

Logistics Systems Design: Supply Chain Models

7. Continuous Point Location
8. Discrete Point Location
9. Supply Chain Models
10. Facilities Design
11. Computer Aided Layout
12. Layout Models

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Supply Chain Models Overview

- * Introduction
- * Channel Selection Models
- * Single Country (Domestic) Models
- * Global Models
- * Robustness and Flexibility Models

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Current Algorithms Hierarchy: Benchmarking

- * Evaluate or benchmark
 - Digital simulation or spreadsheet
- * Distribution channel selection
 - Current facilities and capacities
 - Select best channel and inventory levels
 - Spreadsheet or custom programming

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Current Algorithms Hierarchy: Network Optimization

- * Network optimization
 - Current facilities and capacities
 - Optimize the product flow
 - Linear programming solver

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Current Algorithms Hierarchy: Location-Allocation

- * *Moving facilities*
 - *Current facility status*
 - *No site-dependent costs*
 - *Costs proportional to flow*
 - *Limited location resolution*
 - *Alternative generating algorithm*
- * *Approximate algorithms*
 - *Non-linear optimization, specialized heuristics*

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Current Algorithms Hierarchy: Supply Chain Models

- * *Supply chain*
 - *Everything is allowed to change*
 - *Alternative selecting*
 - *Site dependent costs*
 - *Mixed integer programming solver*

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Supply Chain Modeling Characteristics

- * *Many different approaches exist*
 - *Philosophically different*
 - *Tradeoff between effort and accuracy*
- * *Tradeoff between accuracy and simplicity*
 - *Data*
 - *Computational solution effort*
 - *Solution validation and interpretation*
- * *Validation of computer results a must*

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Distribution Channel Selection

- * Given supply chain configuration
 - No fixed facility costs
- * For each commodity
 - Determine transportation channel
 - Determine cycle and safety inventory

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Transportation Mode Selection Computations

$$PC_p = D_p \cdot pc_p$$

$$TC_{mp} = D_p \cdot tc_{mp}$$

$$PIC_{mp} = D_p \cdot v_p \cdot TT_m \cdot HCF = D_p \cdot pic_{mp}$$

$$OCIC_{imp} = (TB_{mp}/2) \cdot v_p \cdot HCF$$

$$DCIC_{imp} = (TB_{mp}/2) \cdot (v_p + tc_{mp} + pic_{mp}) \cdot HCF$$

$$SI_{mp} = k \sqrt{LT_{mp} CV_{mp}^2 + Var_{LT} d_p}$$

$$SIC_{mp} = SI_{mp} \cdot (v_p + tc_{mp} + pic_{mp}) \cdot HCF$$

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Transportation Mode Selection Total Cost Computations

$$FSC_{jmp} = [TB_{mp} + SI_{mp}] \cdot sc_p$$

$$TIC_p = PC_p$$

$$TVC_{mp} = TC_{mp} + PIC_{mp} +$$

$$OCIC_{imp} + DCIC_{imp} + SIC_{imp}$$

$$TFC_{mp} = FSC_{jmp}$$

$$TAC_{mp} = TIC_p + TVC_{mp} + TFC_{mp}$$

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Channel Selection Calculations: Ballou Example

Annual Demand	700000			
Annual Holding Cost Rate	0.3			
Unit Production Cost	\$30.00			
Unit Annualized Warehouse Cost	\$0.00			
	Rail	Piggyback	Truck	Air
Unit Transportation Cost (\$)	0.1	0.15	0.2	1.4
Channel Transit Time (days)	21	14	5	2
Transportation Batch Size	70000	35000	35000	17500
	Rail	Piggyback	Truck	Air
Production Cost	\$21,000,000	\$21,000,000	\$21,000,000	\$21,000,000
Total Invariant Costs	\$21,000,000	\$21,000,000	\$21,000,000	\$21,000,000
Transportation Costs	\$70,000	\$105,000	\$140,000	\$980,000
In-Transit Inventory	\$362,466	\$241,644	\$86,301	\$34,521
Order Frequency per Year	10	20	40	
Order Cycle Length in Years	0.1	0.05	0.05	0.025
Plant Max Cycle Inventory	70,000	35,000	35,000	17,500
Plant Cycle Inventory Costs	\$315,000	\$157,500	\$157,500	\$78,750
Plant Safety Inventory	65,000	29,000	24,500	11,250
Plant Safety Inventory Costs	\$585,000	\$261,000	\$220,500	\$101,250
Unit Value at DC	\$30.62	\$30.50	\$30.32	\$31.45
DC Max Cycle Inventory	70,000	35,000	35,000	17,500
DC Cycle Inventory Costs	\$321,487	\$160,100	\$159,197	\$82,554
DC Safety Inventory	65,000	29,000	24,500	11,250
DC Safety Inventory Costs	\$697,047	\$265,308	\$222,876	\$106,141
DC Maximum Inventory	135,000	64,000	69,500	28,750
Total Marginal Costs	\$2,251,000	\$1,190,552	\$986,375	\$1,383,216
Annualized Warehouse Costs	\$0	\$0	\$0	\$0
Total Variant Costs	\$2,251,000	\$1,190,552	\$986,375	\$1,383,216
Total Cost	\$23,251,000	\$22,190,552	\$21,986,375	\$22,383,216

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- * **Single Country (Domestic) Models**
- * Global Models
- * Robustness and Flexibility Models

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Single Country Supply Chains: Models and Solution Algorithms

- * Kuehn and Hamburger
 - Drop \tilde{n} add - swap heuristic
- * Geoffrion and Graves
 - Benders' decomposition
- * Goetschalckx and Wei
 - Disaggregated MIP formulation with branch and bound with LP relaxation

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Kuehn and Hamburger Characteristics

- * Multicommodity (as an extension)
- * Zero echelon
- * Uncapacitated depots
- * Depot handling cost (as an extension)
- * Deterministic
- * Single period

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Kuehn and Hamburger Characteristics Continued

- * Equivalent path or arc formulation (one echelon)
- * No customer single sourcing
- * Weak formulation

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Kuehn and Hamburger Model

$$\begin{aligned} \min \quad & z = \sum_{j=1}^N \left(f_j y_j + \sum_{i=1}^M c_{ij} x_{ij} \right) \\ \text{s.t.} \quad & \sum_{j=1}^N x_{ij} = 1 \quad \forall i \\ & \sum_{i=1}^M x_{ij} - M y_j \leq 0 \quad \forall j \\ & y_j \in \{0,1\}, x_{ij} \geq 0 \end{aligned}$$

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Kuehn and Hamburger Formulation Characteristics

- * Fixed facility cost (f) and variable transportation cost (c)
- * Flow (x) modeled as fraction of total customer demand
- * Uncapacitated
- * Two type of constraints
 - Demand satisfaction
 - Linkage or consistency

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Site Relative Cost

- * u_i = current best cost for servicing customer i
- * ρ_j = relative cost for opening warehouse j

$$\rho_j(\mathbf{U}) = f_j + \sum_{i=1}^M \min\{0, c_{ij} - u_i\}$$

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Drop-Add-Swap Heuristic

- * Drop
 - ī Start with all facilities open
 - ī Close the one with the largest relative site cost
 - ī Until no further decrease in costs
- * Add
 - ī Start with all facilities closed
 - ī Open the one with the most negative relative site cost
 - ī Until no further decrease in costs

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Drop-Add-Swap Heuristic

* Swap

- i Start with drop
- i Swap (open and close) the two facilities with the most extreme relative site cost
- i Until not further cost reduction

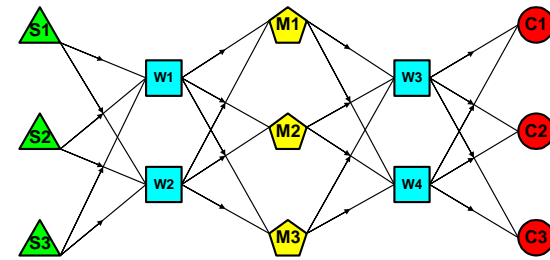
Kuehn and Hamburger, (1963), i A Heuristic Program for Locating Warehouses, i Management Science, Vol. 9, pp. 643-666.

