



# Supply Chain Resilience Evaluation And Mitigation

(SCREAM 2.0)

Dr. Shardul Phadnis

Dr. Chris Caplice

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# Plan for the Session

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## Thursday Afternoon (2:00 – 3:15)

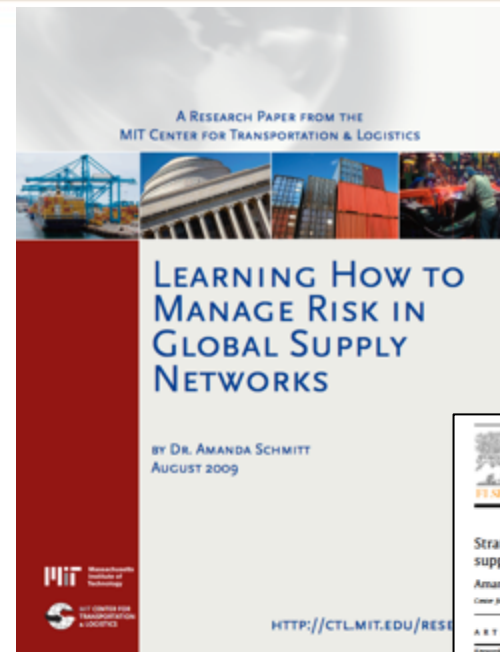
- Overview of the SCREAM Game (20 minutes)
- Student Experimenting with Tool (15 minutes)
- Quick Status Check (10 minutes)
- Teams Develop and Submit Final Policy (30 minutes)

## Thursday Afternoon (4:30 – 5:00)

- Discuss results and conclusions (30 minutes)

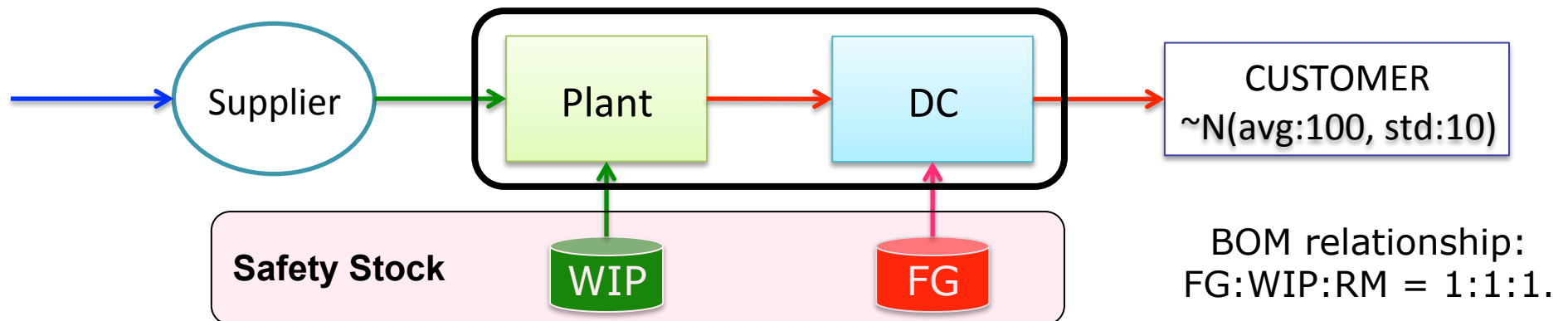
# Supply Chain Risk Evaluation and Mitigation Game

- Developed at MIT CTL from 2009 to 2012
- Based on project with a CPG manufacturing company
- Dr. Mahender Singh & Dr. Amanda Schmitt developed original simulation
- Dr. Yukun Liu enhanced and ported it to Excel
- Dr. Shardul Phadnis improved and created SCREAM 2.0



# Widget supply chain

- Each team runs its own Widget supply chain which consists of:
  - Supplier: Receives raw material (**RM**) and converts into work-in-process (**WIP**)
  - Plant: Converts the **WIP** into finished goods (**FG**)
  - Distribution Center: Stores **FG** for delivery to customers
- You have control over the Plant and the DC, but not the supplier
- Demand for finished goods random and variable
- Conservative inventory policies at DC and Plant already established



# Widget supply chain

- How does a supply chain handle “normal” volatility?
  - Demand or Lead Time Variability => Safety Stock

$$\text{Safety Stock} = k\sigma_L$$

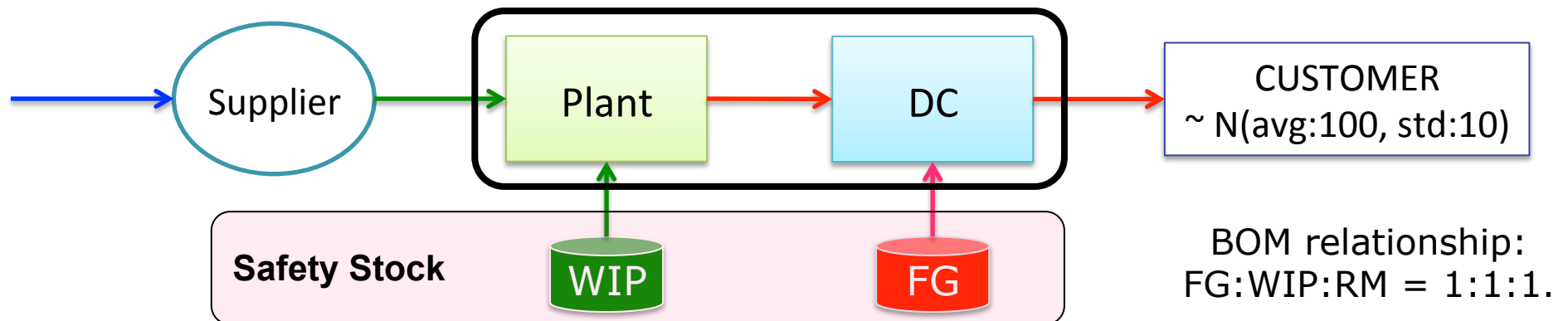
Where:

