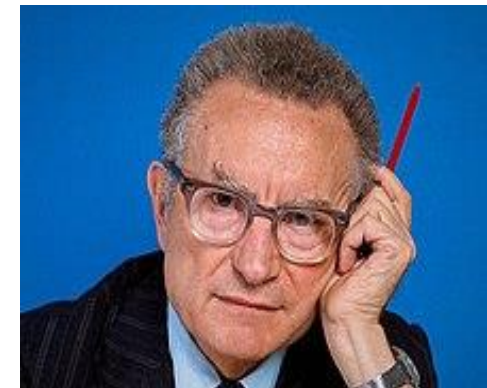
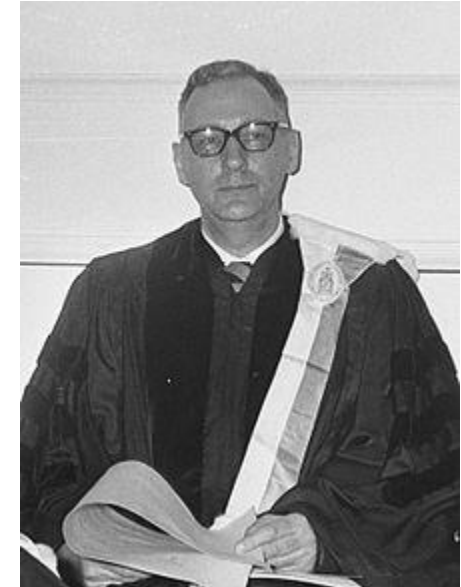


# Transportation model: an introduction in GAMS

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# Transportation Model

- There is a deep connection with economic theory.
- Economists call this model: *Koopmans-Hitchcock Model*.
  - Tjalle Koopmans received the 1975 Nobel price in economics (with Kantorovich).
- Model 1 in the GAMS model library is a version of the transportation model in the 1963 George Dantzig book (originally a RAND report).
- Paul Samuelson noticed the connection between the transportation LP problem and the concept of spatial equilibrium.
  - Samuelson won the Nobel price in 1970.



Samuelson, Paul A. "Spatial Price Equilibrium and Linear Programming." *The American Economic Review* 42, no. 3 (1952)

