

## Example

Consider a transportation problem in which some of the demands are random variables:

		DESTINATIONS				supply
		1	2	3	4	
SOURCES	1	2	3	11	7	6
	2	1	1	6	1	1
	3	5	8	15	9	10
demand		7	5	$D_3$	$D_4$	

The demands at destinations #3 & 4 are *random* with known probability distributions:

d	$P\{D_3=d\}$
1	$\frac{1}{3}$
3	$\frac{1}{3}$
5	$\frac{1}{3}$

d	$P\{D_4=d\}$
0	$\frac{1}{4}$
4	$\frac{3}{4}$

Shipments  $X_{ij}$  must be selected *before* the values of  $D_3$  and  $D_4$  are known!

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If, after making the shipments, the demand is different from the quantity shipped, we must act so as to compensate for the difference:

- if demand exceeds amount shipped, the amount short must be obtained at high cost (e.g., by purchasing locally, or shipment by air, etc.)
- if demand is less than amount shipped, the excess must be stored, sold at a loss, or otherwise disposed of.

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In this case, assume penalties of \$9 and \$3 per unit short at destinations #3 and 4, respectively, but no cost incurred by excess supplies.

*We wish to minimize the sum of the*

- *shipping costs*
- *expected shortage penalties*

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d	$P\{D_3=d\}$
1	$\frac{1}{3}$
3	$\frac{1}{3}$
5	$\frac{1}{3}$

d	$P\{D_4=d\}$
0	$\frac{1}{4}$
4	$\frac{3}{4}$

Six possible outcomes:

k	1	2	3	4	5	6
$D_3^k$	1	3	5	1	3	5
$D_4^k$	0	0	0	4	4	4
$p^k$	$\frac{1}{12}$	$\frac{1}{12}$	$\frac{1}{12}$	$\frac{1}{4}$	$\frac{1}{4}$	$\frac{1}{4}$

*Joint probabilities assume demands are independent random variables!*

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*Define:*

"First-stage variables"

$X_{ij}$  = quantity shipped from source  $i$  to destination  $j$

"Second-stage variables"

$Y_j^{k+}$  = surplus at destination  $j$  if outcome  $k$  occurs  
*i.e., amount to be disposed of.*

$Y_j^{k-}$  = shortage at destination  $j$  if outcome  $k$  occurs  
*i.e., amount to be purchased locally.*

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### Equivalent Deterministic LP Model

$$\begin{aligned}
 &\text{Minimize } \sum_{i=1}^3 \sum_{j=1}^4 C_{ij} X_{ij} + \sum_{k=1}^6 \sum_{j=3}^4 P^k E_j Y_j^{k-} \\
 &\text{subject to } \sum_{j=1}^4 X_{ij} \leq S_i, \quad i=1, 2, 3 \\
 &\quad \sum_{i=1}^3 X_{ij} \geq D_j, \quad j=1 \text{ \& } 2 \\
 &\quad \sum_{i=1}^3 X_{ij} + Y_j^{k-} - Y_j^{k+} = D_j^k, \quad j=3 \text{ \& } 4, k=1, \dots, 6 \\
 &\quad X_{ij} \geq 0, Y_j^{k+} \geq 0, Y_j^{k-} \geq 0
 \end{aligned}$$

penalty/unit  
shortage

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Size of the LP

Variables: 12 X's  
               24 Y's  


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 36 total

Constraints: 17

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$X_{1j}$				$X_{2j}$				$X_{3j}$				$Y_j^{1\pm}$		$Y_j^{2\pm}$		$Y_j^{3\pm}$		$Y_j^{4\pm}$		$Y_j^{5\pm}$		$Y_j^{6\pm}$															
j=1	2	3	4	1	2	3	4	1	2	3	4	j=3	-	+	-	+	j=3	-	+	-	+	j=3	-	+	-	+	j=3	-	+	-	+	j=3	-	+	-	+	
1	1	1	1	1																							6										
2					1	1	1	1																			1										
3									1	1	1	1															10										
4	1				1				1																		7										
5		1				1				1																	5										
6			1				1				1		1	-1													1										
7				1				1				1			1	-1											0										
8					1				1						1	-1											3										
9						1				1						1	-1										0										
10							1				1						1	-1									5										
11								1				1						1	-1								0										
12									1										1	-1							1										
13										1										1	-1						4										
14											1										1	-1					3										
15												1										1	-1				4										
16																									1	-1	5										
17																										1	-1	4									

Constraint

Coefficient Matrix

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The Coefficient Matrix of the constraints is not a node-arc incidence matrix, but does contain only  $\pm 1$  & 0.