$k$  = Safety factor

$\sigma_L$  = RMSE of Forecast

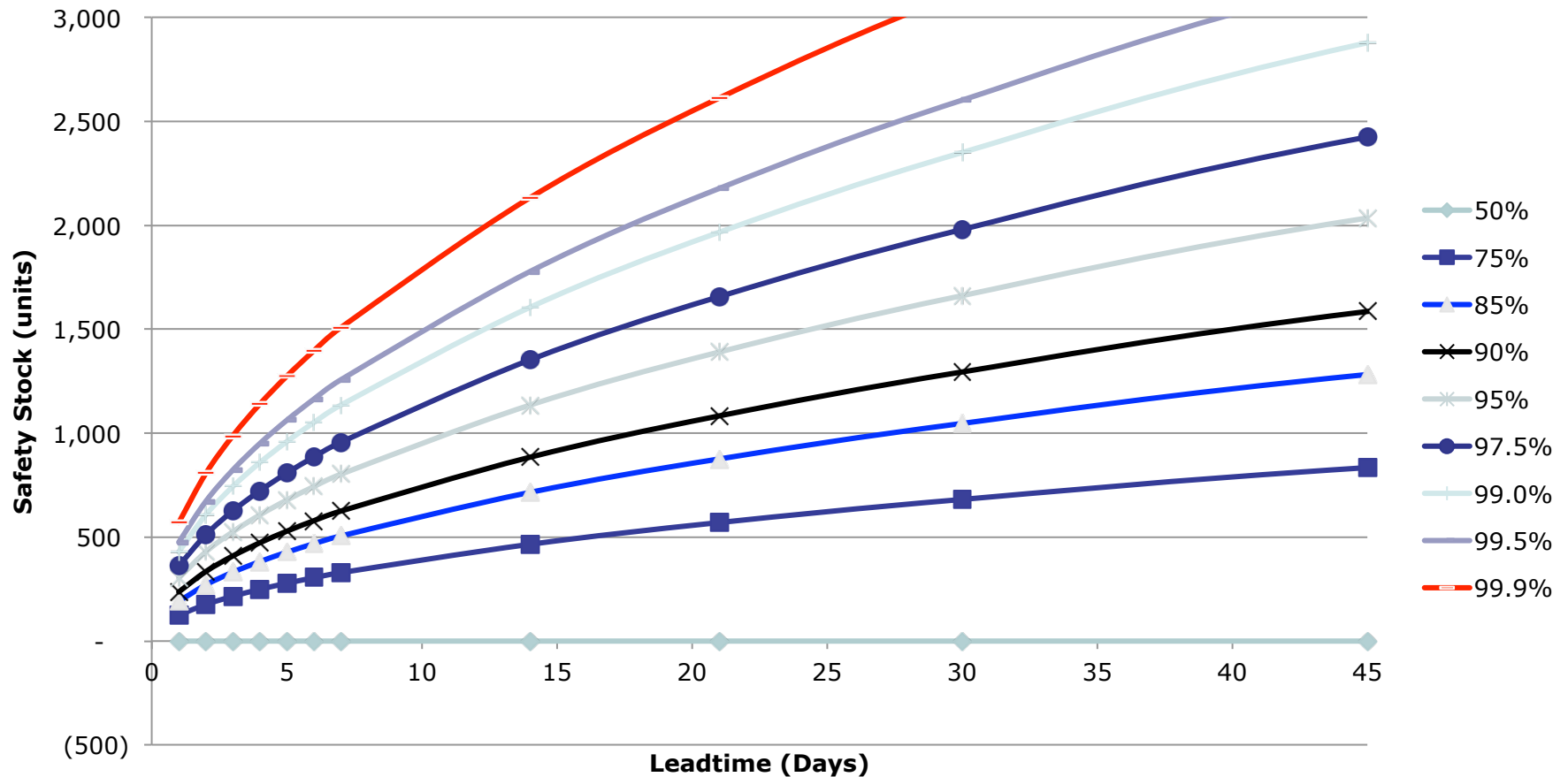
$$E(D_{\text{Leadtime}}) = E(L)E(D)$$

$$\sigma_{\text{Leadtime}} = \sqrt{E(L)\sigma_D^2 + (E(D))^2 \sigma_L^2}$$



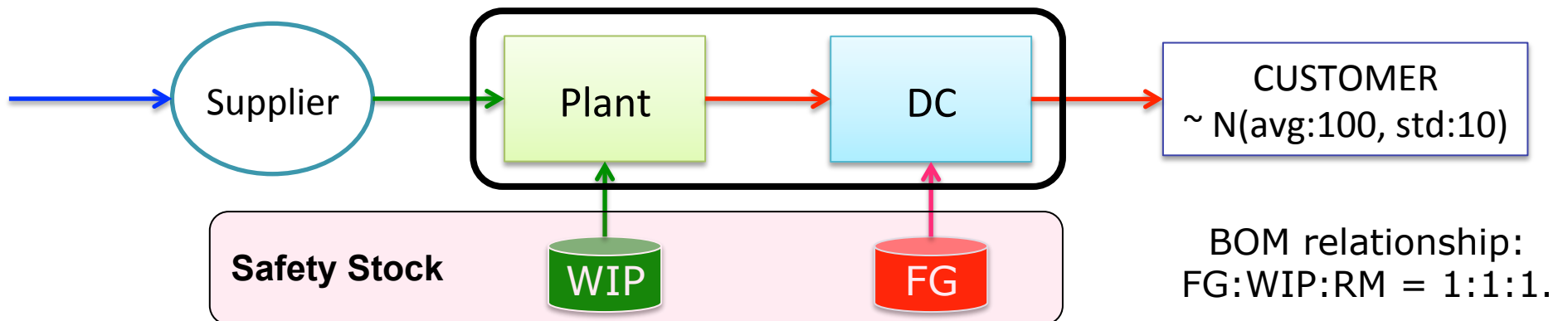
# Trade-Off between Lead Time & Safety Stock