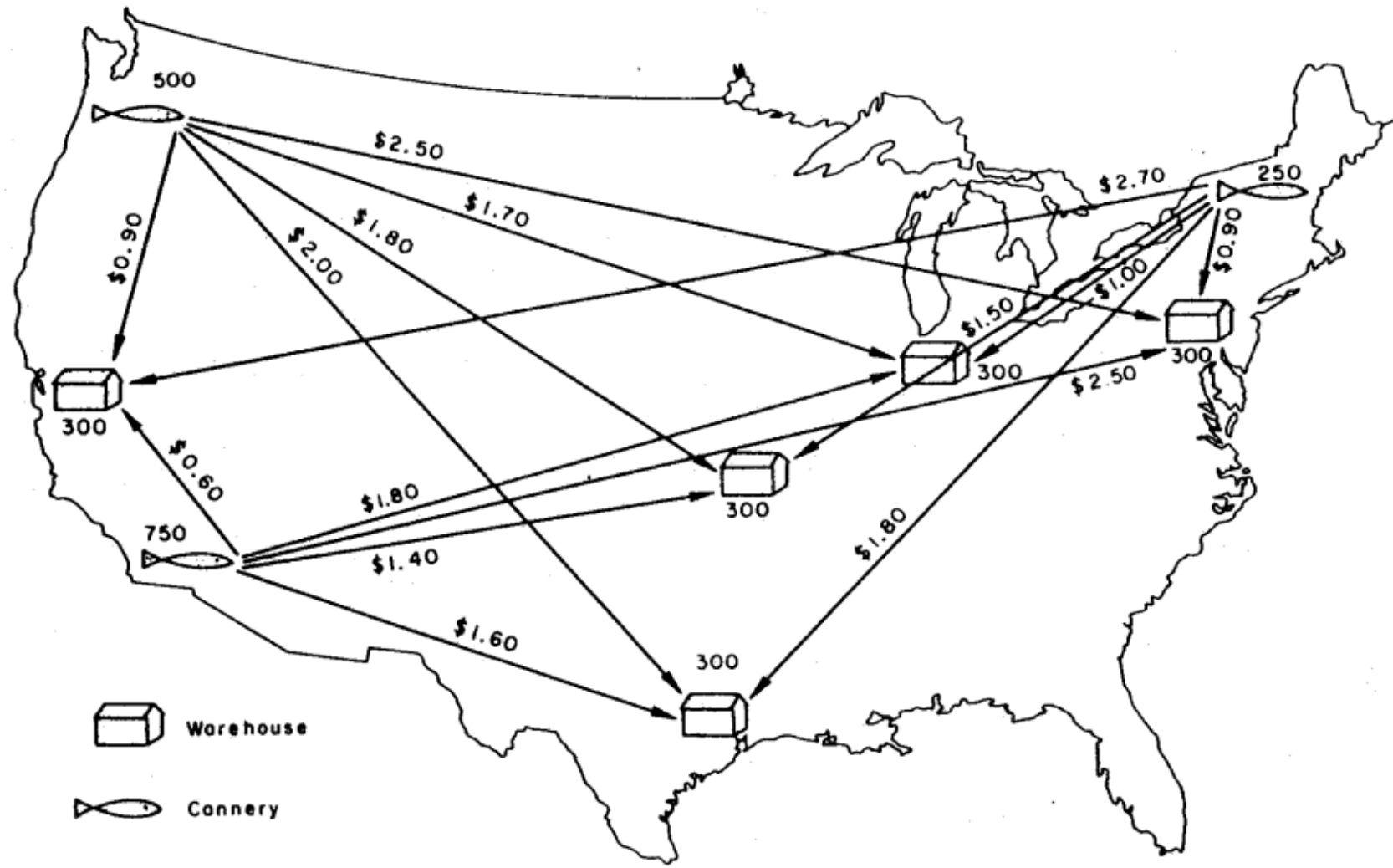


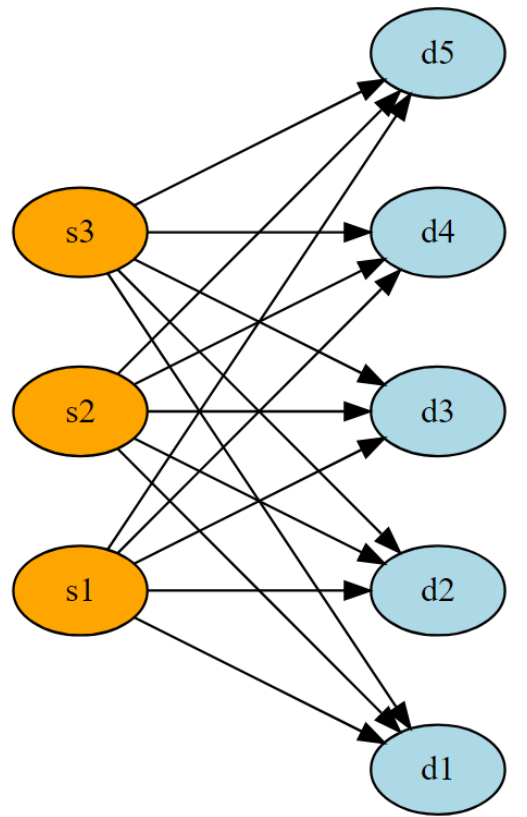
Figure 1-2-I. The Problem: Find a least cost plan of shipping from canneries to warehouses (the costs per case, availabilities and requirements are as indicated).

This picture is from the Dantzig book. The LP model is based on a smaller version discussed later in the book. The GAMS data is slightly different (maybe to make the solution degenerate).

George B. Dantzig

Linear  
Programming  
and Extensions

# Transportation model as network problem or LP.



Supply  
nodes

Demand  
nodes

$$\begin{aligned} \min \quad & \sum_{i,j} \text{cost}_{i,j} x_{i,j} \\ & \sum_i x_{i,j} \geq \text{demand}_j \quad \forall j \\ & \sum_j x_{i,j} \leq \text{supply}_i \quad \forall i \\ & x_{i,j} \geq 0 \end{aligned}$$

Network problems have the property that each variable occurs exactly twice in the constraint matrix.

