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- We know the number of people living in each towns, and we can estimate from past data the average number of trips a person will do yearly to a disposal plant.
- We know the cost to build a plant at a particular location.
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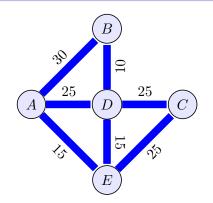
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# Map of County



Town	# People	Plant Cost
A	150,000	\$2,000,000
В	200,000	\$1,600,000
$\mathbf{C}$	160,000	\$1,200,000
D	80,000	\$4,000,000
$\mathbf{E}$	45,000	\$3,500,000

- Average number of trips a person makes to a plant in a year: n = 2
- Average cost of driving a mile: c = 0.2

### SETS:

• Set of locations (towns): L

### PARAMETERS

- Population:  $p\{L\}$  (person)
- Plant building cost:  $b\{L\}$  (\$)
- Trips: n (trips/person\*year)
- Unit cost of travel: c (\$/mile)
- $\bullet$  Time horizon: T (years)
- $\bullet$  Total personal cost of NOT RECYCLING at all: M (\$)

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#### **DECISION VARIABLES:**

• To build or not to build:  $x\{L\}$ , binary

$$x_{\ell} = \begin{cases} 1 & \text{if we build a plant} \\ 0 & \text{if we do not build a plant} \end{cases}$$
 at location  $\ell \in I$ 

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• Expected number of total trips to a recycling plant from town  $\ell \in L$ :

$$n*p[\ell]*T$$

• Expected total mileage cost for citizens of town  $\ell \in L$ :

$$n * p[\ell] * T * c$$

• Total miles of trips to a recycling plant from town  $\ell \in L$ :

$$\sum_{k \in L} d[\ell, k] * \left( x_k * \prod_{\substack{j \in L \\ d[\ell,j] < d[\ell,k]}} (1 - x_j) \right)$$

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# Model Objective

### INVESTMENT COST:

$$\sum_{\ell \in L} b[\ell] * x_{\ell}$$

LONG TERM SOCIAL COST for  $\ell \in L$ :

$$\left(n*p[\ell]*T)*c*\sum_{k\in L}d[\ell,k]*\left(x_k*\prod_{\substack{j\in L\\d[\ell,j]< d[\ell,k]}}(1-x_j)\right)$$

No distance ties here!

LONG TERM SOCIAL COST of NOT RECYCLING

$$M * \left(\sum_{\ell \in L} p[\ell]\right) * \prod_{\ell \in L} (1 - x_{\ell})$$

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# Unconstrained Nonlinear Binary Model

#### **OBJECTIVE FUNCTION:**

$$\begin{aligned} & \min & & \sum_{\ell \in L} b[\ell] * x_{\ell} \\ & & + \sum_{\ell \in L} (n * p[\ell] * T) * c * \sum_{k \in L} d[\ell, k] * \left( x_{k} * \prod_{\substack{j \in L \\ d[\ell, j] < d[\ell, k]}} (1 - x_{j}) \right) \\ & & + M * \left( \sum_{\ell \in L} p[\ell] \right) * \prod_{\ell \in L} (1 - x_{\ell}) \end{aligned}$$

CONSTRAINTS

$$x \in \{0, 1\}^L$$

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# Unconstrained Nonlinear Binary Model Simpl'r

#### **OBJECTIVE FUNCTION:**

$$\begin{aligned} & \min & & \sum_{\ell \in L} b[\ell] * x_{\ell} \\ & & + n * T * c * \sum_{\ell \in L} p[\ell] * \sum_{k \in L} d[\ell, k] * \left( x_{k} * \prod_{\substack{j \in L \\ d[\ell, j] < d[\ell, k]}} (1 - x_{j}) \right) \\ & & + M * \left( \sum_{\ell \in L} p[\ell] \right) * \prod_{\ell \in L} (1 - x_{\ell}) \end{aligned}$$