Safety Stock versus Leadtime for CSL Isoquants

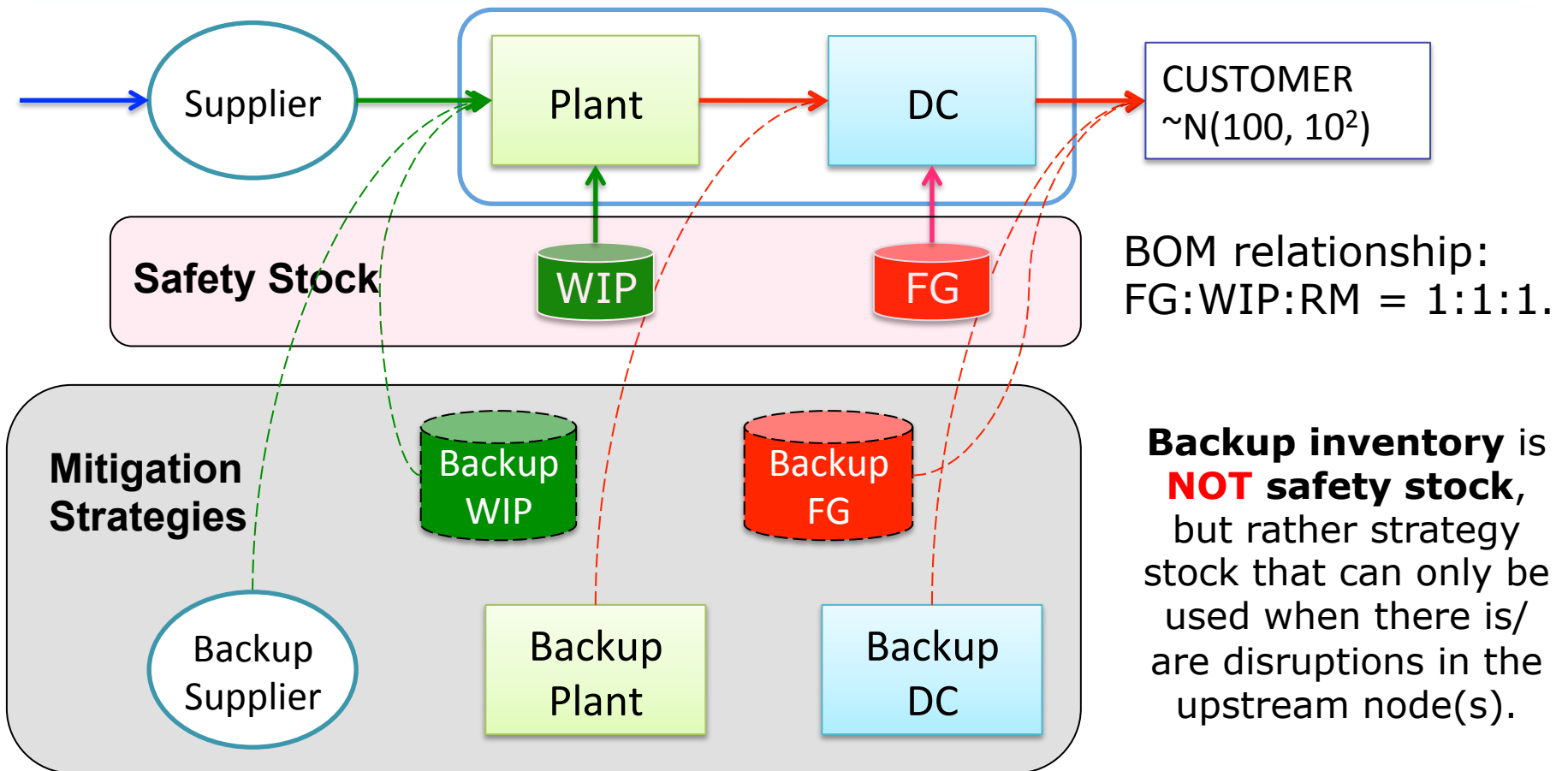


# Widget supply chain

- How does a supply chain handle “normal” volatility?
  - Demand & Lead time variability => Safety Stock
- What if the supply chain is severely disrupted?
  - Supplier Disruption
  - Manufacturing Disruption
  - Distribution Disruption



# Disruption mitigation strategies



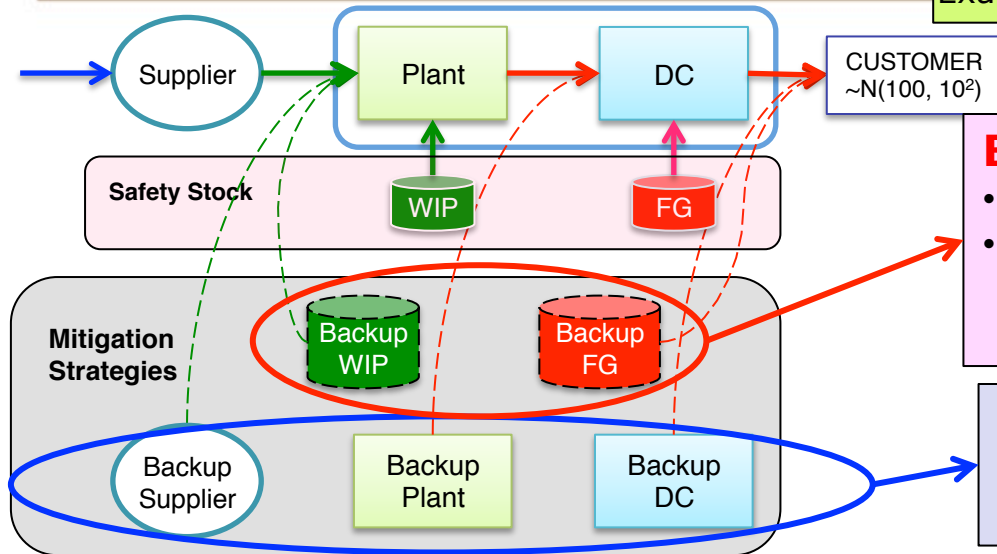


# Mitigation strategy

## Mitigation Policy Format

**FG@DC / WIP@Plant / DC / Plant / Supplier**

Example: **100/100/1/1/1**



## Backup inventory

- Any non-negative value
- Locations
  - WIP: @ the plant
  - FG: @ warehouse separate from DC

## Backup facility

**Choose** (a) capacity level and (b) time to become available, for a specified set up fee

Backup Option	Capacity Rate	Response time (weeks)	Set Up Fee (for)		
			DC	Plant	Supplier
1	0	-	\$ 0	\$ 0	\$ 0
2	50%	4	\$ 1,000	\$ 800	\$ 400
3	50%	2	\$ 2,500	\$ 1,800	\$ 1,000
4	50%	1	\$ 6,000	\$ 4,000	\$ 2,400
5	100%	6	\$ 1,500	\$ 1,000	\$ 1,000
6	100%	2	\$ 6,000	\$ 5,000	\$ 3,500
7	100%	1	\$ 15,000	\$ 12,000	\$ 10,000

# Objective of the game

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- **Design a risk mitigation strategy** to minimize the total supply chain cost while maximizing the order fill rate over an uncertain future.
- Costs
  - Ordering Costs ~ \$16 to \$20 per order
  - Holding Costs ~25% annually
  - Product Landed Costs
    - Finished Goods 100 \$/unit
    - WIP 80 \$/unit
    - Raw Materials 50 \$/unit
  - Selling Price \$225 per unit
  - No Stockout Costs
- Service Level
  - Order Fill Rate at customer location
  - Under normal conditions, OFR is ~99%

# SCREAM simulation spreadsheet

Learning Worksheet

In this sheet, you can test the effect of a mitigation policy for a given disruption scenario.  
For convenience, it allows you to specify two disruption scenarios (S1 and S2) and test the effects of two policies (P1 and P2).  
Policy P1 is applied to scenario S1, policy P2 is applied to scenario S2.

**Run simulation**

**Scenario Descriptions**

**Policies**

**Results**

Scenario	Disruption	Start	Duration	Normal	Week	Legend for facility status
Scenario S1	DC	4	8	12		Operational
	Plant	8	12	20		Operational
	Supplier	20	4	24		Operational
						Disrupted
Scenario S2	DC	4	8	12		Operational
	Plant	8	12	20		Operational
	Supplier	20	4	24		Operational
						Disrupted

Policy	Backup inventory	FG inventory	WIP inventory	DC backup	Plant backup	Supplier backup	Capacity	Cost
Policy P1		100	100	7	7	7	100%	
				100%	1			\$ 15,000
				100%	1			\$ 12,000
				100%	1			\$ 10,000
Policy P2		1,000	1,000	4	4	4	50%	
				50%	1			\$ 6,000
				50%	1			\$ 4,000
				50%	1			\$ 2,400

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Average: \$157,482 Count: 24 Sum: \$3,779,557 90%

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# SCREAM simulation spreadsheet: Details

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- Define up to 2 disruption scenarios
  - Only enter in yellow cells
  - Start and Duration for each facility.
- Define up to 2 mitigation policies
  - Only enter in yellow cells
  - Enter 5 parameter policy code
- Run Scenario
  - Press the “Run simulation” button
  - Run should take under 5 seconds
  - Scenario 1 runs against Policy 1 & Scenario 2 runs against Policy 2
- Review Results
  - Summary results (numeric and charts) on cover sheet
  - Scenario details on other tabs (S1 and S2)
  - Use this to compare policies or how different scenarios impact the same policy

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# Start Playing Around

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- **Move to 3 Person Teams**
- **Open up your SCREAM spreadsheet**
  - Download the file SCREAM2\_Student\_v2.xlsm
  - Make sure you allow Macros
- **Two ways to Play**
  - Use the same policy and run against two different scenarios
  - Test two different policies and run against the same scenario

**Get a feel for how the different policies  
interact with each other!**

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# Status Check @2:30

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# Some questions to ponder . . .