## Model TRANSPORT from the model library, part 1

### Set

```
i 'canning plants' / seattle, san-diego /  
j 'markets' / new-york, chicago, topeka /;
```

Set elements are strings  
(limit: 63 chars)

### Parameter

```
a(i) 'capacity of plant i in cases'  
/ seattle 350  
san-diego 600 /
```

```
b(j) 'demand at market j in cases'  
/ new-york 325  
chicago 300  
topeka 275 /;
```

(1) Order not important  
(2) Domain checked  
(3) should use better names  
than a,b

Domain checking  
ensures  
referential  
integrity

Explanatory text is not  
ignored (like comments)

### Table d(i,j) 'distance in thousands of miles'

	new-york	chicago	topeka
seattle	2.5	1.7	1.8
san-diego	2.5	1.8	1.4;

Excel, CSV files are  
popular external  
data sources

**Scalar** f 'freight in dollars per case per thousand miles' / 90 /;

**Parameter** c(i,j) 'transport cost in thousands of dollars per case';

c(i,j) = f\*d(i,j)/1000;

Parallel  
assignment

Don't use loops

## Model TRANSPORT from the model library, part 2

### Variable

```
x(i,j) 'shipment quantities in cases'  
z      'total transportation costs in thousands of dollars';
```

Default: variables are free

**Positive Variable** x;

Blocks of variables

### Equation

```
cost      'define objective function'  
supply(i) 'observe supply limit at plant i'  
demand(j) 'satisfy demand at market j';
```

Blocks of equations

```
cost..      z =e= sum((i,j), c(i,j)*x(i,j));
```

```
supply(i).. sum(j, x(i,j)) =l= a(i);
```

```
demand(j).. sum(i, x(i,j)) =g= b(j);
```

A model is collection of equations

**Model** transport / all /;

GAMS uses an objective variable  
instead of an objection function  
Calls external solver

**solve** transport using lp minimizing z;

**display** x.l, x.m;

.L: level, .M: marginal

# Listing file has a lot of information

- Compilation output
  - Source listing
    - Useful to help with some syntax errors
- Execution time output
  - Output of DISPLAY statements
  - Output related to SOLVE statements
    - Model generation
      - Equation listing
        - Debug leads/lags
        - For non-linear models, Jacobian elements are shown
      - Column listing
        - Where does a variable appear?
      - Model statistics
        - Size of model
    - Solver messages
      - SOLVE SUMMARY
        - Always check if solver succeeded
        - Model and Solver status
    - Solution listing
      - LO,L,UP,M

Number of variables and equations. Don't forget that number of nonzero elements is also very important for sparse solvers!

Often users wonder about strange results without first checking the model and solver status

# Exercises

1. Run the model and study the listing file.
2. Make a typo in one of the labels (set elements), and see how GAMS reacts.
3. Change the demand in NY to 400:  
`b('new-york') = 400;`  
(note that an element must be quoted). What happens?
4. Add check:  
`abort$(totalDemand>totalSupply+0.0001) "Too much demand";`  
If we pass this check, the model should be feasible.
5. Change demand in NY back to 325.
6. Pure network models have **two non-zero elements in each column**. Check the column listing for variable x. To view more columns in the column listing, add  
`option limcol = 100;`  
to the model. Notes:
  - **the objective does not count**
  - the default value for limcol is 3
  - a solver will typically substitute out the objective variable, and create an objective function.



# LP, Marginals, Basis, EPS

- Marginals
  - **duals** for equations:
  - **reduced cost** for variables:
    - This is like a dual for  $x_i \geq \ell_i, x_i \leq u_i$
  - Indicates: how much can obj change when bound/rhs changes
  - A marginal with value EPS means: numerically zero but this row/column is non-basic
    - Nerdy: Dual degeneracy (i.e. we can have multiple solutions)
    - See optional slides at end of this deck

Special values in GAMS: EPS, INF, -INF, NA, UNDF

# Duals: how much can obj change

- Duals (marginal) of an equation indicates how much an objective can change when the rhs is increased.