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Supply Chain Example: Schematic



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Supply Chain Example: Transportation Data

Microsoft Excel - Supply Chain Design Example.xls											
Cost Data											
Transportation Step 1 (Supplier-Warehouse)						Transportation Step 3 (Manufacturing-Warehousing)					
P1	W1	W2				P1	W3	W4			
S1	1	2				M1	2	1			
S2	2	3				M2	3	2			
S3	1	1				M3	2	3			
P2	W1	W2				P2	W3	W4			
S1	3	2				M1	1	2			
S2	4	2				M2	2	1			
S3	2	1				M3	3	4			
Transportation Step 2 (Warehouse-Manufacturing)						Transportation Step 4 (Warehouse-Customer)					
P1	M1	M2	M3			P1	C1	C2	C3		
W1	2	1	1			W3	2	3	2		
W2	3	2	1			W4	1	2	3		
P2	M1	M2	M3			P2	C1	C2	C3		
W1	1	3	2			W3	1	2	3		
W2	1	2	3			W4	2	1	4		

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Supply Chain Example: Capacity and Facility Data

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Capacities						Customer Demands					
Supplier Capacity											
S1	300					P1	100	75	25		
S2	400					P2	100	100	40		
S3	200										
Warehousing Capacity (Throughput)						Facility Costs					
W1	300					S1	100				
W2	350					S2	200				
W3	300					S3	300				
W4	350					W1	50				
						W2	80				
Manufacturing						M1	250				
M1	500					M2	200				
M2	400					M3	50				
M3	300					W3	50				
						W4	80				

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Supply Chain Example: Model Purchasing Flows

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Transportation															
Transportation Step 1 (Supplier-Warehouse)										Objective					
Cost	Flow														
P1	W1	W2	P1	W1	W2	Sum	P1	W1	W2	Sum					
S1	1	2	S1	0	0	0	S1	0	0	0					
S2	2	3	S2	0	0	0	S2	0	0	0					
S3	1	1	S3	0	0	0	S3	0	0	0					
Sum			Sum	0	0	0	Sum	0	0	0					
P2	W1	W2	P2	W1	W2	Sum	P2	W1	W2	Sum					
S1	3	2	S1	0	0	0	S1	0	0	0					
S2	4	2	S2	0	0	0	S2	0	0	0					
S3	2	1	S3	0	0	0	S3	0	0	0					
Sum			Sum	0	0	0	Sum	0	0	0					
Total			Total	0	0	0	Total Cost TS1	0							

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Supply Chain Example: Model Distribution Flows

Microsoft Excel - Supply Chain Design Example.xls

Transportation Step 3 (Manufacturing-Warehouse)															
Flow										Objective					
Cost	Flow														
P1	W3	W4	P1	W3	W4	Sum	P1	W3	W4	Sum					
M1	2	1	M1	0	0	0	M1	0	0	0					
M2	3	2	M2	0	0	0	M2	0	0	0					
M3	2	3	M3	0	0	0	M3	0	0	0					
Sum			Sum	0	0	0	Sum	0	0	0					
P2	W3	W4	P2	W3	W4	Sum	P2	W3	W4	Sum					
M1	1	2	M1	0	0	0	M1	0	0	0					
M2	2	1	M2	0	0	0	M2	0	0	0					
M3	3	4	M3	0	0	0	M3	0	0	0					
Sum			Sum	0	0	0	Sum	0	0	0					
Total			Total	0	0	0	Total Cost TS3	0							

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Supply Chain Example: Model Capacity and Facility Costs

Microsoft Excel - Supply Chain Design Example.xls

Conservation of Flow															
Facility										Facility					
In	Out	In	Out	In	Out	In	Out	In	Out						
P1	0	P2	0	All	0	Facility	0	Facility	0						
S1	0	S1	0	S1	0	S1	0	S1	0						
S2	0	S2	0	S2	0	S2	0	S2	0						
S3	0	S3	0	S3	0	S3	0	S3	0						
W1	0	W1	0	W1	0	W1	0	W1	0						
W2	0	W2	0	W2	0	W2	0	W2	0						
M1	0	M1	0	M1	0	M1	0	M1	0						
M2	0	M2	0	M2	0	M2	0	M2	0						
M3	0	M3	0	M3	0	M3	0	M3	0						
W3	0	W3	0	W3	0	W3	0	W3	0						
W4	0	W4	0	W4	0	W4	0	W4	0						
C1	100	C1	100	C1	0	200									
C2	75	C2	100	C2	0	175									
C3	25	C3	40	C3	0	65									

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Supply Chain Example: Model Excel Solver

Solver Parameters

Set Target Cell:

Equal To: ☐ Max ☒ Min ☐ Value of:

By Changing Variable Cells:

Subject to the Constraints:

-
-
-
-

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*Supply Chain Example:
Solution Flows (Purchasing)*

Microsoft Excel - Supply Chain Design Examples																	File
File Edit View Insert Format Tools Data Window Help																	
	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O	P	
1	Transportation																
2																	
3	Transportation Step 1 (Supplier-Warehouse)																
4	Cost				Flow				Objective								
5	P1	W1	W2	P1	W1	W2	Sum	P1	W1	W2	Sum						
6	S1	1	2	S1	200	0	200	S1	200	0	200						
7	S2	2	1	S2	0	0	0	S2	0	0	0						
8	S3	1	1	S3	0	0	0	S3	0	0	0						
9	Sum				200	0	200										
10																	
11	P2	W1	W2	P2	W1	W2	Sum	P2	W1	W2	Sum						
12	S1	3	2	S1	480	40	520	S1	480	40	520						
13	S2	4	2	S2	0	0	0	S2	0	0	0						
14	S3	2	1	S3	0	200	200	S3	0	200	200						
15	Sum				200	240	240										
16	Total				200	240	440										
17													Total Cost TS1				
18													480				
19	Transportation Step 2 (Warehouse-Manufacturing)																
20	Cost				Flow				Objective								
21	P1	M1	M2	M3	P1	M1	M2	M3	Sum	P1	M1	M2	M3	Sum			
22	W1	2	1	1	W1	200	0	0	200	W1	400	0	0	400			
23	W2	3	2	1	W2	0	0	0	0	W2	0	0	0	0			
24	Sum				200	0	0	0	200								
25																	
26	P2	M1	M2	M3	P2	M1	M2	M3	Sum	P2	M1	M2	M3	Sum			
27	W1	1	3	2	W1	0	0	0	0	W1	0	0	0	0			
28	W2	1	2	3	W2	240	0	0	240	W2	240	0	0	240			
29	Sum				240	0	0	0	240								
30	Total				440	0	0	0	440								
31													Total Cost TS2				
32													640				

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*Supply Chain Example:
Solution Flows (Distribution)*

Microsoft Excel - Supply Chain Design Example.xls																	File
File Edit View Insert Format Tools Data Window Help																	
	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O	P	
33	Transportation Step 3 (Manufacturing-Warehouse)																
34	Cost	Flow					Objective										
35																	
36																	
37	P1	W3	W4	P1	W3	W4	Sum	P1	W3	W4	Sum						
38	M1	2	1	M1	25	175	200	M1	50	175	225						
39	M2	3	2	M2	0	0	0	M2	0	0	0						
40	M3	2	3	M3	0	0	0	M3	0	0	0						
41				Sum	25	175	200					225					
42																	
43	P2	W3	W4	P2	W3	W4	Sum	P2	W3	W4	Sum						
44	M1	1	2	M1	140	100	240	M1	140	200	340						
45	M2	3	2	M2	0	0	0	M2	0	0	0						
46	M3	3	4	M3	0	0	0	M3	0	0	0						
47				Sum	140	100	240					340					
48				Total	195	275	440	Total Cost TS3				565					
49	Transportation Step 4 (Warehouse-Customers)																
50	Cost	Flow					Objective										
51																	
52	P1	C1	C2	C3	P1	C1	C2	C3	Sum	P1	C1	C2	C3	Sum			
53	M1	2	3	2	M1	0	0	0	25	W4	0	0	0	50			
54	W4	1	2	3	W4	100	75	0	175	W4	100	150	0	250			
55					Sum	100	75	25	200					300			
56																	
57	P2	C1	C2	C3	P2	C1	C2	C3	Sum	P2	C1	C2	C3	Sum			
58	W1	1	2	3	W1	0	0	0	140	W3	100	0	0	120			
59	W4	2	1	4	W4	0	100	0	100	W4	0	100	0	100			
60					Sum	100	100	0	240					320			
61					Total	200	175	65	440	Total Cost TS4				630			

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Supply Chain Example: Solution Costs

[illegible]