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- How much is a stockout worth?
- Is speed of response more important than capacity coverage, or the other way around?
- When is it worth putting a policy in place?
- Is it important to have a uniform policy across the facilities?
- Is it better to place a full strength policy at one facility and partial at others? If so, which?
- Under what conditions is it better to use Strategic Stock versus Facility Backup plans?
- Which strategies seem to work best?

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Final Decision Due  
@ 3:15

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# Analysis of Results

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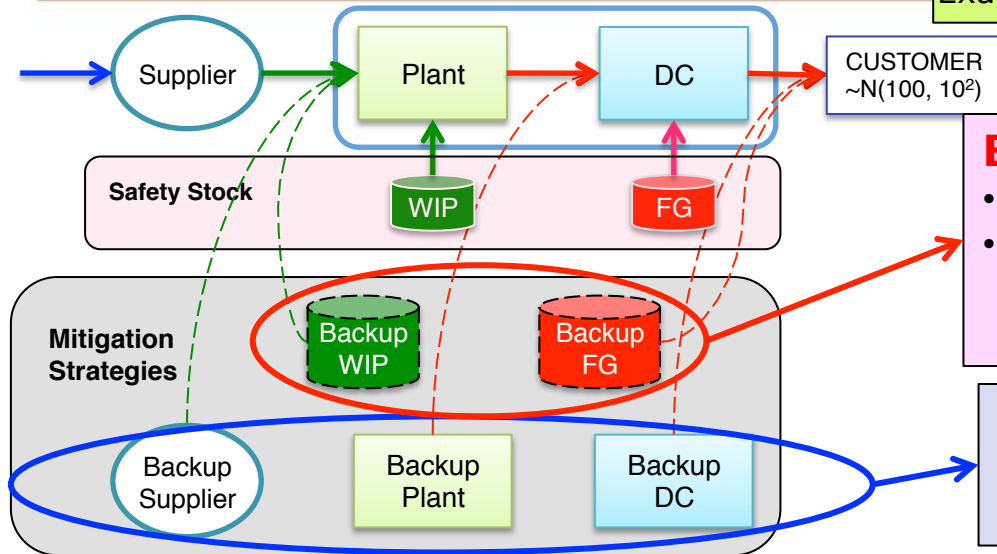


# Mitigation policy

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# Policies chosen by the teams

Team	Inventory		Capacity			Name
	FGI	WIP	DC	Plant	Sup	
1	2500	1000	5	2	2	Brazilians
2	1000	1000	4	4	7	Wheeler
3	1250	800	5	5	5	Hidour/Bourgoin/Vlakovs
4	800	1000	4	5	3	
5	400	400	6	6	6	Jay/Tom
6	1000	400	5	6	5	Terremoto
7	1200	200	5	5	6	Mosquito
8	400	1200	6	6	5	P&G
9	200	200	6	3	6	Tomasetti/Piotti/Wagle
10	1250	750	5	5	5	