---- EQU demand satisfy demand at market j

	LOWER	LEVEL	UPPER	MARGINAL
new-york	325.0000	325.0000	+INF	0.2250
chicago	300.0000	300.0000	+INF	0.1530
topeka	275.0000	275.0000	+INF	0.1260

- Let's increase the demand in NY by 1. The obj can change by 0.225:

---- 118 PARAMETER dualcheck increase demand of NYC by one unit

	demand	dual	obj
before	325.000	0.225	153.675
after	326.000		153.900
diff	1.000		0.225

I.e. our marginal cost is 0.225.  
So we would want to charge  
NY at least 0.225 to meet this  
extra demand.

# Duals: how much can obj change (cont'd)

```
parameter dualcheck(*,*) 'increase demand of NYC by one unit';
```

```
solve transport using lp minimizing z;
```

```
dualcheck('before','demand') = b('new-york');
```

```
dualcheck('before','dual') = demand.m('new-york');
```

```
dualcheck('before','obj') = z.l;
```

```
b('new-york') = b('new-york') + 1;
```

```
solve transport using lp minimizing z;
```

```
dualcheck('after','demand') = b('new-york');
```

```
dualcheck('after','obj') = z.l;
```

```
dualcheck('diff','demand') = b('new-york') - dualcheck('before','demand');
```

```
dualcheck('diff','obj') = z.l - dualcheck('before','obj');
```

```
display dualcheck;
```

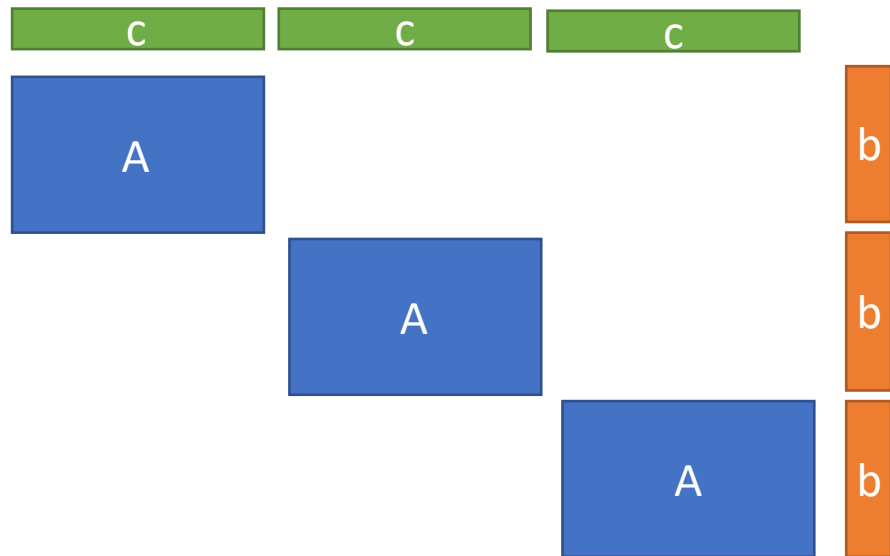
Output is on previous slide

# Exercises

- What happens if we increase the demand in NY by 10 or 100.
- Add  
`abort$(transport.modelstat <> %modelstat.optimal%) "Model was not solved to optimality";`  
to alert about problems.
- Using the original NY demand of 325, would it make sense to increase capacity somewhere? (hint: look at the duals)

# Exercise

- Make problem large by duplication
- Without inventing new data we can form:
- This can be viewed as a block-diagonal structure:



$$\begin{aligned} \min \quad & \sum_{i,j,k} \text{cost}_{i,j} x_{i,j,k} \\ & \sum_i x_{i,j,k} \geq \text{demand}_j \quad \forall j,k \\ & \sum_j x_{i,j,k} \leq \text{supply}_i \quad \forall i,k \\ & x_{i,j,k} \geq 0 \end{aligned}$$

**set** k /k1\*k10/;

Try with 10, 100, 1000. These LPs should solve very fast

Adding an index to a symbol happens a lot in practical modeling (for many reasons)