*Can we manipulate the rows to obtain a node-arc incidence matrix, with each column containing a  $\pm 1$  pair?*

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Perform the following row operations in the sequence indicated:

$R_{17} \leftarrow R_{17} - R_{15}$  , i.e., subtract row 15 from row 17  
 $R_{16} \leftarrow R_{16} - R_{14}$  , i.e., subtract row 14 from row 16,  
 $R_{15} \leftarrow R_{15} - R_{13}$  , i.e., subtract row 13 from row 15,  
*etc.*

$$R_i \leftarrow R_i - R_{i-2} , i=17, 16, 15, 14, \dots 8$$

Next, negate all but Rows 1, 2, & 3.

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	$X_{1j}$				$X_{2j}$				$X_{3j}$				$Y_j^{1\pm}$		$Y_j^{2\pm}$		$Y_j^{3\pm}$		$Y_j^{4\pm}$		$Y_j^{5\pm}$		$Y_j^{6\pm}$				
j=	1	2	3	4	1	2	3	4	1	2	3	4	-	+	-	+	-	+	-	+	-	+	-	+	-	+	
1	1	1	1	1																					$\leq$	6	
2					1	1	1	1																	$\leq$	1	
3									1	1	1	1													$\leq$	10	
4	-1				-1				-1																$=$	-7	
5		-1				-1				-1															$=$	-5	
6			-1				-1				-1		-1	+											$=$	-1	
7				-1				-1				-1		-1	+										$=$	0	
8													+1	-1		-1	+								$=$	-2	
9															+1	-1		-1	+						$=$	0	
10																	+1	-1		-1	+				$=$	-2	
11																			+1	-1		-1	+		$=$	0	
12																			+1	-1		-1	+		$=$	4	
13																					+1	-1		-1	+	$=$	-4
14																					+1	-1		-1	+	$=$	-2
15																							+1	-1		$=$	0
16																								+1	-1	$=$	-2
17																										$=$	0

...almost a node-arc

incidence matrix!

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We next change rows 1, 2, & 3 to equations by adding slack variables.

Each column now contains one  $\pm 1$  pair except for the last seven (the three slack variables added to rows 1 to 3, together with the Y variables for the last (sixth) outcome). These seven columns each contain either a +1 or a -1 only.

The transformation to a node-arc incidence matrix may now be completed by appending a new (redundant) row, obtained by negating the sum of Rows #1 through #17.

*Columns already having a  $\pm 1$  pair will have a sum of zero, while columns having only a  $+1$  or a  $-1$  will have the pair completed.*

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$X_{1j}$				$X_{2j}$				$X_{3j}$				$Y_j^{1\pm}$		$Y_j^{2\pm}$		$Y_j^{3\pm}$		$Y_j^{4\pm}$		$Y_j^{5\pm}$											
j=1	2	3	4	1	2	3	4	1	2	3	4	j=3	-	+	j=3	-	+	j=3	-	+	j=3	-	+	j=3	-	+	j=3	-	+		
1	1	1	1	1																											
2					1	1	1	1																							
3									1	1	1	1																			
4	-1				-1				-1																						
5		-1				-1				-1																					
6			-1				-1				-1		-1	+																	
7				-1				-1				-1		-1	+																
8												+1	-1		-1	+															
9														+1	-1																
10																+1	-1		-1	+											
11																		+1	-1		-1	+									
12																				+1	-1		-1	+							
13																						+1	-1		-1	+					
14																							+1	-1		-1	+				
15																									+1	-1		-1	+		
16																										+1	-1		-1	+	
17																											+1	-1		-1	+
18																														-1	+