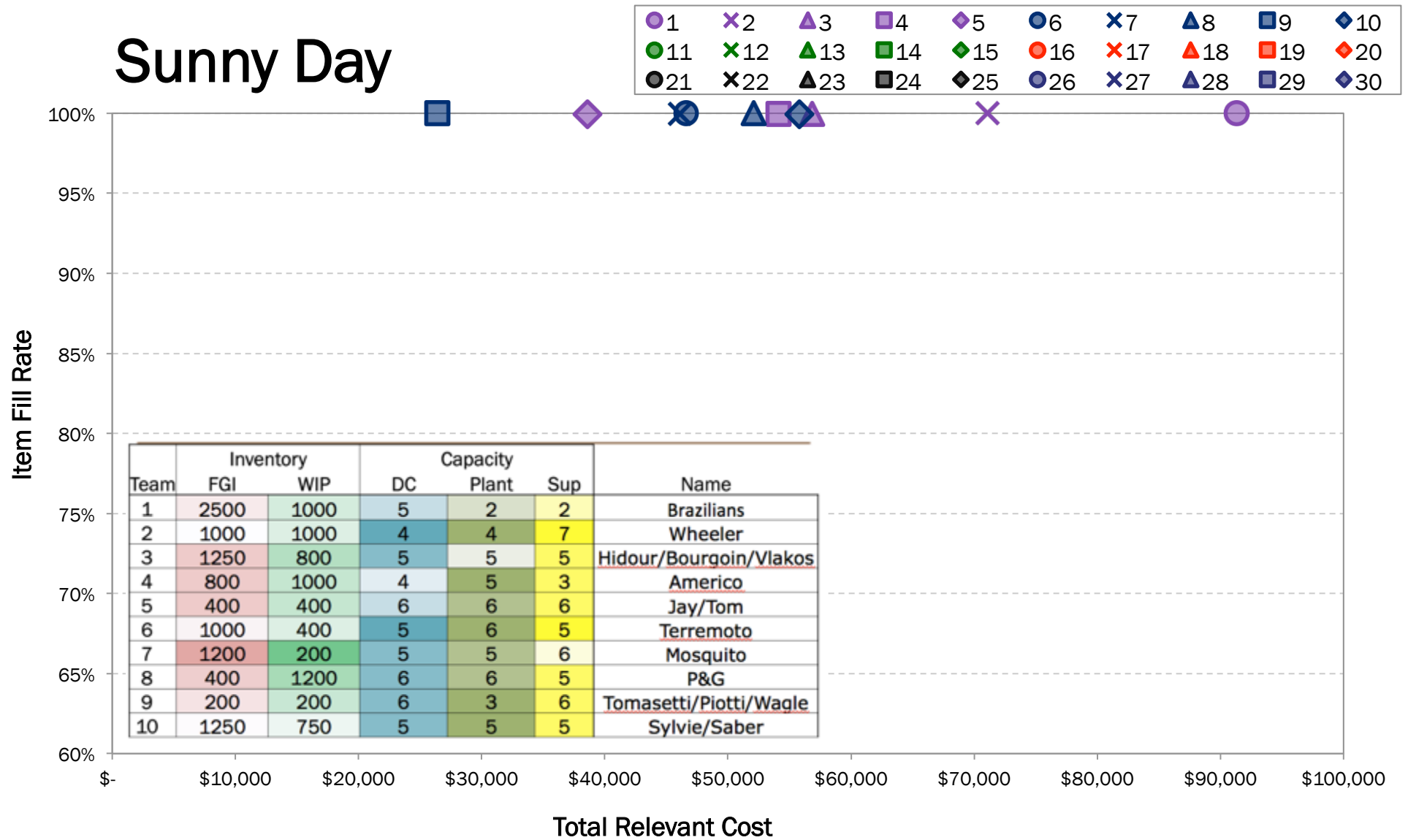
# Scenarios

Scenario	DC disruption			Plant disruption			Supplier disruption		
	Start	Duratr	Online	Start	Duratr	Online	Start	Duratr	Online
1	1	0	1	1	0	1	1	0	1
2	1	12	13	14	12	26	27	12	39
3	26	12	38	26	12	38	26	12	38
4	1	0	1	12	36	48	1	0	1
5	12	36	48	1	0	1	1	0	1
6	1	0	1	1	0	1	12	36	48
7	26	4	30	26	4	30	26	4	30
8	40	4	44	15	4	19	1	4	5
9	1	52	53	1	0	1	1	0	1
10	1	0	1	1	52	53	1	0	1

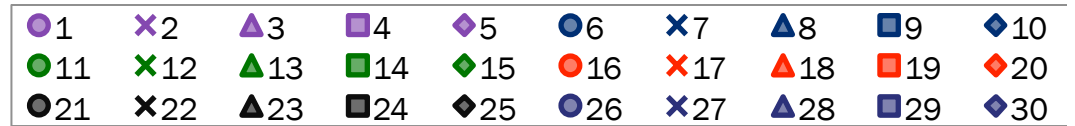
# Scenarios used to test policies

Scenarios -->	1	2	3	4	5	6	7	8	9	10
Sunny Day	100%	0%	0%	0%	0%	0%	0%	0%	0%	0%
Partly Sunny	82%	2%	2%	2%	2%	2%	2%	2%	2%	2%
Slightly Sunny	55%	5%	5%	5%	5%	5%	5%	5%	5%	5%
Slightly Cloudy	37%	7%	7%	7%	7%	7%	7%	7%	7%	7%
Very Cloudy	19%	9%	9%	9%	9%	9%	9%	9%	9%	9%
Nightmare	0%	11%	11%	11%	11%	11%	11%	11%	11%	12%
Short Overlapping	0%	0%	0%	0%	0%	0%	100%	0%	0%	0%
Supplier Down Longterm	0%	0%	0%	0%	0%	100%	0%	0%	0%	0%
DC Down Longterm	0%	0%	0%	0%	100%	0%	0%	0%	0%	0%
Even Probability	10%	10%	10%	10%	10%	10%	10%	10%	10%	10%