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Arc Based Formulations

- * *From origin facility to a destination facility*
- * *Advantages*
 - *Fewer variables*
 - *Simpler model*
 - *Scales better to multiple echelons*
- * *Disadvantage*
 - *Numerous conservation of flow constraints*

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Arc Based Conservation of Flow Constraints

- * 10 manufacturing plants
- * 20 distribution centers
- * 200 customers
- * 40 products
- * $20 \times 40 = 800$ flow conservation constraints

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Path Based Formulations

- * Flow from original supplier to final customer
- * Advantages
 - Allows path related constraints (time to market, system safety inventory)
- * Disadvantages
 - Number of variables explodes with echelons

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Path Based Formulation Number of Variables

- * 10 manufacturing plants
- * 20 distribution centers
- * 200 customers
- * 40 products
- * $10 \times 20 \times 200 \times 40 = 1.6$ million variables

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Geoffrion & Graves Characteristics

- * Multicommodity
- * Single echelon
- * Capacitated depots (lower and upper bound)
- * Depot handling cost
- * Deterministic
- * Single Period

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Geoffrion & Graves Characteristics Continued

- * Path formulation
- * Customer single sourcing
- * Weak formulation
- * Additional linear constraints in z and y

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Geoffrion and Graves Model

$$\begin{aligned}
 \min \quad & \sum_{ijkp} c_{ijkp} x_{ijkp} + \sum_j \left(f_j z_j + h_j \sum_{kp} r_{kp} y_{jk} \right) \\
 \text{s.t.} \quad & \sum_{jk} x_{ijkp} \leq s_{ip} & \forall ip \\
 & \sum_i x_{ijkp} = r_{kp} y_{jk} & \forall jk \\
 & \sum_j y_{jk} = 1 & \forall k \\
 & TL_j z_j \leq \sum_{pk} r_{kp} y_{jk} \leq TU_j z_j & \forall j
 \end{aligned}$$

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Benders Primal Decomposition

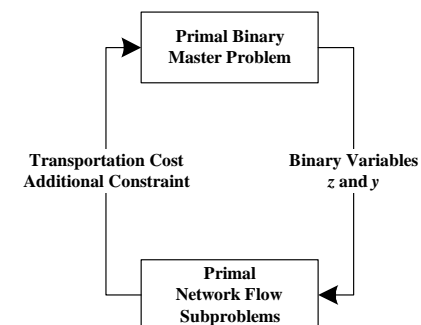
- * Fix binary variables z and y
 - Solve independent commodity network flow problems
 - Determine total transportation cost
- * Add total transportation cost as a cut to binary master problem
- * Solve binary master problem
- * Iterate

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Benders Decomposition Flow Chart



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Primal Network Subproblem

$$\begin{aligned}
 \min \quad & \sum_{ijkp} c_{ijkp} x_{ijkp} \\
 \text{s.t.} \quad & \sum_{jk} x_{ijkp} \leq s_{ip} \quad [v_{ip}] \\
 & \sum_i x_{ijkp} = r_{kp} y_{jk} \quad [u_{jkp}] \\
 & x_{ijkp} \geq 0
 \end{aligned}$$

Note that y are parameters, not variables

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Dual Network Subproblem

$$\begin{aligned}
 \max \quad & y_0 = \sum_{ip} -v_{ip} s_{ip} + \sum_{jkp} u_{jkp} r_{kp} y_{jk} \\
 \text{s.t.} \quad & u_{jkp} - v_{ip} \leq c_{ijkp} \quad \forall ijkp \\
 & v_{ip} \geq 0, u_{jkp} \text{ unrestricted}
 \end{aligned}$$

Note that y are parameters, not variables

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Extreme Point Formulation and Constraint

$$\begin{aligned}
 \max_{[v_{ip}^e, u_{jkp}^e] \in E} \quad & y_0 = \sum_{ip} -v_{ip}^e s_{ip} + \sum_{jkp} u_{jkp}^e r_{kp} y_{jk} \\
 y_0 \geq \quad & \sum_{ip} -v_{ip}^e s_{ip} + \sum_{jkp} u_{jkp}^e r_{kp} y_{jk} \quad \forall e
 \end{aligned}$$

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Primal Binary Master Problem

$$\begin{aligned}
 \min \quad & \sum_j \left(f_j z_j + h_j \sum_{kp} r_{kp} y_{jk} \right) + y_0 \\
 \text{s.t.} \quad & \sum_j y_{jk} = 1 \quad \forall k \\
 & TL_j z_j \leq \sum_{pk} r_{kp} y_{jk} \leq TU_j z_j \quad \forall j \\
 & y_0 \geq \sum_{ip} -v_{ip}^e s_{ip} + \sum_{jkp} u_{jkp}^e r_{kp} y_{jk} \quad e = 1..E \\
 & z, y \in \{0,1\}, y_0 \geq 0
 \end{aligned}$$

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Benders Decomposition Method References

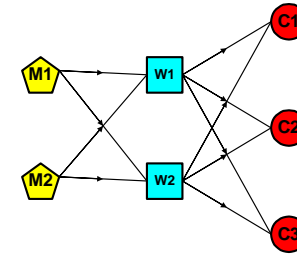
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Supply Chain Ballou Example: Schematic



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Supply Chain Ballou Example: Transportation Data

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Cost Data									
Transportation Step 1 (Plant-Warehouse)					Transportation Step 2 (Warehouse-Customer)				
Product	Origin	Cost	Destination		Product	Origin	Cost	Destination	
P1	P1	0	W1	5	P1	W1	4	C1	3
P1	P2	4	W2	2	P1	W2	2	C2	1
P2	P1	0	W1	5	P2	W1	3	C2	2
P2	P2	4	W2	2	P2	W2	3	C3	2
Production				Handling		Facility Costs			
Product	Plant	Cost		Product	Warehouse	Cost	Facility	Cost	
P1	P1	4		P1	W1	2	W1	100000	
P2	P2	4		P2	W2	1	W2	500000	
P2	P1	3		P2	W1	2			
P2	P2	2		P2	W2	1			

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Supply Chain Ballou Example: Capacity Data

Microsoft Excel - Supply Chain Design Ballou Example.xls									
Capacities									
Warehouse Capacity (Throughput)					Production				
Facility	Capacity				Product	Facility	Capacity		
W1	110000				P1	P1	60000		
W2					P2	P1	50000		
						P2			
Customer Demands									
Product	C1	C2	C3						
P1	50000	100000	50000						
P2	20000	30000	60000						

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Supply Chain Ballou Example: Arc Transportation Model

Microsoft Excel - Supply Chain Design Ballou Example.xls

Transportation Step 1 (Plant-Warehouse)

Transportation Step 2 (Warehouse-Customer)

Total Cost TS1: 0

Total Cost TS2: 0

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Supply Chain Ballou Example: Arc Capacity Model

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Conservation of Flow

Production

Handling

Linkage and Joint Capacity

Cost Summary

Total Cost TS2: 0

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Supply Chain Ballou Example: Arc Solver

Solver Parameters

Set Target Cell: \$P\$50

Equal To: ☐ Max ☒ Min ☐ Value of: 0

By Changing Variable Cells: \$B\$5:\$B\$56, \$F\$7:\$G\$8, \$F\$12:\$G\$13, \$G\$21:\$H\$22

Subject to the Constraints:

- \$B\$55:\$B\$56 = binary
- \$C\$36:\$C\$37 = \$D\$36:\$D\$37
- \$C\$38:\$C\$40 >= \$D\$38:\$D\$40
- \$D\$55:\$D\$56 >= \$E\$55:\$E\$56
- \$H\$36:\$H\$37 = \$I\$36:\$I\$37
- \$H\$38:\$H\$40 >= \$I\$38:\$I\$40

Solve, Close, Options, Reset All, Help, Add, Change, Delete, Guess

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Supply Chain Ballou Example: Arc Transportation Solution

Microsoft Excel - Supply Chain Design Ballou Example.xls

Transportation Step 1 (Plant-Warehouse)

Transportation Step 2 (Warehouse-Customer)

Total Cost TS1: 620000

Total Cost TS2: 600000

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Supply Chain Ballou Example: Arc Capacity Solution