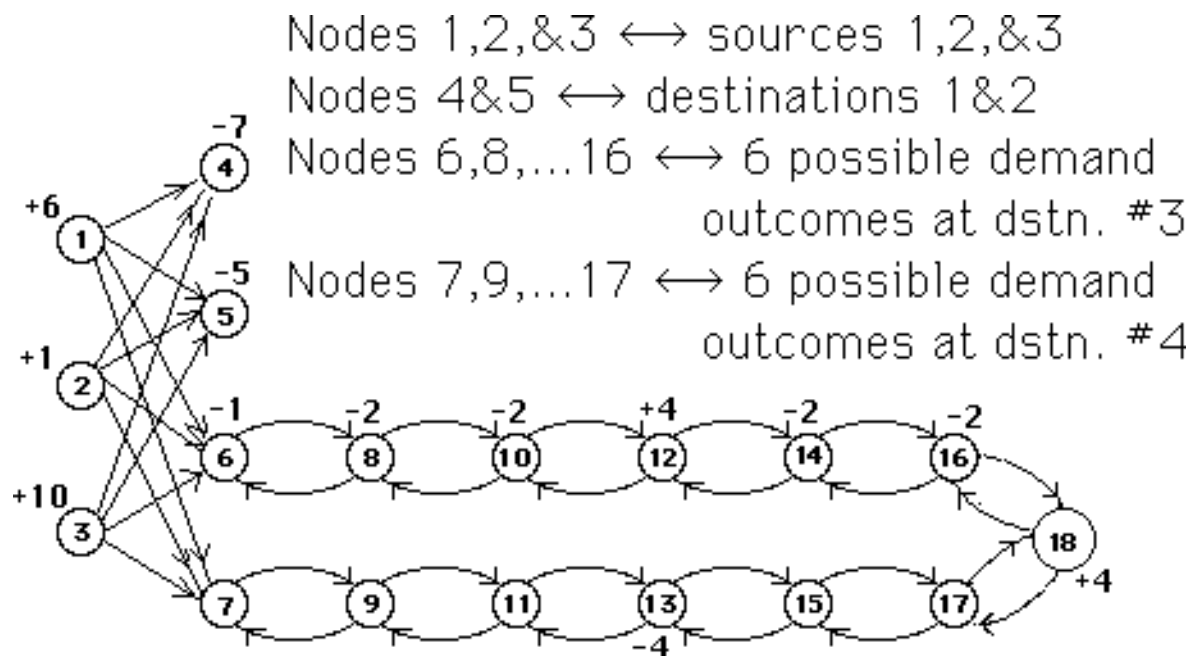
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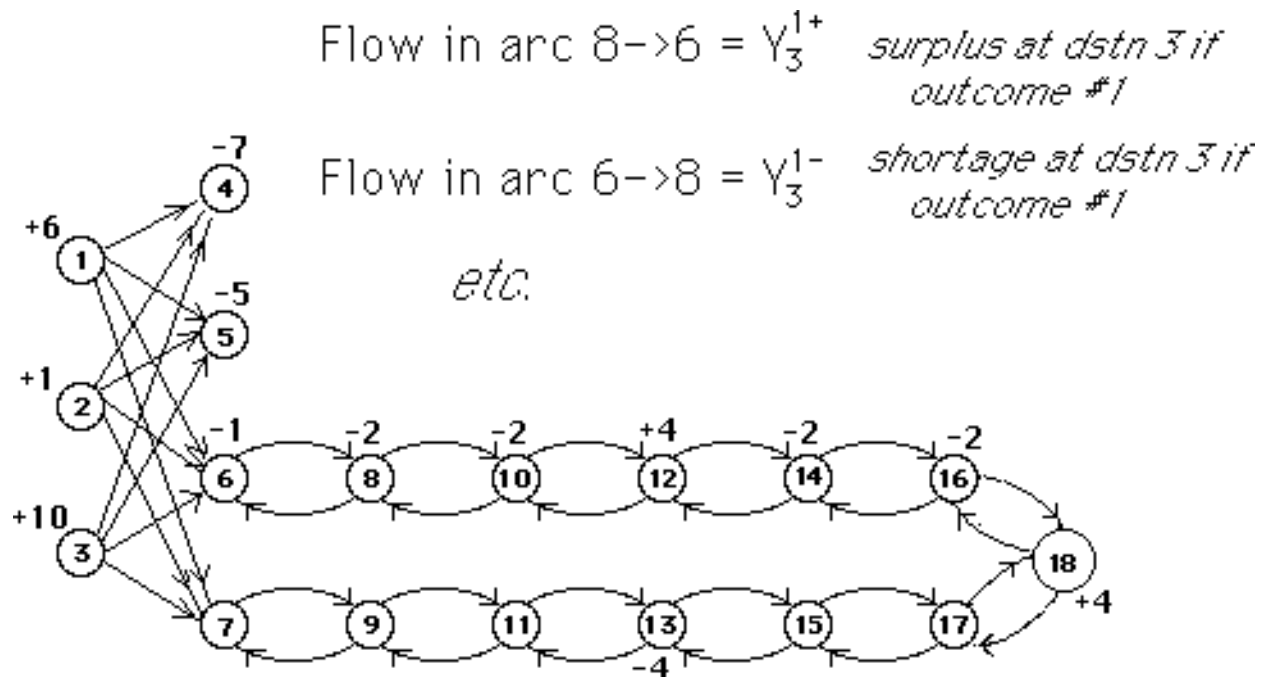
row #	$y_j^{6\pm}$				$S_1$	$S_2$	$S_3$	
	$j=3$	$j=4$	$j=5$	$j=6$				
1					1			6
2						1		1
3							1	10
4								-7
5								-5
6								-1
7								0
8								-2
9								0
10								-2
11								0
12								4
13								-4
14								-2
15								0
16	-1	1						-2
17		-1	1					0
18	+1	-1	+1	-1	-1	-1	-1	4