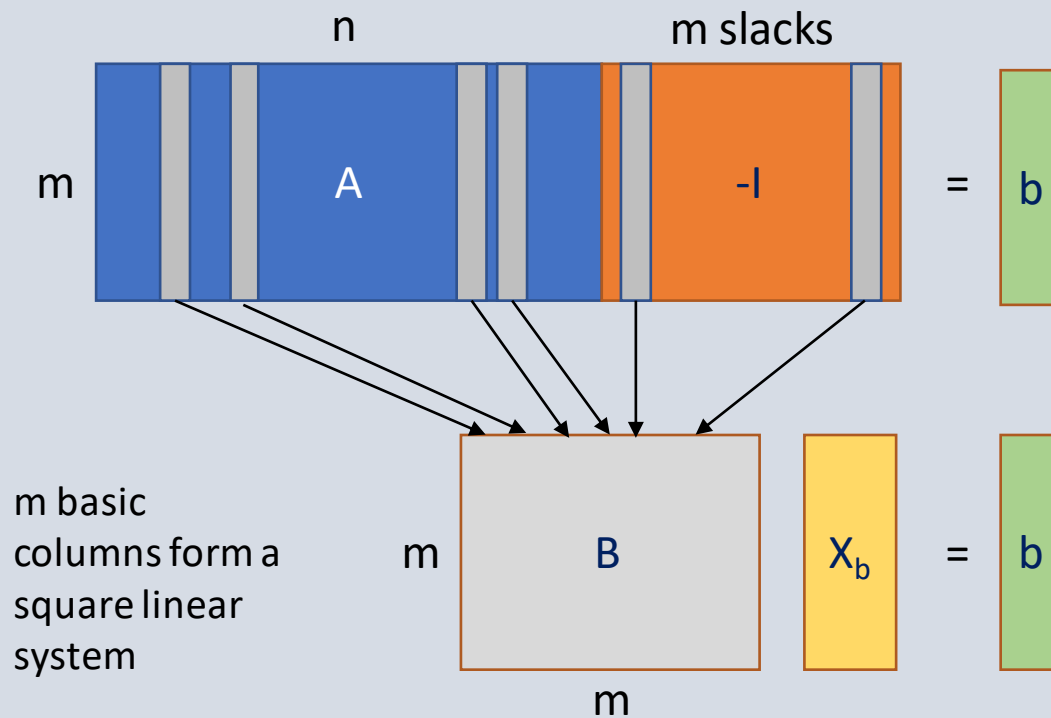
Optional

# What is a basis?

Let  $m$  be the number of equations and  $n$  be the number of variables in our LP model.

In each Simplex iteration,  $n$  columns are temporarily fixed to one of their bounds. The remaining  $m$  columns form a square system which can be solved using linear algebra.

We say: there are  $m$  rows/columns that are **basic** and  $n$  rows/columns that are **non-basic**.



The  $m$  **basic** rows/columns have a value between their bounds and have a zero marginal (dual or reduced cost).

The  $n$  **non-basic** rows/columns are at one of the bounds and have a non-zero or EPS marginal.(\*)

Exercise (use the listing file):

1. What is  $m, n$  in our transportation model?
2. Count the number of basic and non-basic rows/columns.
3. Check that non-basic rows/columns are at their bound.

\* There is also something called superbasic. This is non-basic but between bounds. This is beyond our scope.

Optional

LOWER

LEVEL

UPPER

MARGINAL

Basis status (concluded from marginal)

---- EQU cost

.

.

.