Microsoft Excel - Supply Chain Design Ballou Example.xls

File Edit View Insert Format Tools Data Window Help

	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O	P	
31	Conservation of Flow																
32																	
33	P1	Facility	In	Out		P2	Facility	In	Out	All	Facility	In	Out				
34	P2	P1	200000	0		P2	P1	0	0		P1	2	0				
35	P2	P2	110000	0		P2	P2	110000	0		P2	1	200000	200000			
36	W1	W1	0	0		W1	W1	0	0		W1	0	0				
37	W2	W2	200000	200000		W2	W2	110000	110000		W2	310000	310000				
38	C1	C1	50000	50000		C1	C1	20000	20000		C1	70000	70000				
39	C2	C2	100000	100000		C2	C2	30000	30000		C2	130000	130000				
40	C3	C3	50000	50000		C3	C3	60000	60000		C3	110000	110000				
41																	
42	Total Material Flow: 310000																
43																	
44	Production																
45	Product	Facility	Cost	Flow	Capacity	Objective											
46	P1	P1	4	0	0	60000	0										
47	P2	P2	4	200000	210000	800000	0										
48	P2	P1	3	0	0	50000	0										
49	P2	P2	2	110000	310000	220000	0										
50	Total Production Cost							1020000									
51																	
52	Linkage and Joint Capacity																
53	Facility	Status	Cap	Avail	Flow	Cost	Objective										
54	W1	0	110000	0	0	100000	0										
55	W2	1	310000	310000	0	500000	500000										
56	Total Facilities Cost F							500000									
57																	
58	Cost Summary																
59	Transportation Step	TS1	TS2	Objective													
60	Transportation Step 1	TS1		620000													
61	Transportation Step 2	TS2		600000													
62	Production			1020000													
63	Handling			310000													
64	Facilities			500000	F												
65	Total							3050000									

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Supply Chain Ballou Example: Path Transportation Model

Microsoft Excel - Supply Chain Design Ballou Example.xls

Transportation						
Product	Plant	DC	Customer	Cost	Flow	Objective
P1	M1	W1	C1	4	0	0
			C2	3	0	0
			C3	5	0	0
	W2		C1	8	0	0
			C2	6	0	0
			C3	10	0	0
	M2	W1	C1	8	0	0
			C2	7	0	0
			C3	9	0	0
	W2		C1	4	0	0
			C2	3	0	0
			C3	4	0	0
P2	M1	W1	C1	3	0	0
			C2	2	0	0
			C3	4	0	0
	W2		C1	8	0	0
			C2	7	0	0
			C3	6	0	0
	M2	W1	C1	7	0	0
			C2	6	0	0
			C3	8	0	0
	W2		C1	5	0	0
			C2	4	0	0
			C3	5	0	0
Transportation Cost						

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Supply Chain Ballou Example: Path Capacity Model

Microsoft Excel - Supply Chain Design Ballou Example.xls

Microsoft Excel - Supply Chain Design Ballou Example.xls												
File	Edit	View	Insert	Format	Tools	Data	Window	Help				
A	B	C	D	E	F	G	H	I	J	K	L	M
Demand												
32	Product	Customer	Required	Flow								
34	P1	C1	50000	0								
35		C2	100000	0								
36		C3	50000	0								
37	P2	C1	20000	0								
38		C2	30000	0								
39		C3	60000	0								
40												
41												
Production												
42	Product	Facility	Cost	Flow	Capacity	Objective						
44	P1	M1	4	0	60000	0		W1		2	0	0
45		M2	4	0	310000	0		W2		1	0	0
46	P2	M1	3	0	50000	0		W1		2	0	0
47		M2	2	0	310000	0		W2		1	0	0
48	Total Production Cost							Total Handling Cost			0	
49												
Linkage and Joint Capacity												
50	Facility	Status	Cap	Avail	Flow	Cost	Objective					
52	W1		110000	0	0	100000	0		Transportation	TS		0
53	W2		310000	0	0	500000	0		Production			0
54									Handling			0
55	Total Facilities Cost F									F		0
56												
57												
Total												

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Supply Chain Ballou Example: Path Solver

Solver Parameters

Set Target Cell: [Solve] [Close]

Equal To: ☐ Max ☒ Min ☐ Value of: [Guess]

By Changing Variable Cells: [Options]

Subject to the Constraints:

- [Add]
- [Change]
- [Delete]
- [Help]

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Supply Chain Ballou Example: Path Transportation Solution

Microsoft Excel - Supply Chain Design Ballou Example.xls

Transportation						
Product	Plant	DC	Customer	Cost	Flow	Objective
P1	M1	W1	C1	4	0	0
			C2	3	0	0
		W2	C3	5	0	0
			C1	7	0	0
			C2	6	0	0
			C3	7	0	0
	M2	W1	C1	8	0	0
			C2	7	0	0
			C3	9	0	0
		W2	C1	4	80000	200000
			C2	3	100000	300000
			C3	4	50000	200000
P2	M1	W1	C1	3	0	0
			C2	2	0	0
			C3	4	0	0
		W2	C1	8	0	0
			C2	7	0	0
			C3	9	0	0
	M2	W1	C1	7	0	0
			C2	6	0	0
			C3	8	0	0
		W2	C1	5	20000	100000
			C2	4	30000	120000
			C3	5	80000	300000
Transportation Cost						1220000

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Supply Chain Ballou Example: Path Capacity Solution

Microsoft Excel - Supply Chain Design Ballou Example.xls

Demand						
Product	Customer	Required	Flow			
P1	C1	50000	50000			
	C2	100000	100000			
	C3	50000	50000			
P2	C1	20000	20000			
	C2	30000	30000			
	C3	60000	60000			
Production						
Product	Facility	Cost	Flow	Capacity	Objective	
P1	M1	4	0	60000	0	
	M2	4	200000	310000	800000	
	M1	3	0	50000	0	
	M2	2	110000	310000	220000	
Total Production Cost					1020000	
Linkage and Joint Capacity						
Facility	Status	Cap	Avail.	Flow	Cost	Objective
W1	0	110000	0	0	100000	0
W2	1	310000	310000	310000	500000	500000
Total Facilities Cost F					500000	
Handling						
Product	Facility	Cost	Flow	Objective		
P1	W1	2	0	0	0	
	W2	1	200000	200000		
P2	W1	2	0	0	0	
	W2	1	110000	110000		
Total Handling Cost					310000	
Cost Summary						
					TS	1220000
					Production	1020000
					Handling	310000
					Facilities	500000
					Total	3050000

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Logistics Modeling Trends

- * Computer software trends
 - More capable MIP solvers
 - Modeling languages
 - ERP systems (with some optimization)
- * Acceptance of integrated supply chain view
 - More comprehensive models (cradle to grave)
 - More realistic models (inventory)

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Logistics Modeling Trends: Conclusions

- * Models growing in complexity and realism
- * Models developed by supply chain owners
- * Solution techniques become more generic and i shrink wrapped

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SMILE Characteristics

- * Multicommodity
- * Multi-echelon
- * Capacitated facilities
- * Capacitated channels
- * All costs
- * Deterministic
- * Single period
- * Domestic (single country)

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SMILE Characteristics (2)

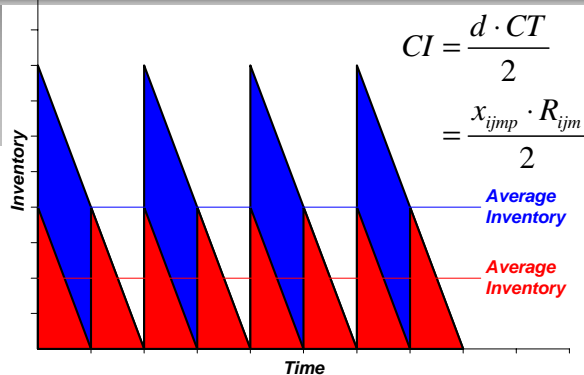
- * Arc formulation
- * Safety inventory proportional to demand (user determined)
- * Production cost and capacities
- * Weight and volume capacities
- * Depot and product single sourcing
- * Smart (tight) formulations
- * CPLEX MIP module

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Cycle Inventory versus Replenishment Cycle Time



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Number of Carriers

- * Weight capacity

$$\sum_{p \in P} Wt_p x_{ijmp} \leq \text{CarrierWtCap}_{ijm} w_{ijm}$$

- * Volume capacity

$$\sum_{p \in P} Vol_p x_{ijmp} \leq \text{CarrierVolCap}_{ijm} w_{ijm}$$

w_{ijm} = # carriers per time period

x_{ijmp} = flow of product p per time period

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Number of Carrier Constraints