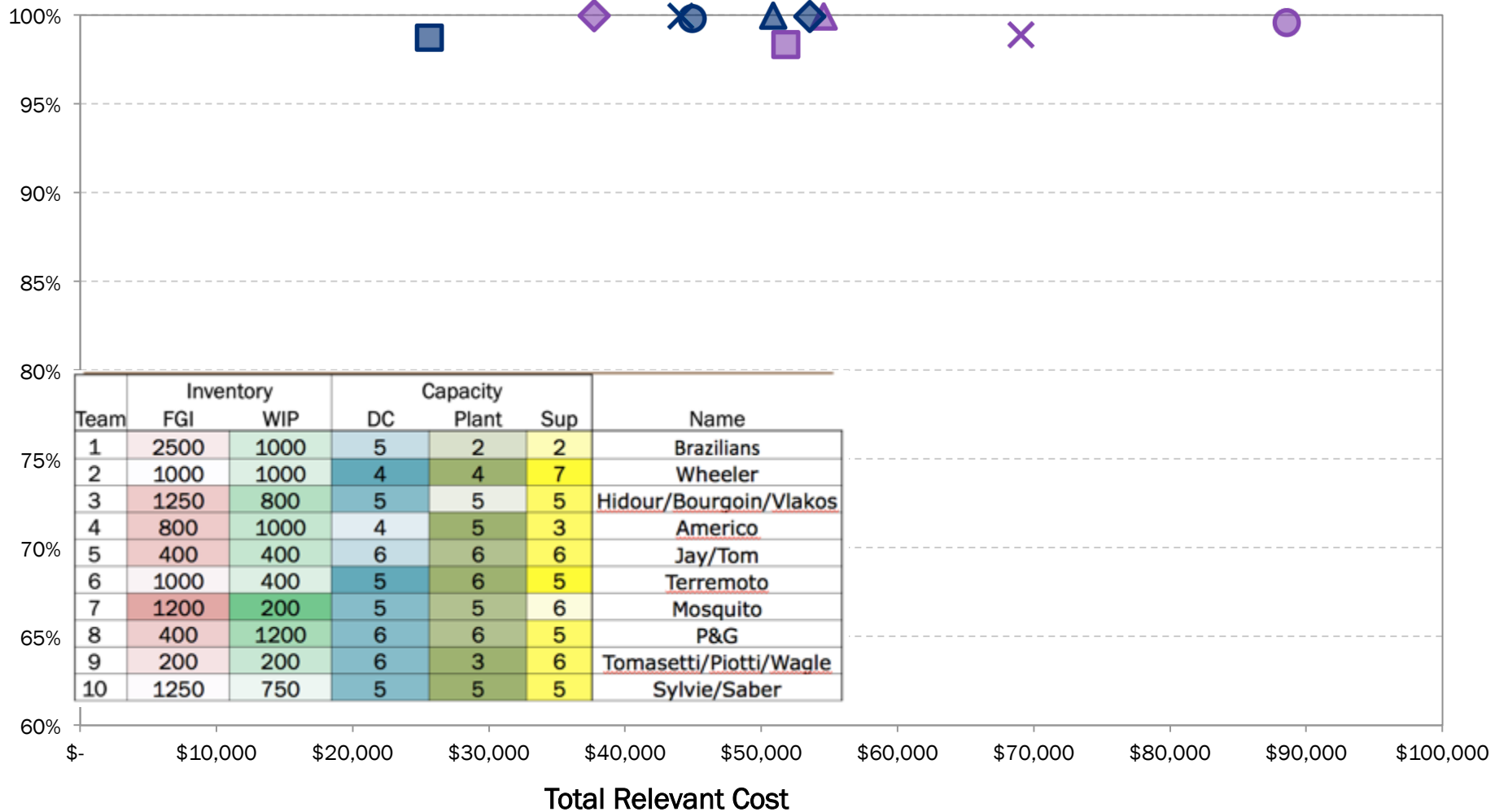
# Sunny Day



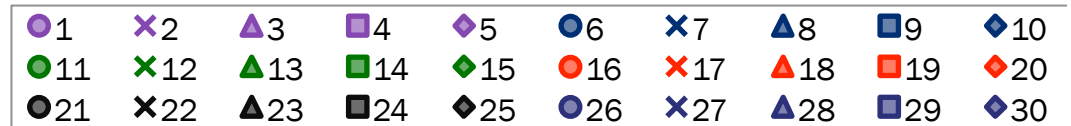
# Partly Sunny



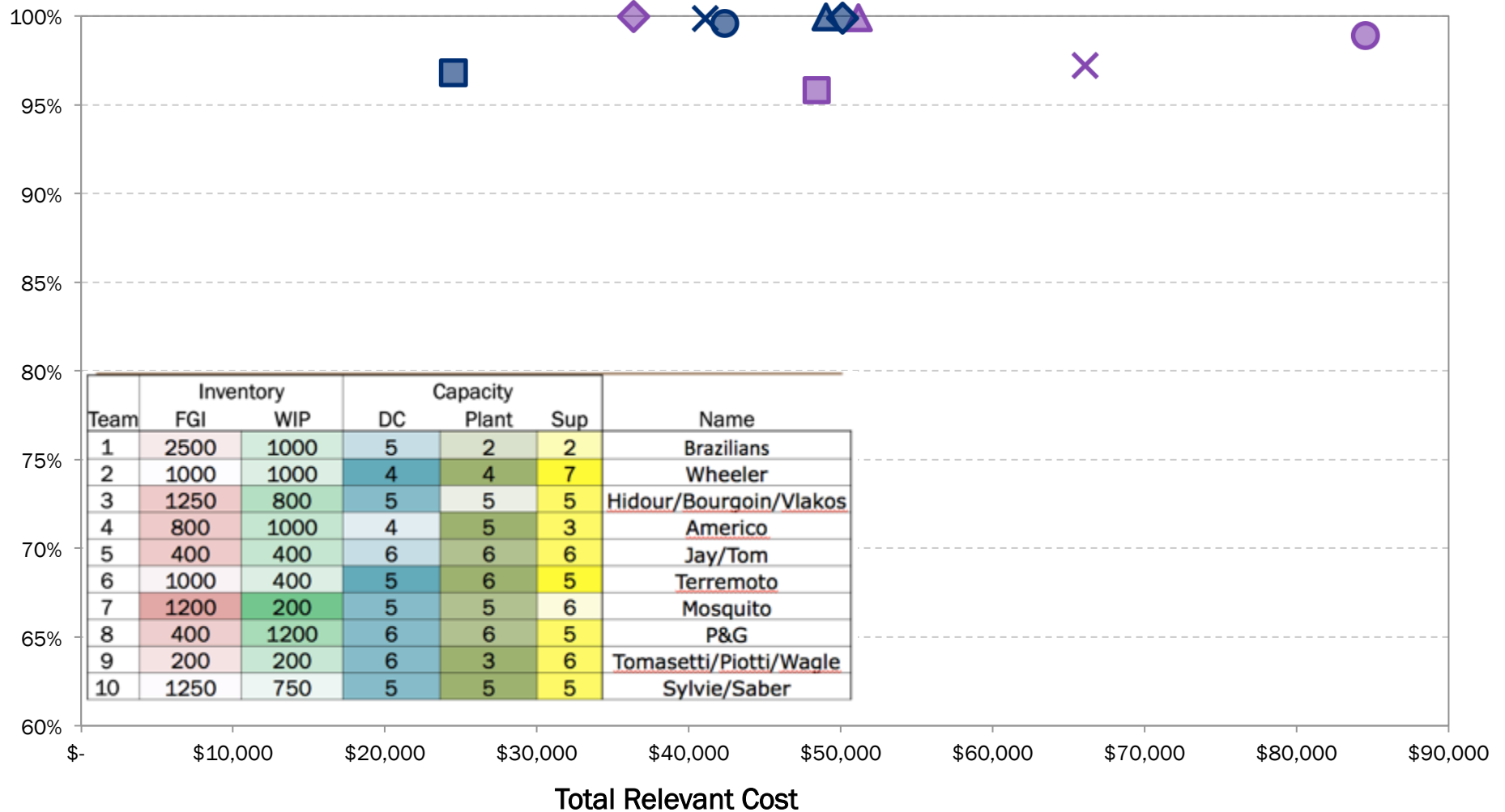
Item Fill Rate



# Slightly Sunny

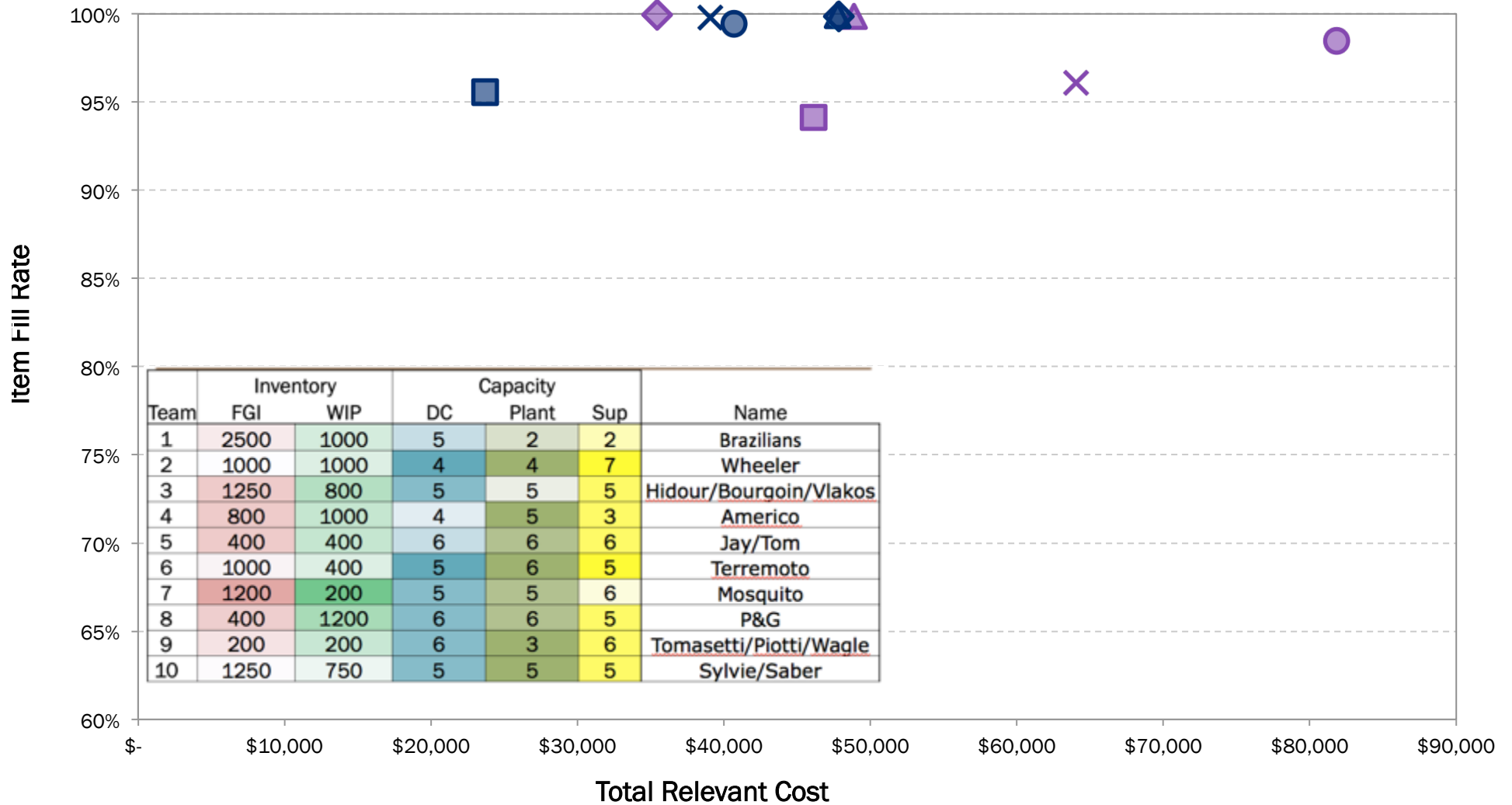
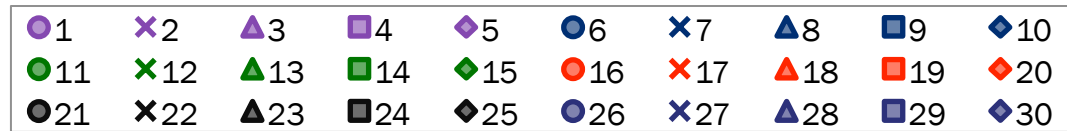


