



# Minnesota Department of Transportation Plow Vehicle Scheduling Problem

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Production and Operations Analysis

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# Introduction

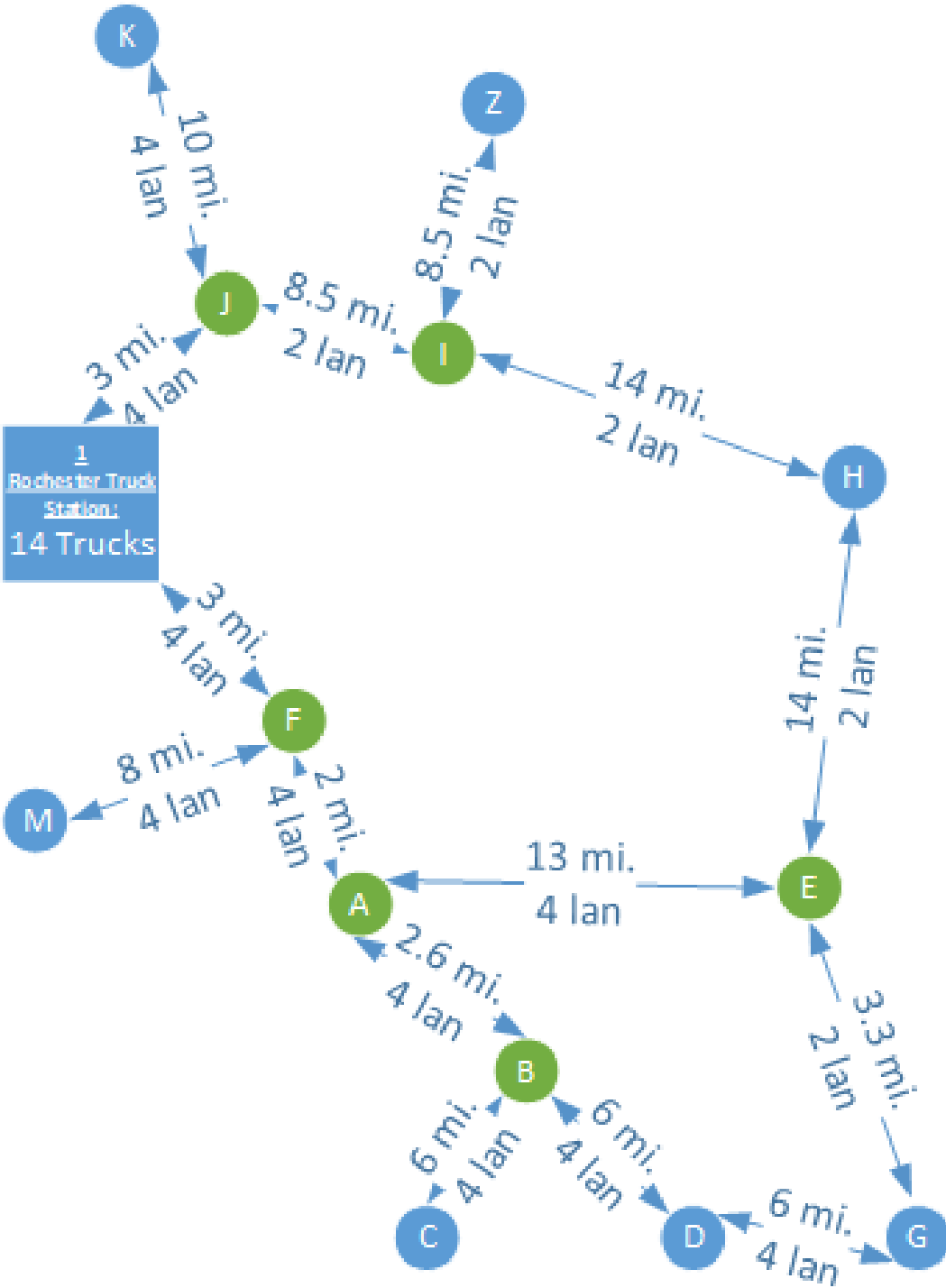
- Project Overview
  - Stress to drivers due to uneven scheduling
  - Mixed Integer programming model
- Objectives
  - Level driver hours
  - Arc based vehicle scheduling