- * 25 distribution centers
- * 400 customers
- * 3 products
- * $25 \cdot 400 \cdot 3 \cdot 2 = 60,000$ constraints

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Transportation Costs

- * Carrier cost
- * Material flow cost

$$\sum_{i \in B \cup D} \sum_{j \in C \cup D} \sum_{m \in M(i,j)} \left[\text{CarrierCost}_{ijm} w_{ijm} + \sum_{p \in P} \text{TranUnitCost}_{ijmp} x_{ijmp} \right]$$

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Safety Inventory Versus Lead Time

$$SI = k \cdot \sqrt{LT \cdot \text{Var}_d + d^2 \cdot \text{Var}_{LT}}$$

$$CV_d = \frac{\sqrt{\text{Var}_d}}{d}$$

$$\text{Var}_d = (CV_d \cdot d)^2$$

$$SI = k \cdot \sqrt{LT \cdot CV_d^2 + \text{Var}_{LT}} \cdot d$$

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Safety Stock Inventory Factor

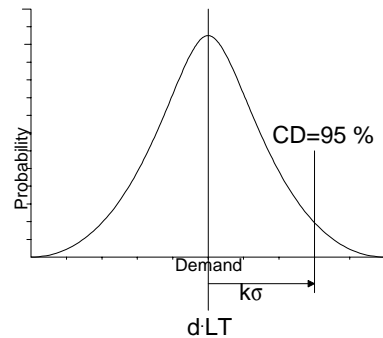
- * Customer service measured by probability of a stock-out
- * Safety inventory commonly equals time length multiplied by demand (linear safety inventory policies)

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Demand During Lead Time and Stock-out Probability

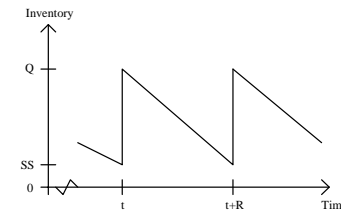


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Warehouse Inventory Cost



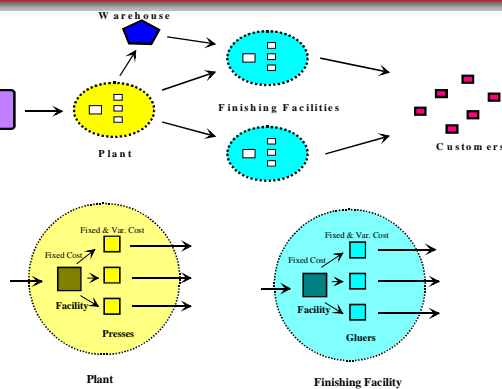
$$\sum_{i \in B \cup D} \sum_{j \in D} \sum_{m \in M(i, j)} \sum_{p \in P} r \text{ Value}_p \left(\text{SSFactor}_{jp} + \frac{R_{ijm}}{2} \right) x_{ijmp}$$

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Machine Resources Schematic



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SMILE Case Studies

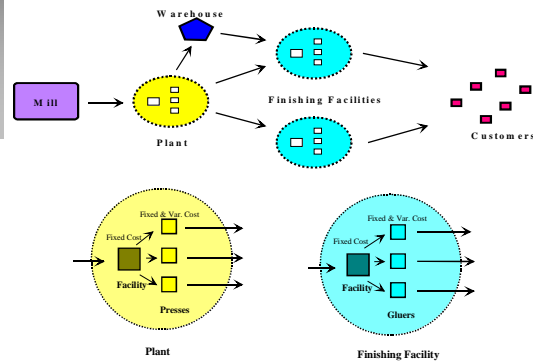
- * Hospital supply company
- * State of New Jersey recycling
- * Electronics manufacturing
- * HAC wholesaler
- * Paper packaging supplier

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Cardboard Manufacturer Supply Chain Schematic

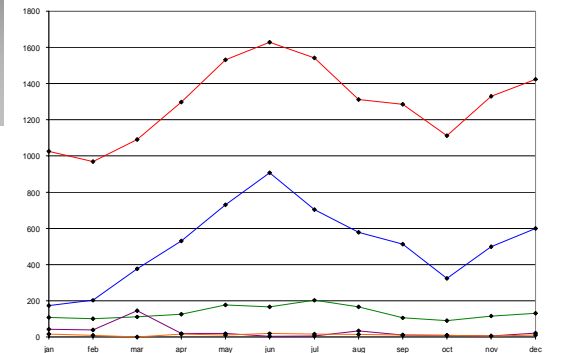


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Seasonal Demand Pattern (Soft Drinks)

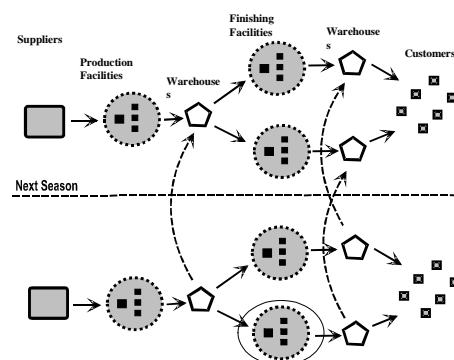


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Seasonal Material Flow Schematic

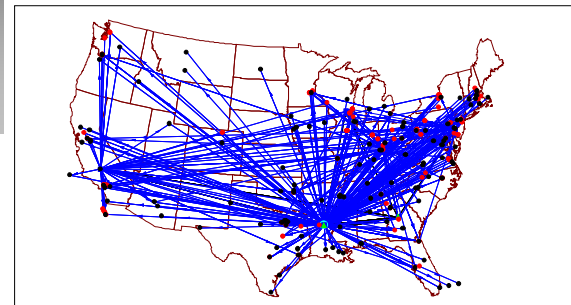


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Initial Supply Chain

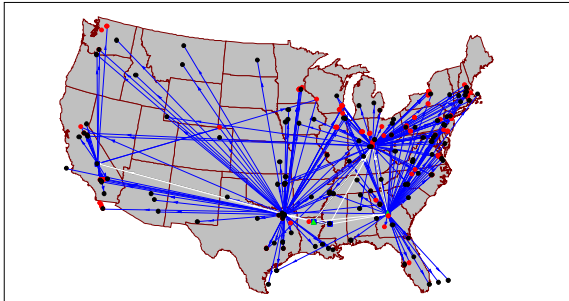


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Single Season Improved Supply Chain



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Cardboard Packaging Manufacturer

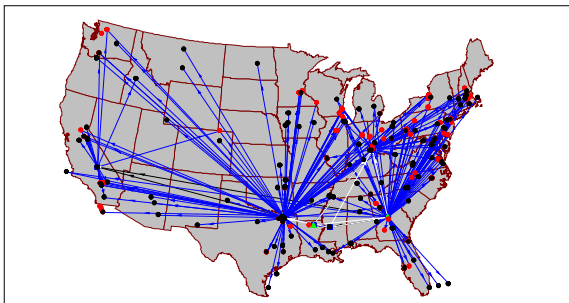
- * 3 seasons, 2 stage manufacturing
- * 12 products, 714 customers
- * 87 production lines
- * 3738 transportation channels
- * 48888 variables (102 integer)
- * primal decomposition reduced run times from 2 days to 865 seconds
- * savings \$8.3 million

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Seasonal Improved Supply Chain



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Supply Chain Models Overview

- * Introduction
- * Channel Selection Models
- * Single Country (Domestic) Models
- * **Global Models**
- * Robustness and Flexibility Models

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Global Logistics Systems Models

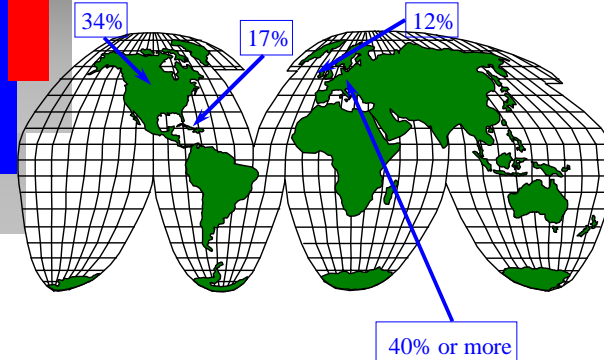
- * Domestic plus exchange rates, duties, taxes
- * Objective is worldwide after-tax profit maximization
- * Decisions are material flows, transportation cost allocations, and transfer prices