1.0000

NON-BASIC AT LOWERBOUND

cost define objective function

---- EQU supply observe supply limit at plant i

	LOWER	LEVEL	UPPER	MARGINAL	
seattle	-INF	350.0000	350.0000	EPS	NON-BASIC AT UPPERBOUND
san-diego	-INF	550.0000	600.0000	.	BASIC

---- EQU demand satisfy demand at market j

	LOWER	LEVEL	UPPER	MARGINAL	
new-york	325.0000	325.0000	+INF	0.2250	NON-BASIC AT LOWERBOUND
chicago	300.0000	300.0000	+INF	0.1530	NON-BASIC AT LOWERBOUND
topeka	275.0000	275.0000	+INF	0.1260	NON-BASIC AT LOWERBOUND

---- VAR x shipment quantities in cases

	LOWER	LEVEL	UPPER	MARGINAL	
seattle .new-york	.	50.0000	+INF	.	BASIC
seattle .chicago	.	300.0000	+INF	.	BASIC
seattle .topeka	.	.	+INF	0.0360	NON-BASIC AT LOWERBOUND
san-diego.new-york	.	275.0000	+INF	.	BASIC
san-diego.chicago	.	.	+INF	0.0090	NON-BASIC AT LOWERBOUND
san-diego.topeka	.	275.0000	+INF	.	BASIC

	LOWER	LEVEL	UPPER	MARGINAL	
---- VAR z	-INF	153.6750	+INF	.	BASIC

m=6 (equs)  
n=7 (vars)

Basics: 6  
Non-Basics: 7

# Recognize an optimal LP solution

- The **optimality conditions** for an LP can be summarized as:
  - The solution must be feasible
  - The signs of the marginals must be:

Level	Minimization	Maximization
At Lower	$\geq 0$	$\leq 0$
At Upper	$\leq 0$	$\geq 0$

- If non-optimal GAMS will flag this:

```

---- VAR x  shipment quantities in cases
                                LOWER      LEVEL      UPPER      MARGINAL
seattle .new-york               .           .      +INF      -0.0360  NOPT
seattle .chicago               .      300.0000  +INF           .
seattle .topeka                 .       50.0000  +INF           .
san-diego.new-york              .      325.0000  +INF           .
san-diego.chicago              .           .      +INF      0.0450
san-diego.topeka                .      225.0000  +INF           .

```



# EPS in solution

- A marginal=EPS means:
  - Numerically zero but non-basic
  - This means **dual degeneracy** (multiple optimal bases)
  - Note that different bases may only differ in marginals
    - All levels may stay the same
  - There is also something called **primal degeneracy**
    - This means: a basic variable is at its bound

# Dual model

Primal

$$\begin{aligned}
 \min \quad & \sum_{i,j} \text{cost}_{i,j} x_{i,j} \\
 & \sum_j x_{i,j} \leq \text{supply}_i \perp u_i \leq 0 \quad \forall i \\
 & \sum_i x_{i,j} \geq \text{demand}_j \perp v_j \geq 0 \quad \forall j \\
 & x_{i,j} \geq 0
 \end{aligned}$$

Dual

$$\begin{aligned}
 \max \quad & \sum_i \text{supply}_i \cdot u_i + \sum_j \text{demand}_j \cdot v_j \\
 & u_i + v_j \leq \text{cost}_{i,j} \perp x_{i,j} \geq 0 \quad \forall i, j \\
 & u_i \leq 0, v_j \geq 0
 \end{aligned}$$

- $\perp$  means “with dual:”
- The signs on the duals are the optimality conditions
- Slight complication: transport has no unique optimal solution.

## Exercise

1. Implement the dual model.
2. Compare results from primal.

# Compare Results

Primal Model	Dual Model
VARIABLE <b>z.L</b> = 153.675	VARIABLE <b>z</b> <b>dual.L</b> = 153.675
---- 173 VARIABLE <b>x.L</b> <i>shipment quantities in cases</i>	---- 173 EQUATION <b>e.M</b> <i>dual constraint</i>
new-york      chicago      topeka	new-york      chicago      topeka
seattle      50.000      300.000	seattle      50.000      300.000
san-diego      275.000      275.000	san-diego      275.000      275.000
---- 173 EQUATION <b>supply.M</b> <i>observe supply limit at plant i</i>	---- 173 VARIABLE <b>u.L</b> <i>dual of supply</i>
seattle EPS	( ALL 0.000 )
---- 173 EQUATION <b>demand.M</b> <i>satisfy demand at market j</i>	---- 173 VARIABLE <b>v.L</b> <i>dual of demand</i>
new-york 0.225,      chicago 0.153,      topeka 0.126	new-york 0.225,      chicago 0.153,      topeka 0.126