# Assumptions

- Two lanes on a given road is considered to simplify the model
- Focusing on the Rochester, MN station only
- Trucks will travel an average of 55 miles per hour

# Model Building (M.I.P.)

- 15 route sections between 16 nodes
  - Each truck gets at least 1 section
- 14 trucks assigned to entire route network
- Objective function: Minimize sum of truck distance traveled
  - Square added ensures multiple trucks chosen
  - Encourages "Leveling" of Decision Variables



$$\sqrt{\sum_{i=1}^{14} T_i^2}$$

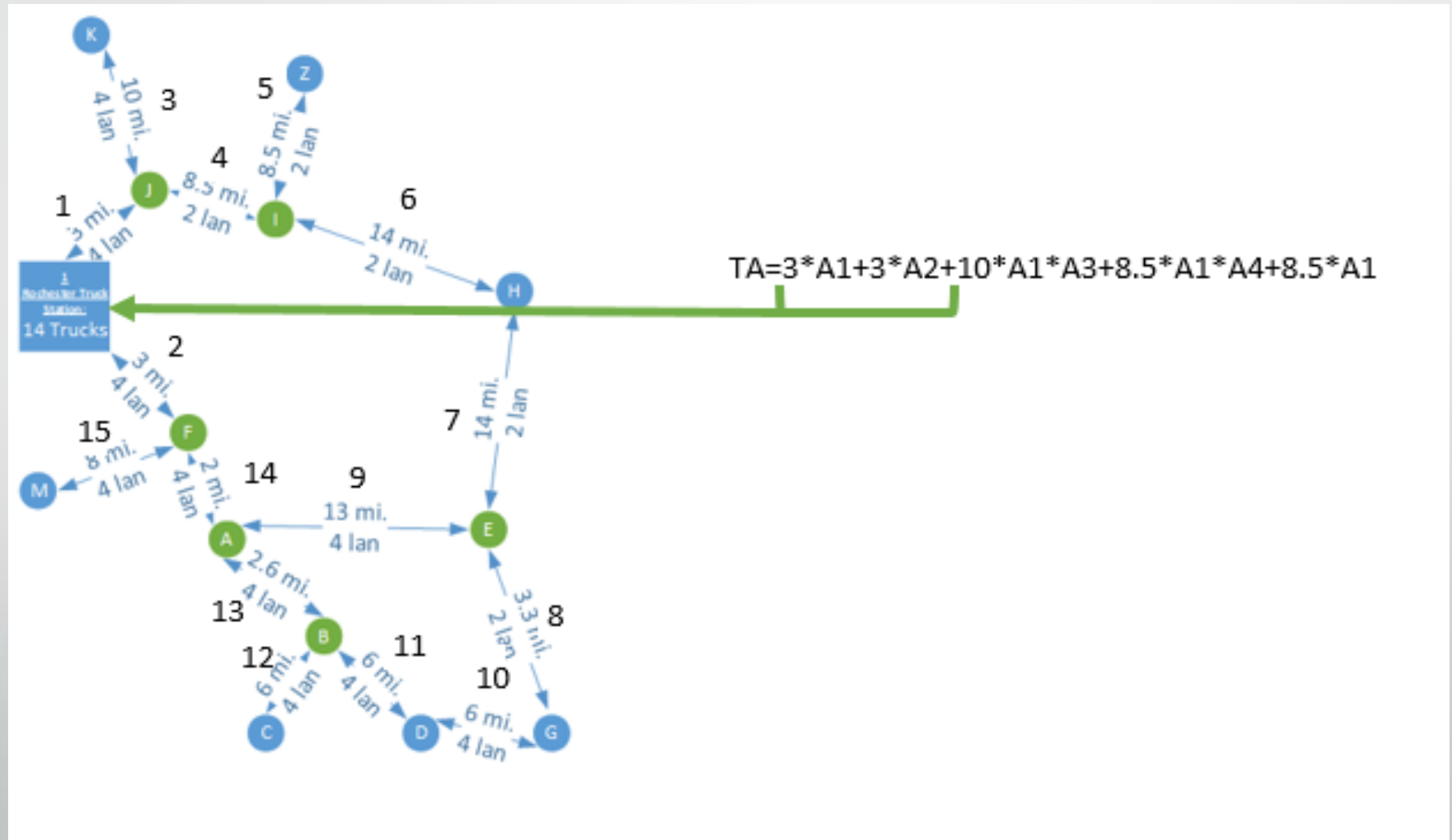
Where  $T_i$  = the total distance traveled by a truck "i"