Item Fill Rate

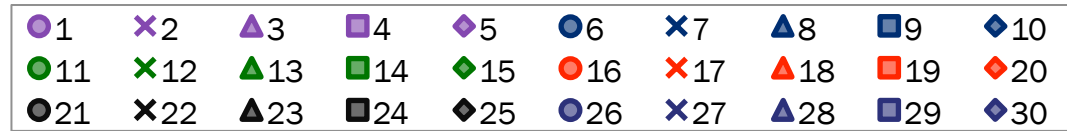




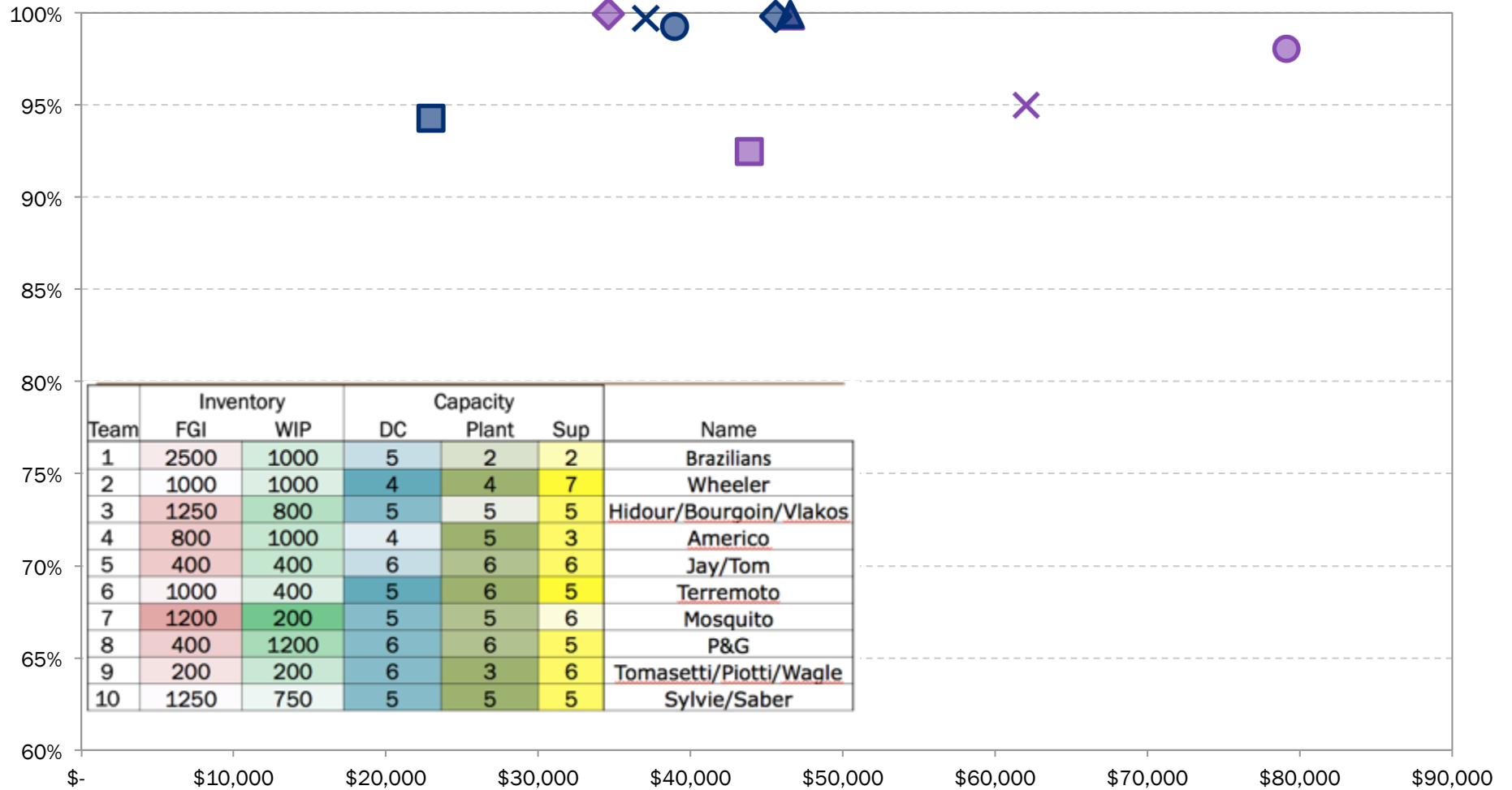
# Slightly Cloudy



# Very Cloudy

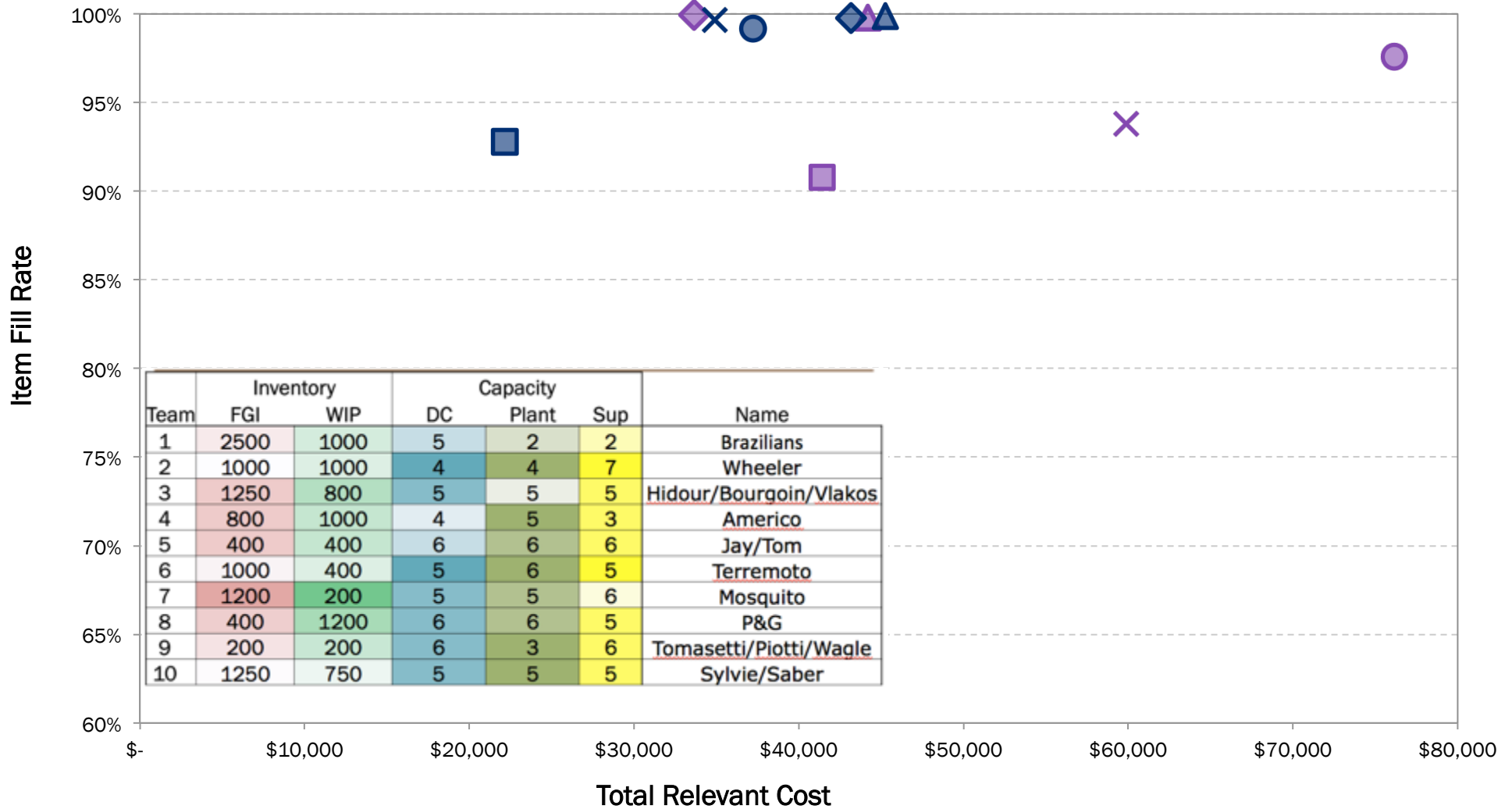