### CONSTRAINTS:

$$x \in \{0, 1\}^L$$

## Linearization

We introduce new binary variables in place of the nonlinear products of variables and their complements. Namely, we introduce

$$\begin{array}{lll} z_{k,\ell} &=& x_k * \prod_{\substack{j \in L \\ d[\ell,j] < d[\ell,k]}} (1-x_j) & \forall k,\ell \in L, \text{ and} \\ z_L &=& \prod_{\ell \in L} (1-x_\ell) \end{array}$$

## Standard Linearization

• For  $k, \ell \in L$  we have  $z_{k,\ell} = x_k * \prod_{\substack{j \in L \\ d[\ell,j] < d[\ell,k]}} (1-x_j)$  if and only if  $x \in \{0,1\}^L$  and the following inequalities hold

$$\begin{array}{ll} z_{k,\ell} & \leq x_k, \\ z_{k,\ell} & \leq 1 - x_j \qquad \forall j \in L \ s.t. \ d[\ell,j] < d[\ell,k], \\ z_{k,\ell} & \geq 0, \\ z_{k,\ell} & \geq x_k - \sum_{\substack{j \in L \\ d[\ell,i] < d[\ell,k]}} x_j. \end{array}$$

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# General Principle of Standard Linearization

- Both of the previous equivalences are special cases of a more general rule.
- Assume  $X_1, ..., X_m$  are binary variables,  $\bar{X}_j = 1 X_j$  for j = 1, ..., m, and that  $S \subseteq \{X_1, ..., X_m, \bar{X}_1, ..., \bar{X}_m\}$ .
- Then we have

$$Z = \prod_{u \in S} u$$

if and only if  $X \in \{0,1\}^m$ , and the following inequalities hold:

$$Z \leq u$$
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#### A MILP model of Uncapacitated Plant Location

$$\begin{aligned} & \min & & \sum_{\ell \in L} b[\ell] * x_{\ell} + n * T * c * \sum_{\ell \in L} p[\ell] * \sum_{k \in L} d[\ell, k] * z_{k,\ell} + M * \left( \sum_{\ell \in L} p[\ell] \right) * z_{L} \\ & z_{k,\ell} & \leq x_{k} & \forall k, \ell \in L, \\ & z_{k,\ell} & \leq 1 - x_{j} & \forall j, k, \ell \in L \ s.t. \ d[\ell, j] < d[\ell, k], \\ & z_{k,\ell} & \geq 0 & \forall k, \ell \in L, \\ & z_{k,\ell} & \geq x_{k} - \sum_{\substack{j \in L \\ d[\ell,j] < d[\ell,k]}} x_{j} & \forall k, \ell \in L, \\ & z_{L} & \leq 1 - x_{j} & \forall k, \ell \in L, \\ & z_{L} & \geq 0, \\ & z_{L} & \geq 1 - \sum_{j \in L} x_{j}, \\ & x_{\ell} & \in \{0,1\} & \forall \ell \in L. \end{aligned}$$

#### SIRS Survey

Perhaps I forgot to mention

# PLEASE fill out the SIRS survey!

I really appreciate your feedback ...

- Our main (primary) decision variables are  $x_{\ell}$ ,  $\ell \in L$ : "To build or not to build?"
- Implied (hidden) variables describe which plant is serving which community (remember: citizens are rational and travel to the nearest built plant).
- Introduce these hidden "decisions"  $y\{L, L\} \in \{0, 1\}^{L \times L}$ :

$$y_{k,\ell} = \begin{cases} 1 & \text{if citizens of township } \ell \text{ served by plant built at } k \\ 0 & \text{otherwise.} \end{cases}$$

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• Everybody is served (NO "DO NOTHING" OPTION!):

$$\sum_{k \in L} y_{k,\ell} = 1 \quad \forall \ \ell \in L.$$

$$x_k \geq y_{k,\ell} \quad \forall \ k, \ell \in L.$$

- How to model rationality of citizens in terms of these variables?
- RATIONALITY of service:

$$x_j \leq 1 - y_{k,\ell} \quad \forall \ j, k, \ell \in L \ s.t. \ d[\ell, j] < d[\ell, k]$$



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#### SIRS Survey

Did I mention that the SIRS survey is available? You can write anything you want about this course ...

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