# Constraints Section: Path Cost Logic

$$TA = 3 \cdot A1 + 3 \cdot A2 + 10 \cdot A1 \cdot A3 + 8.5 \cdot A1 \cdot A4 + 8.5 \cdot A1 \cdot A4 \cdot A5 + 14 \cdot A1 \cdot A4 \cdot A6 + 14 \cdot A1 \cdot A4 \cdot A6 \cdot A7 + 3.3 \cdot A1 \cdot A4 \cdot A6 \cdot A7 \cdot A8 + 13 \cdot A1 \cdot A4 \cdot A6 \cdot A7 \cdot A9 + 6 \cdot A1 \cdot A4 \cdot A6 \cdot A7 \cdot A8 \cdot A10 + 6 \cdot A1 \cdot A4 \cdot A6 \cdot A7 \cdot A8 \cdot A10 \cdot A11 + 6 \cdot A1 \cdot A4 \cdot A6 \cdot A7 \cdot A8 \cdot A10 \cdot A11 \cdot A12 + 2.6 \cdot A1 \cdot A4 \cdot A6 \cdot A7 \cdot A8 \cdot A10 \cdot A11 \cdot A13 + 13 \cdot A1 \cdot A4 \cdot A6 \cdot A7 \cdot A8 \cdot A10 \cdot A11 \cdot A13 \cdot A9 + 2 \cdot A1 \cdot A4 \cdot A6 \cdot A7 \cdot A8 \cdot A10 \cdot A11 \cdot A13 \cdot A14 + 8 \cdot A1 \cdot A4 \cdot A6 \cdot A7 \cdot A8 \cdot A10 \cdot A11 \cdot A13 \cdot A14 \cdot A15 + 3 \cdot A1 \cdot A4 \cdot A6 \cdot A7 \cdot A8 \cdot A10 \cdot A11 \cdot A13 \cdot A14 \cdot A2 + 15 \cdot A1 \cdot A4 \cdot A6 \cdot A7 \cdot A8 \cdot A10 \cdot A11 \cdot A13 \cdot A9 \cdot A14 + 8 \cdot A1 \cdot A4 \cdot A6 \cdot A7 \cdot A8 \cdot A10 \cdot A11 \cdot A13 \cdot A9 \cdot A14 \cdot A2 + 2 \cdot A1 \cdot A4 \cdot A6 \cdot A7 \cdot A9 \cdot A14 + 8 \cdot A1 \cdot A4 \cdot A6 \cdot A7 \cdot A9 \cdot A14 \cdot A15 + 3 \cdot A1 \cdot A4 \cdot A6 \cdot A7 \cdot A9 \cdot A14 \cdot A2 + 2.6 \cdot A1 \cdot A4 \cdot A6 \cdot A7 \cdot A9 \cdot A13 + 6 \cdot A1 \cdot A4 \cdot A6 \cdot A7 \cdot A9 \cdot A13 \cdot A12 + 6 \cdot A1 \cdot A4 \cdot A6 \cdot A7 \cdot A9 \cdot A13 \cdot A11 + 6 \cdot A1 \cdot A4 \cdot A6 \cdot A7 \cdot A9 \cdot A13 \cdot A11 \cdot A10 + 3.3 \cdot A1 \cdot A4 \cdot A6 \cdot A7 \cdot A9 \cdot A13 \cdot A11 \cdot A8 + 8 \cdot A2 \cdot A15 + 2 \cdot A2 \cdot A14 + 13 \cdot A2 \cdot A14 \cdot A9 + 2.6 \cdot A2 \cdot A14 \cdot A13 + 6 \cdot A2 \cdot A14 \cdot A13 \cdot A12 + 6 \cdot A2 \cdot A14 \cdot A13 \cdot A11 + 6 \cdot A2 \cdot A14 \cdot A13 \cdot A11 \cdot A10 + 3.3 \cdot A2 \cdot A14 \cdot A13 \cdot A11 \cdot A10 \cdot A8 + 14 \cdot A2 \cdot A14 \cdot A13 \cdot A11 \cdot A10 \cdot A8 \cdot A7 + 14 \cdot A2 \cdot A14 \cdot A13 \cdot A11 \cdot A10 \cdot A8 \cdot A7 \cdot A6 + 8.5 \cdot A2 \cdot A14 \cdot A13 \cdot A11 \cdot A10 \cdot A8 \cdot A7 \cdot A6 \cdot A5 + 8.5 \cdot A2 \cdot A14 \cdot A13 \cdot A11 \cdot A10 \cdot A8 \cdot A7 \cdot A6 \cdot A4 + 10 \cdot A2 \cdot A14 \cdot A13 \cdot A11 \cdot A10 \cdot A8 \cdot A7 \cdot A6 \cdot A4 \cdot A3 + 3 \cdot A2 \cdot A14 \cdot A13 \cdot A11 \cdot A8 \cdot A7 \cdot A6 \cdot A4 \cdot A1 + 15.6 \cdot A2 \cdot A14 \cdot A9 \cdot A13 + 6 \cdot A2 \cdot A14 \cdot A9 \cdot A13 \cdot A12 + 6 \cdot A2 \cdot A14 \cdot A9 \cdot A13 \cdot A11 + 6 \cdot A2 \cdot A14 \cdot A9 \cdot A13 \cdot A11 \cdot A10 + 3.3 \cdot A2 \cdot A14 \cdot A9 \cdot A13 \cdot A11 \cdot A10 \cdot A8 + 14 \cdot A2 \cdot A14 \cdot A9 \cdot A13 \cdot A11 \cdot A10 \cdot A8 \cdot A7 + 14 \cdot A2 \cdot A14 \cdot A9 \cdot A13 \cdot A11 \cdot A10 \cdot A8 \cdot A7 \cdot A6 + 8.5 \cdot A2 \cdot A14 \cdot A9 \cdot A13 \cdot A11 \cdot A10 \cdot A8 \cdot A7 \cdot A6 \cdot A5 + 8.5 \cdot A2 \cdot A14 \cdot A9 \cdot A13 \cdot A11 \cdot A10 \cdot A8 \cdot A7 \cdot A6 \cdot A4 + 10 \cdot A2 \cdot A14 \cdot A9 \cdot A13 \cdot A11 \cdot A10 \cdot A8 \cdot A7 \cdot A6 \cdot A4 \cdot A3 + 3 \cdot A2 \cdot A14 \cdot A9 \cdot A13 \cdot A11 \cdot A10 \cdot A8 \cdot A7 \cdot A6 \cdot A4 \cdot A1 + 3.3 \cdot A2 \cdot A14 \cdot A9 \cdot A8 \cdot A10 + 6 \cdot A2 \cdot A14 \cdot A9 \cdot A8 \cdot A10 \cdot A11 + 6 \cdot A2 \cdot A14 \cdot A9 \cdot A8 \cdot A10 \cdot A11 \cdot A12 + 2.6 \cdot A2 \cdot A14 \cdot A9 \cdot A8 \cdot A10 \cdot A11 \cdot A13 + 14 \cdot A2 \cdot A14 \cdot A9 \cdot A7 + 14 \cdot A2 \cdot A14 \cdot A9 \cdot A7 \cdot A6 + 8.5 \cdot A2 \cdot A14 \cdot A9 \cdot A7 \cdot A6 \cdot A5 + 8.5 \cdot A2 \cdot A14 \cdot A9 \cdot A7 \cdot A6 \cdot A4 + 10 \cdot A2 \cdot A14 \cdot A9 \cdot A7 \cdot A6 \cdot A4 \cdot A3 + 3 \cdot A2 \cdot A14 \cdot A9 \cdot A7 \cdot A6 \cdot A4 \cdot A1;$$