*Let's now draw the network, with a node for each row, an arc for each column*

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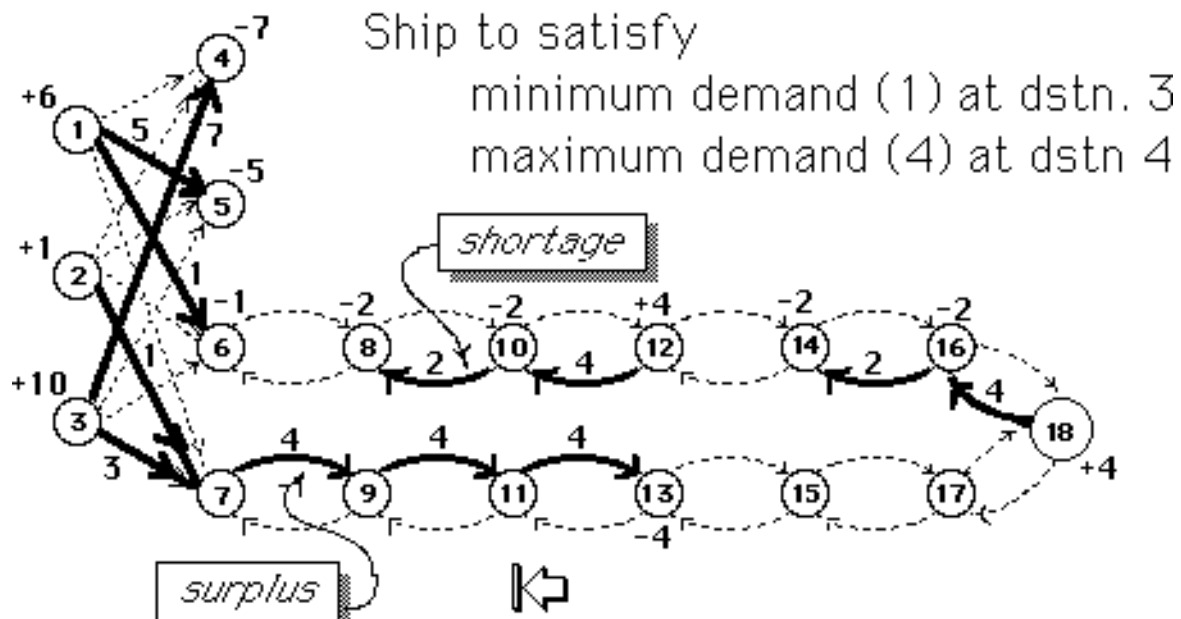


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## Optimal Solution



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