$Min \sum_{i=1}^n b_i$ , for some  $b_i$  representing  $|y_i - (a_2x_{2i} + a_1x_{1i} + a_0)|$  for each  $i = 1 \dots n$

s.t.

For each  $i = 1 \dots n$ ,  $b_i - (y_i - (a_2x_{2i} + a_1x_{1i} + a_0)) \geq 0$

For each  $i = 1 \dots n$ ,  $b_i + (y_i - (a_2x_{2i} + a_1x_{1i} + a_0)) \geq 0$

```

MIN b1 + b2 + b3 + b4 + b5 + b6
ST
  b1 + 1 a2 + 1 a1 + a0  >= 5
  b1 - 1 a2 - 1 a1 - a0  >= -5
  b2 + 2 a2 + 1 a1 + a0  >= 9
  b2 - 2 a2 - 1 a1 - a0  >= -9
  b3 + 2 a2 + 2 a1 + a0  >= 12
  b3 - 2 a2 - 2 a1 - a0  >= -12
  b4 + 1 a2 + 0 a1 + a0  >= 3
  b4 - 1 a2 - 0 a1 - a0  >= -3
  b5 + 0 a2 + 0 a1 + a0  >= 0
  b5 - 0 a2 - 0 a1 - a0  >= 0
  b6 + 3 a2 + 1 a1 + a0  >= 11
  b6 - 3 a2 - 1 a1 - a0  >= -11
  b1 > 0
  b2 > 0
  b3 > 0
  b4 > 0
  b5 > 0
  b6 > 0
END

```

LP OPTIMUM FOUND AT STEP 8

OBJECTIVE FUNCTION VALUE

1) 2.000000

| VARIABLE | VALUE    | REDUCED COST |
|----------|----------|--------------|
| B1       | 1.000000 | 0.000000     |
| B2       | 0.000000 | 0.000000     |
| B3       | 0.000000 | 0.500000     |
| B4       | 0.000000 | 0.000000     |
| B5       | 0.000000 | 0.500000     |
| B6       | 1.000000 | 0.000000     |
| A2       | 3.000000 | 0.000000     |
| A1       | 3.000000 | 0.000000     |
| A0       | 0.000000 | 0.000000     |

| ROW | SLACK OR SURPLUS | DUAL PRICES |
|-----|------------------|-------------|
| 2)  | 2.000000         | 0.000000    |
| 3)  | 0.000000         | -1.000000   |
| 4)  | 0.000000         | -1.000000   |

|     |          |           |
|-----|----------|-----------|
| 5)  | 0.000000 | 0.000000  |
| 6)  | 0.000000 | -0.500000 |
| 7)  | 0.000000 | 0.000000  |
| 8)  | 0.000000 | -1.000000 |
| 9)  | 0.000000 | 0.000000  |
| 10) | 0.000000 | 0.000000  |
| 11) | 0.000000 | -0.500000 |
| 12) | 2.000000 | 0.000000  |
| 13) | 0.000000 | -1.000000 |
| 14) | 1.000000 | 0.000000  |
| 15) | 0.000000 | 0.000000  |
| 16) | 0.000000 | 0.000000  |
| 17) | 0.000000 | 0.000000  |
| 18) | 0.000000 | 0.000000  |
| 19) | 1.000000 | 0.000000  |

NO. ITERATIONS= 8

The sum of the absolute deviations was 2.  
The regression model is:  $y = 3x_2 + 3x_1 + 0$