Note: Constraint shown above only represents the constraints for Truck A.

# Constraints Section: Path Cost Logic (Continued)



# Constraints Section: Guaranty of Path Transverse

$$A1+B1+C1+D1+E1+F1+G1+H1+I1+J1+K1+L1+M1+N1 \geq 1;$$

Note: Constraint shown above only represents the constraints for path 1.

# Constraint Section: Binary Logic Constraint



@Bin(A1);

There are 14 Trucks and 15 possible paths which means a total of 240 Bin constraints were required to be made.

Note: Constraint shown above only represents path 1, truck 1.



# Constraints Section: Adjusted Path Logic

Here we can see that  
for this equation to be  
true we must have both  
A3 and A1 be true.

$$A3 * A1 + A3 * A4 + B3 * B1 + B3 * B4 + C3 * C1 + C3 * C4 + D3 * D1 + D3 * D4 + E3 * E1 + E3 * E4 + F3 * F1 + F3 * F4 + G3 * G1 + G3 * G4 + H3 * H1 + H3 * H4 + I3 * I1 + I3 * I4 + J3 * J1 + J3 * J4 + K3 * K1 + K3 * K4 + L3 * L1 + I3 * L4 + M3 * M1 + M3 * M4 + N3 * N1 + N3 * N4 \geq 1;$$

Note: Constraint shown above only represents the constraints for path 3.

# Truck Assignments (Linear Program)

- Paths for each truck have been determined... But what about specific section assigned to each plow?
- 1 Truck assigned 2 route sections; Other trucks assigned to just 1
- Given truck's path from first model, assigns section to each truck
- Objective Function: Minimize sum of assigned sections per truck

$$\sum_{i=1}^N T_i$$

*Where  $T_i$  = the total number of paths assigned to truck "i"*

# Constraints Section Truck Assignments:

$$A1+B1+C1+D1+E1+F1+G1+H1+I1+J1+K1+L1+M1+N1=1;$$

Note: Constraint shown above only represents the constraints for path 1.

# Constraints Section Truck Assignments:

$$TA = A_1 + A_2 + A_3 + \dots + A_{15}$$

Note: The summation shown above only represents truck A.

# Modeling in Lingo

$$\text{Min} = (1/14) * (\text{TA}^2 + \text{TB}^2 + \text{TC}^2 + \text{TD}^2 + \text{TE}^2 + \text{TF}^2 + \text{TG}^2 + \text{TH}^2 + \text{TI}^2 + \text{TJ}^2 + \text{TK}^2 + \text{TL}^2 + \text{TM}^2 + \text{TN}^2) ;$$

- Used Excel to model path constraints for each truck
- Min Function in Lingo

```
@Bin(A1);
```