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Tax Rates and Profit Realization

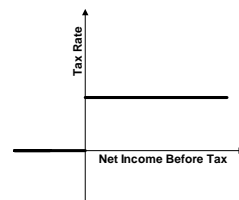
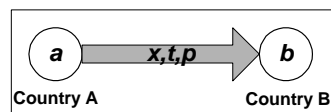


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Global Transactions and Tax Rates

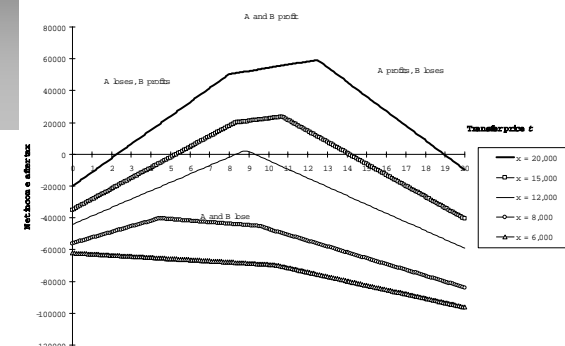


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Impact of Transfer Prices on After Tax Profits



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Before and After Tax Profit Objective and Constraint

$$\begin{aligned}
 & \max : (1 - \text{taxrate}_k) \text{ibtwf}_k^+ - \text{ibtwf}_k^- \\
 & \text{subject to :} \\
 & \sum_{i \in C(k)} \sum_{m \in T(i,j)} \sum_{p \in P} \left(\frac{1}{E_i} \right) \text{MPRICE}_{ip} W_{ikmp} - \sum_{i \in C(k)} \sum_{m \in T(i,j)} \sum_{p \in P} \left(\frac{1}{E_k} \right) \left[\text{HANDC}_{ip} + \text{TRCWM}_{ikm} W_p \right] W_{ikmp} \\
 & - \sum_{i \in C(k)} \sum_{m \in T(i,j)} \sum_{p \in P} \left(\frac{VP_{ip} H}{E_k} \right) \left[\text{TTWM}_{ikm} + (\text{CSF}) \text{SHIPFRE}_{Q_{ikm}} + \text{SSF} W_{ip} \sqrt{\text{TTWM}_{ikm}} \right] W_{ikmp} \\
 & - \sum_{j \in M} \sum_{m \in T(i,j)} \sum_{p \in P} \left(\frac{1}{E_j} \right) \left[\text{tppldc}_{jp} (1 + \text{DUTY}_{jp}) + (1 - \text{propw}_{jim}) \text{TRCPW}_{jim} W_p \right] x_{jimp} \\
 & - \left(\frac{1}{E_k} \right) \text{FIXDC}_k = \text{ibtwf}_k^+ - \text{ibtwf}_k^- \quad k \in W^f
 \end{aligned}$$

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Computational Test Case

- * 50 raw material suppliers
- * 8 plants, 10 distribution centers
- * 80 customers
- * 35 components, 12 finished products
- * 3.1 modes per channel
- * 10100 variables, 2900 constraints

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Profit Increases for Optimal Transfer Prices

Transfer Price Heuristics				
Instance	Middle Point	Tax Rate	Lower Bound	Upper Bound
1	2.4	0.2	0.8	4.1
2	23.2	12.1	17.1	29.2
3	22.6	30.2	39.9	16.2
4	45.6	65.0	95.2	32.1

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Supply Chain Models Overview

- * Introduction
- * Channel Selection Models
- * Single Country (Domestic) Models
- * Global Models
- * Robustness and Flexibility Models

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Design of Robust and Flexible Supply Chains

- * Change in the mission and data is inevitable, but only techniques are sensitivity and scenario analysis
- * No scientific analysis or design methodology for large SC problems
- * Needed measures of
 - Flexibility (configuration feasibility)
 - Robustness (quality of objective)

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Research Review

- * Extensive literature on deterministic or scenario-based supply chain design
- * Flexibility definitions in manufacturing research (FMS) appear not applicable
- * Stochastic optimization for small problems
- * Some stochastic optimization for exchange rates in global systems

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Robustness and Flexibility

- * Relative robustness, Kouvelis (1997)

$$\max_{s \in S} \left\{ \frac{z_s(x_R) - z_s^*(x_s^*)}{z_s^*(x_s^*)} \right\}$$

- * Flexibility, Beamon (1998)
 - Unused capacity in a configuration

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Hierarchical Stochastic Design Algorithm

- * Select a limited number of feasible supply chain configurations
- * For each configuration
 - Sample parameters from distributions
 - Solve linear network flow problems
 - Compute expected value and variance
- * Select *ibest* configuration
 - Weighted objective or efficiency frontier

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Hierarchical Two-stage Formulation

$$\text{Min } cx + dy$$

$$\text{s.t. } Ex + Fy \leq h$$

$$Hx \leq g$$

$$x \in \{0,1\}, y \geq 0$$

$$\text{Min } cx + E[Q(x, \xi)] \quad Q(x, \xi) = \text{Min } dy$$

$$\text{s.t. } Hx \leq g$$

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

$$\text{s.t. } Fy \leq h - Ex$$

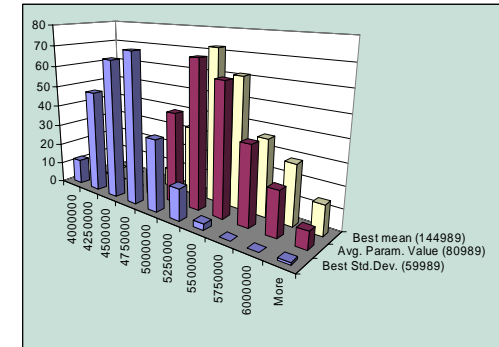
$$y \geq 0$$

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Second Stage Profit Distributions (Medium Example)



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Multicriteria Formulation

$$\text{Min } cx + E[Q(x, \xi)] + \alpha \cdot SD[Q(x, \xi)]$$

$$\text{s.t. } Hx \leq g$$

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

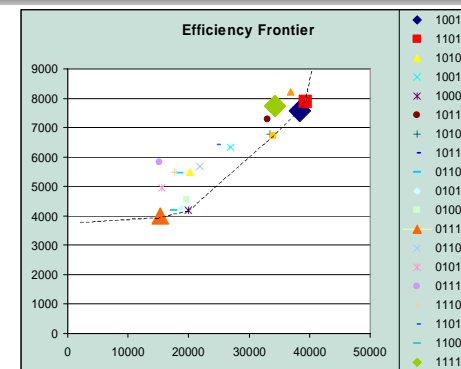
But standard Deviation (SD) is not convex

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Multi-objective Criteria and Efficiency Frontier (Medium)



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Approximations

$$E[Q(x, \xi)] \approx \frac{1}{N} \sum_{i=1}^N Q(x, \xi^i)$$

$$SD[Q(x, \xi)] = \sqrt{\text{Var}[Q(x, \xi)]}$$

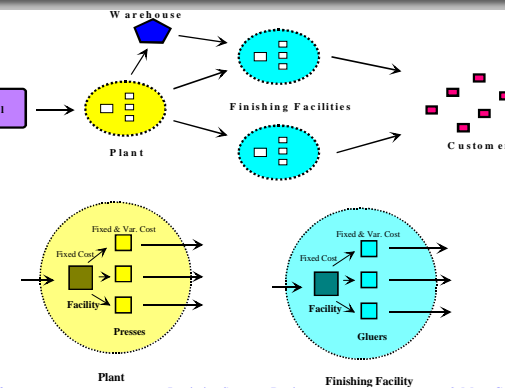
$$\text{Var}[Q(x, \xi)] \approx \frac{1}{N} \sum_{i=1}^N Q^2(x, \xi^i) - \left\{ \frac{1}{N} \sum_{i=1}^N Q(x, \xi^i) \right\}^2$$

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Two Stage Supply Chain With Machine Resources



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Cardboard Packaging Manufacturer

- * 2 stage manufacturing + warehouse
- * 13 products, 238 customers
- * 8 plants, 9 finishing plants
- * 28+93 production lines (machines)
- * 3738 transportation channels
- * 20912 continuous flow variables
- * 140 binary (major) site and (minor) machine variables

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Domestic Case Formulation Characteristics