TA=3\*A1+3\*A2+10\*A1\*A3+8.5\*A1\*A4+8.5\*A1\*A4\*A5+14\*A1\*A4\*A6+14\*A1\*A4\*A7+3.3\*A1\*A4\*A8  
TB=3\*B1+3\*B2+10\*B1\*B3+8.5\*B1\*B4+8.5\*B1\*B4\*B5+14\*B1\*B4\*B6+14\*B1\*B4\*B6\*B7+3.3\*B1\*B4\*B6\*B8  
TC=3\*C1+3\*C2+10\*C1\*C3+8.5\*C1\*C4+8.5\*C1\*C4\*C5+14\*C1\*C4\*C6+14\*C1\*C4\*C6\*C7+3.3\*C1\*C4\*C6\*C8  
TD=3\*D1+3\*D2+10\*D1\*D3+8.5\*D1\*D4+8.5\*D1\*D4\*D5+14\*D1\*D4\*D6+14\*D1\*D4\*D6\*D7+3.3\*D1\*D4\*D6\*D8  
TE=3>E1+3>E2+10>E1>E3+8.5>E1>E4+8.5>E1>E4>E5+14>E1>E4>E6+14>E1>E4>E6>E7+3.3>E1>E4>E6>E8  
TF=3>F1+3>F2+10>F1>F3+8.5>F1>F4+8.5>F1>F4>F5+14>F1>F4>F6+14>F1>F4>F6>F7+3.3>F1>F4>F6>F8  
TG=3>G1+3>G2+10>G1>G3+8.5>G1>G4+8.5>G1>G4>G5+14>G1>G4>G6+14>G1>G4>G6>G7+3.3>G1>G4>G6>G8  
TH=3>H1+3>H2+10>H1>H3+8.5>H1>H4+8.5>H1>H4>H5+14>H1>H4>H6+14>H1>H4>H6>H7+3.3>H1>H4>H6>H8  
TI=3>I1+3>I2+10>I1>I3+8.5>I1>I4+8.5>I1>I4>I5+14>I1>I4>I6+14>I1>I4>I6>I7+3.3>I1>I4>I6>I7\*I8+13>I1>I4>I6>I7\*I8  
TJ=3>J1+3>J2+10>J1>J3+8.5>J1>J4+8.5>J1>J4>J5+14>J1>J4>J6+14>J1>J4>J6>J7+3.3>J1>J4>J6>J7>J8+13>J1>J4>J6>J7>J8  
TK=3>K1+3>K2+10>K1>K3+8.5>K1>K4+8.5>K1>K4\*K5+14>K1>K4\*K6+14>K1>K4\*K6\*K7+3.3>K1>K4\*K6\*K8  
TL=3>L1+3>L2+10>L1>L3+8.5>L1>L4+8.5>L1>L4\*L5+14>L1>L4\*L6+14>L1>L4\*L6\*L7+3.3>L1>L4\*L6\*L7\*L8  
TM=3>M1+3>M2+10>M1\*M3+8.5>M1>M4+8.5>M1>M4\*M5+14>M1>M4\*M6+14>M1>M4\*M6\*M7+3.3>M1>M4\*M6\*M7\*M8  
TN=3>N1+3>N2+10>N1\*N3+8.5>N1>N4+8.5>N1>N4\*N5+14>N1>N4\*N6+14>N1>N4\*N6\*N7+3.3>N1>N4>N6\*N7\*N8  
TO=3>O1+3>O2+10>O1>O3+8.5>O1>O4+8.5>O1>O4>O5+14>O1>O4>O6+14>O1>O4>O6>O7+3.3>O1>O4>O6>O7>O8  
TP=3>P1+3>P2+10>P1>P3+8.5>P1>P4+8.5>P1>P4>P5+14>P1>P4>P6+14>P1>P4>P6>P7+3.3>P1>P4>P6>P7\*P8

$$A_{12}+B_{12}+C_{12}+D_{12}+E_{12}+F_{12}+G_{12}+H_{12}+I_{12}+J_{12}+K_{12}+L_{12}+M_{12}+N_{12} \geq 1;$$

# Results

- **30.47 miles** per truck on average x 2 for the return trip = 61 miles
- 61miles / 55mph = **1.1 hours**
- Decreases route time by **39%**.
- "Fun" Facts: While testing and tinkering with model variations of it ran over 10 million iterations (~4 hours compute time) when put together.
  - "Winning" model finished with 3.6 million iterations

# Sensitivity Analysis

|    |          |            |
|----|----------|------------|
| 2  | 0.000000 | -0.8571454 |
| 3  | 0.000000 | -1.142857  |
| 4  | 0.000000 | -1.114285  |
| 5  | 0.000000 | -1.114285  |
| 6  | 0.000000 | -1.114285  |
| 7  | 0.000000 | -1.114285  |
| 8  | 0.000000 | -1.114285  |
| 9  | 0.000000 | -1.464286  |
| 10 | 0.000000 | -1.114285  |
| 11 | 0.000000 | -1.464286  |
| 12 | 0.000000 | -1.114285  |
| 13 | 0.000000 | -1.114285  |
| 14 | 0.000000 | -1.114285  |
| 15 | 0.000000 | -1.114285  |
| 16 | 0.000000 | -0.8571429 |
| 17 | 0.000000 | -0.8571429 |
| 18 | 0.000000 | -2.571445  |
| 19 | 0.000000 | 0.000000   |
| 20 | 1.000000 | 0.000000   |
| 21 | 1.000000 | 0.000000   |
| 22 | 1.000000 | 0.000000   |
| 23 | 0.000000 | 0.000000   |
| 24 | 0.000000 | 0.000000   |

|    |          |           |
|----|----------|-----------|
| 25 | 1.000000 | 0.000000  |
| 26 | 0.000000 | 0.000000  |
| 27 | 0.000000 | 0.000000  |
| 28 | 0.000000 | 0.000000  |
| 29 | 0.000000 | 0.000000  |
| 30 | 0.000000 | 0.000000  |
| 31 | 0.000000 | 0.000000  |
| 32 | 1.000000 | 0.000000  |
| 33 | 1.000000 | 0.000000  |
| 34 | 0.000000 | 0.000000  |
| 35 | 0.000000 | -5.714286 |
| 36 | 0.000000 | 2.285714  |
| 37 | 1.000000 | 0.000000  |
| 38 | 1.000000 | 0.000000  |
| 39 | 1.000000 | 0.000000  |
| 40 | 0.000000 | 0.000000  |
| 41 | 0.000000 | 0.000000  |
| 42 | 1.000000 | 0.000000  |
| 43 | 1.000000 | 0.000000  |
| 44 | 1.000000 | 0.000000  |
| 45 | 1.000000 | 0.000000  |
| 46 | 1.000000 | 0.000000  |
| 47 | 1.000000 | 0.000000  |
| 48 | 1.000000 | 0.000000  |

# Lingo Output

Local optimal solution found.

|                          |          |
|--------------------------|----------|
| Objective value:         | 58.25179 |
| Objective bound:         | 58.25179 |
| Infeasibilities:         | 0.000000 |
| Extended solver steps:   | 2        |
| Total solver iterations: | 245      |
| Elapsed runtime seconds: | 0.30     |

|              |       |
|--------------|-------|
| Model Class: | MINLP |
|--------------|-------|

|                      |     |
|----------------------|-----|
| Total variables:     | 256 |
| Nonlinear variables: | 254 |
| Integer variables:   | 28  |

|                        |     |
|------------------------|-----|
| Total constraints:     | 270 |
| Nonlinear constraints: | 18  |

|                             |     |
|-----------------------------|-----|
| Total <u>nonzeros</u> :     | 773 |
| Nonlinear <u>nonzeros</u> : | 295 |

| Variable | Value    | Reduced Cost |
|----------|----------|--------------|
| TA       | 6.000000 | 0.000000     |
| TB       | 6.800000 | 0.000000     |
| TC       | 6.800000 | 0.000000     |
| TD       | 11.25000 | 0.000000     |
| TE       | 6.800000 | 0.000000     |
| TF       | 6.800000 | 0.000000     |
| TG       | 6.800000 | 0.000000     |
| TH       | 6.800000 | 0.000000     |
| TI       | 6.800000 | 0.000000     |
| TJ       | 8.000000 | 0.000000     |
| TK       | 11.25000 | 0.000000     |





Questions?