Problem Statistics	N=1	N=20	N=40	N=60
Constraints	7,822	156,440	312,880	469,320
- Inequality constraints	3,498	69,960	139,920	209,880
- Equality constraints	4,324	86,480	172,960	259,440
Variables	21,052	418,380	836,620	1,254,860
- Continuous variables	20,912	418,240	836,480	1,254,720
- Integer (binary) variables	140	140	140	140

N = Number of scenarios in master problem

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Parameters

- * Capacities, supplies, transportation, demand, and costs all log-normally distributed
- * 400 Mhz Pentium III, CPLEX 7.0
- * 41 seconds for single scenario mean-value deterministic case total cost = 116.115 million

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Acceleration Techniques Performance: Quality (Gap)

	Original	1	2	3	4	5
1 st Gap	> 100%	31%	> 100%	60%	> 100%	> 100%
10 th Gap	60%	8%	40%	5%	60%	9%

	Original	1+2	1+3	1+4	1+5	1+2+3
1 st Gap	> 100%	31%	31%	31%	31%	31%
10 th Gap	60%	0.7%	0.1%	0.08%	0.5%	0.2%

	Original	2+3	1+3+4	1+2+3+4	1+2+3+5	All
1 st Gap	> 100%	60%	31%	31%	31%	31%
10 th Gap	60%	3%	0.01%	0.01%	0.06%	0.01%

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Acceleration Techniques Performance: Efficiency (Run Time)

N=20

	Original	1	2	3	4	5
Time	> 4,000	> 4,000	> 4,000	> 4,000	> 4,000	> 4,000
Iteration	> 30	> 30	> 30	> 30	> 30	> 30

	Original	1+2	1+3	1+4	1+5	1+2+3
Time	> 4,000	> 4,000	3,860	2,180	> 4,000	3,600
Iteration	> 30	> 30	26	12	> 30	23

	Original	2+3	1+3+4	1+2+3+4	1+2+3+5	All
Time	> 4,000	> 4,000	1,500	1,380	3,050	1,890
Iteration	> 30	> 30	8	7	19	7

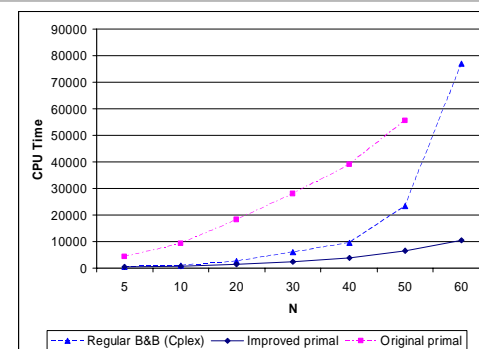
Note: The MIP Optimal using CPLEX needs 2,700 seconds

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Comparison of Run Times for Solution Algorithms



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Stochastic Solutions Robustness for Domestic Case

$N=20, M=20, N_f=1000$

Configuration	MPP	SS-1	SS-2	SS-3
Average obj. value (in million \$)	116.77	111.03	111.03	111.05
Max	173.30	122.57	122.08	122.11
Min	99.02	100.38	100.14	100.10
Range	74.28	22.19	21.93	22.01
Standard Deviation	0.34	0.11	0.11	0.11
Absolute Gap	5.91	0.16	0.17	0.18
Relative Gap	0.066574	0.001454	0.001508	0.001619

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Impact of Variability

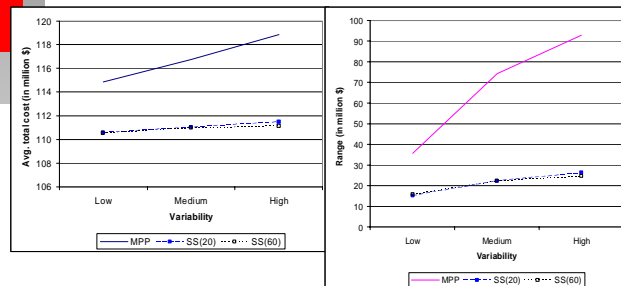
Problems	Std. Deviation for customer demand	Std. deviation for all other parameters
Medium variability problem	30%	10%
Low variability problem	15%	5%
High variability problem	40%	20%

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Robustness of Stochastic Solutions for Domestic Case

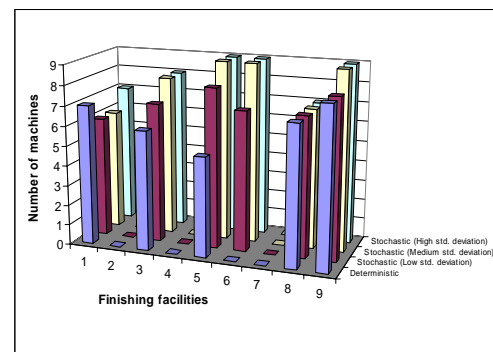


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Configurations for Varying Variability

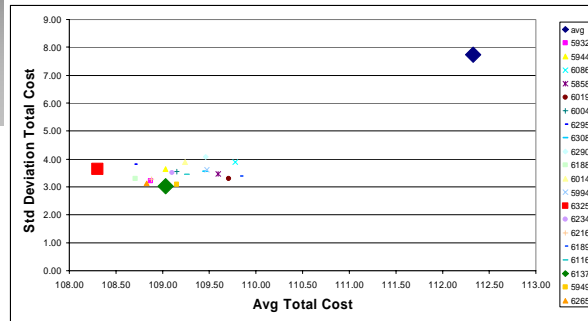


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Efficiency Graph For Many Scenarios and Replications



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Global Supply Chain Design

- * Net income after tax maximization
- * Demand upper bound on sales
- * Bill of material (3 levels) flow balance constraints

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Global Case Problem Characteristics

Problem Statistics	N=1	N=10	N=20	N=60
Constraints	1,467	14,670	29,340	88,020
- Inequality constraints	402	4,020	8,040	24,120
- Equality constraints	1,065	10,650	21,300	63,900
Variables	6,894	68,310	136,550	409,510
- Continuous variables	6,824	68,240	136,480	409,440
- Integer (binary) variables	70	70	70	70

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Acceleration Techniques Performance: Quality (Gap)

N=20

	Original	1	2	3	4	5
1 st Gap	> 100%	> 100%	> 100%	> 100%	> 100%	> 100%
50 th Gap	41 %	27 %	18 %	21 %	41 %	29 %

	Original	1+2	1+3	1+4	1+5	1+2+3
1 st Gap	> 100%	> 100%	> 100%	> 100%	> 100%	> 100%
50 th Gap	41 %	22 %	12 %	27 %	19 %	3 %

	Original	2+3	1+3+4	1+2+3+4	1+2+3+5	All
1 st Gap	> 100%	> 100%	> 100%	> 100%	> 100%	> 100%
50 th Gap	41 %	5 %	12 %	4 %	< 1 %	< 1 %

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Acceleration Techniques for Benders Decomposition

- ① *Logistics constraints*
 - Echelon capacity, source capacity for average demand
- ② *Cut disaggregation*
 - By scenario
- ③ *Knapsack lower bounds (max. case)*
- ④ *Primal feasible heuristic*
- ⑤ *Cut strengthening*

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Acceleration Techniques Performance: Efficiency (Run Time)

N=20

	Original	1	2	3	4	5
Time	>13,000	>13,000	>13,000	>13,000	>13,000	>13,000
Iteration	> 60	> 60	> 60	> 60	> 60	> 60

	Original	1+2	1+3	1+4	1+5	1+2+3
Time	>13,000	11,900	>13,000	>13,000	12,300	10,300
Iteration	> 60	56	> 60	> 60	58	51

	Original	2+3	1+3+4	1+2+3+4	1+2+3+5	All
Time	>13,000	>13,000	>13,000	10,300	9,800	9,800
Iteration	> 60	> 60	> 60	51	45	45

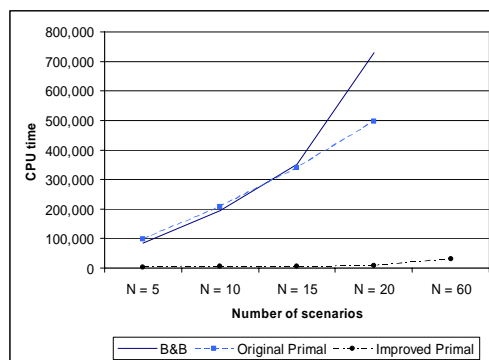
Note: The MIP Optimal using CPLEX needs 730,500 seconds)

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Comparison of Run Times for Solution Algorithms



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Stochastic Solutions Robustness for the Global Case

N=60, M=10, N'=1000

	MPP	SS
Average NCF	51.021	54.095
Std. Deviation	0.127	0.119
Max NCF	66.996	68.063
Min NCF	31.355	46.531
Range	35.641	21.533
Absolute Gap	3.166	0.092
Relative Gap	0.058425	0.001694

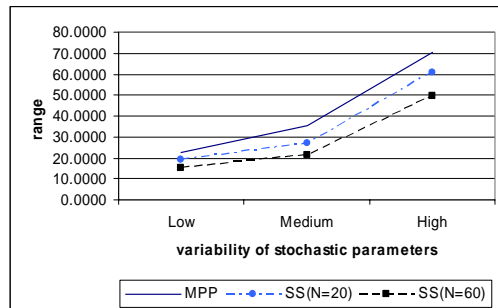
(in million \$, except the relative gap)

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Robustness of Stochastic Solutions for Global Case



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Computational Experiment Conclusions: Robustness

- * Designing for average parameters yields a dominated configuration
 - Worse mean and standard deviation
 - Difference larger for more variable data
- * More scenarios yield more robust solution (20 to 60 sufficient)
- * Statistics stable after 500 samples
- * Report multi-criteria solutions diagram

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Numerical Experiment Conclusions: Algorithms

- * Significant smaller times for accelerated primal decomposition
 - Better than B&B, original primal decomposition
 - Dual decomposition worse ??
- * Combination of acceleration techniques provides time reduction
- * Bill of Material makes problem much harder to solve

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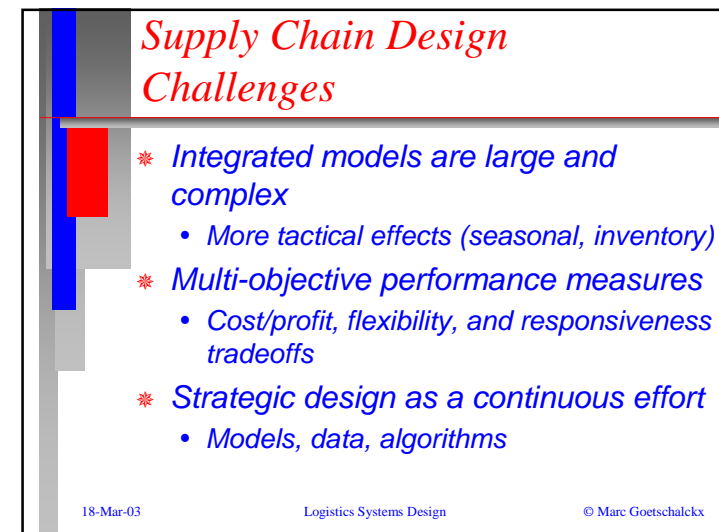
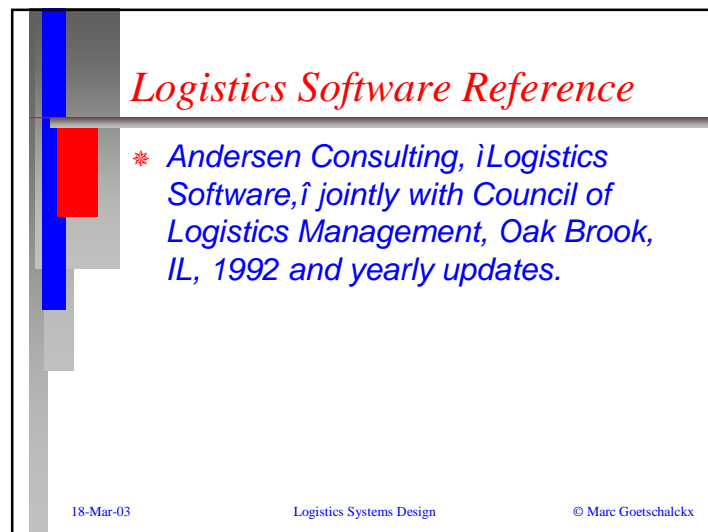
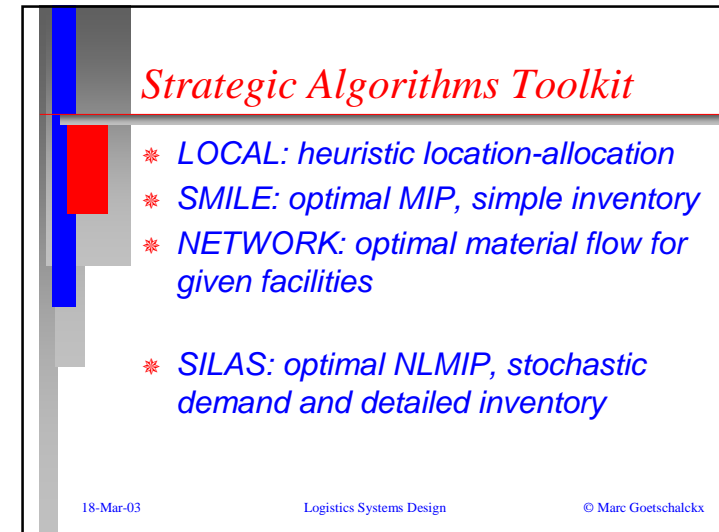
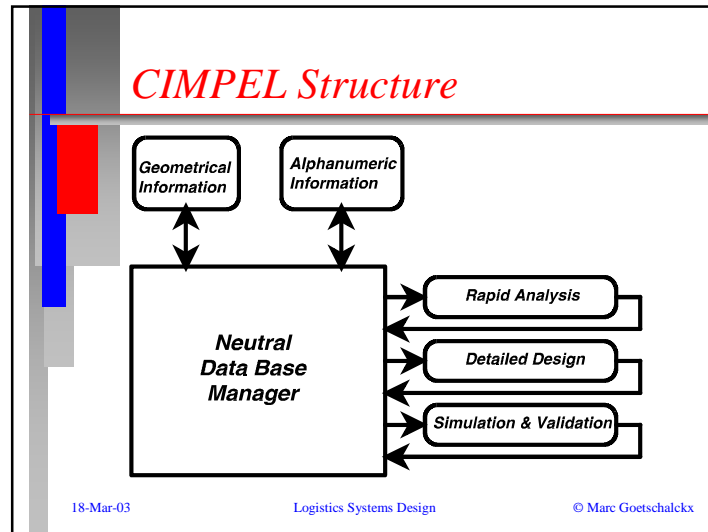
Conclusions

- * Good definitions and measures for flexibility and robustness are lacking
- * Current methodology is deterministic design and sensitivity or (few) scenario analysis
- * Many-scenario solutions are more robust
- * Only accelerated hierarchical design algorithm fast enough

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Supply Chain Design Challenges Continued

- * Technology transfer to logistics professionals and students
 - Toy cases and black-box software

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Supply Chain Modeling Challenges

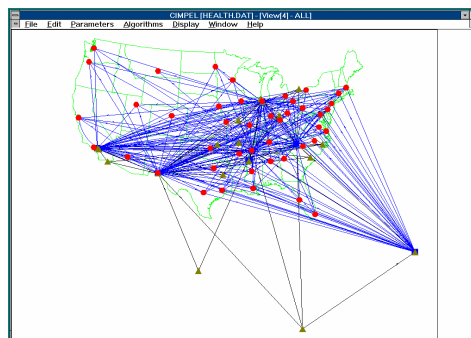
- * Multiple periods, combined with tactical
 - Periodic and seasonal demand
 - Dynamic strategic systems
 - Responsive
- * Global
 - Taxes and profit realization
 - Local contents, duty drawback
- * Stochastic
 - Flexibility, robustness, risk, scenarios

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From a Multicommodity Case...

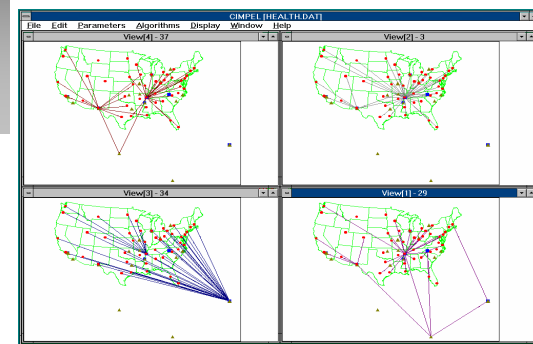


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...and Configuration by a Current Design Tool



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