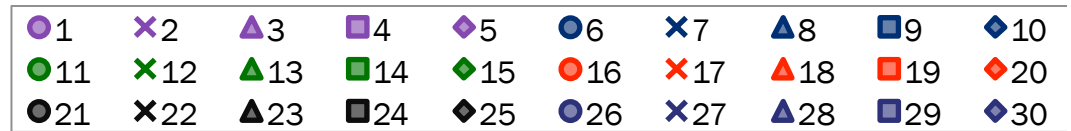


Item Fill Rate



Total Relevant Cost

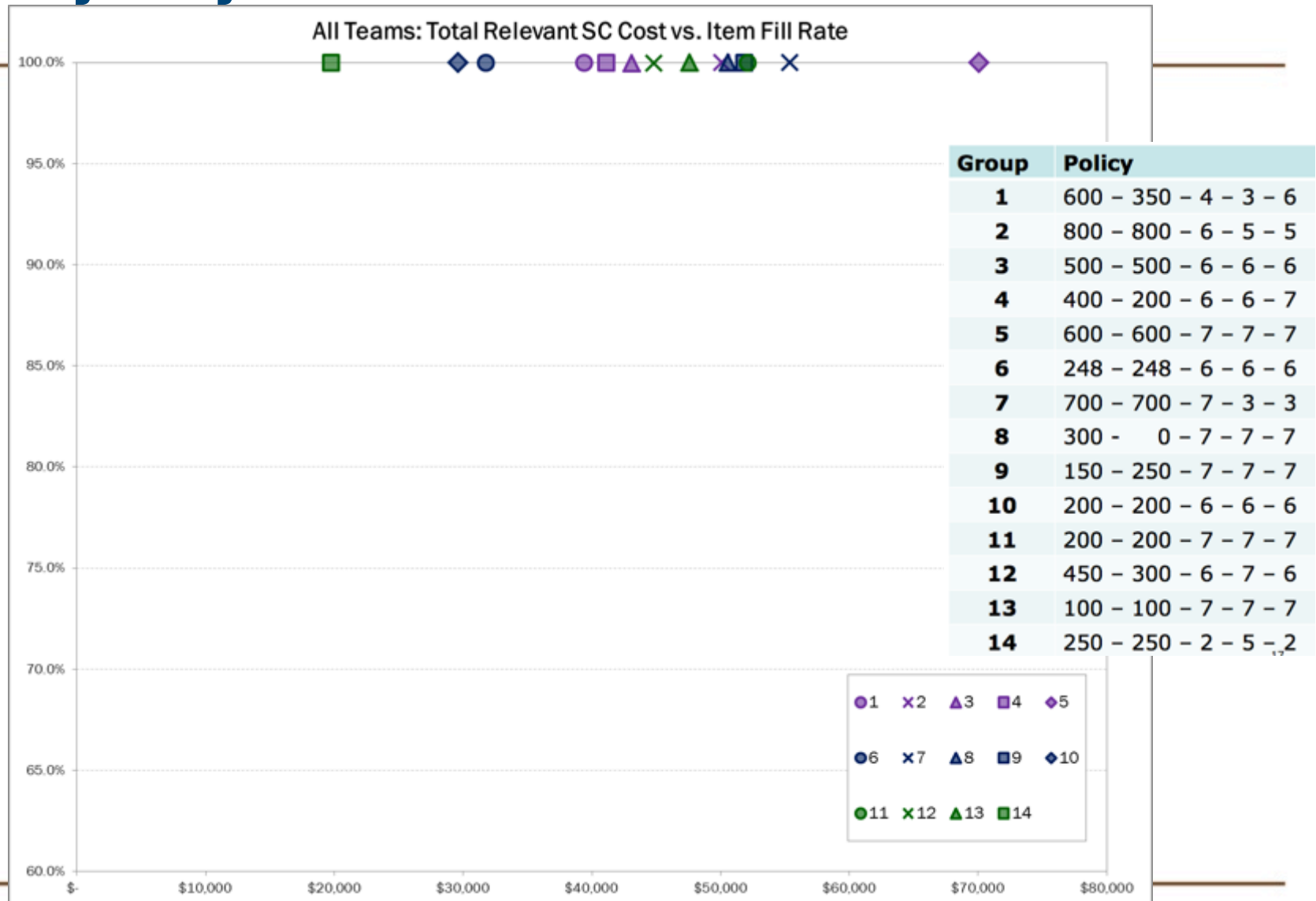
# Nightmare



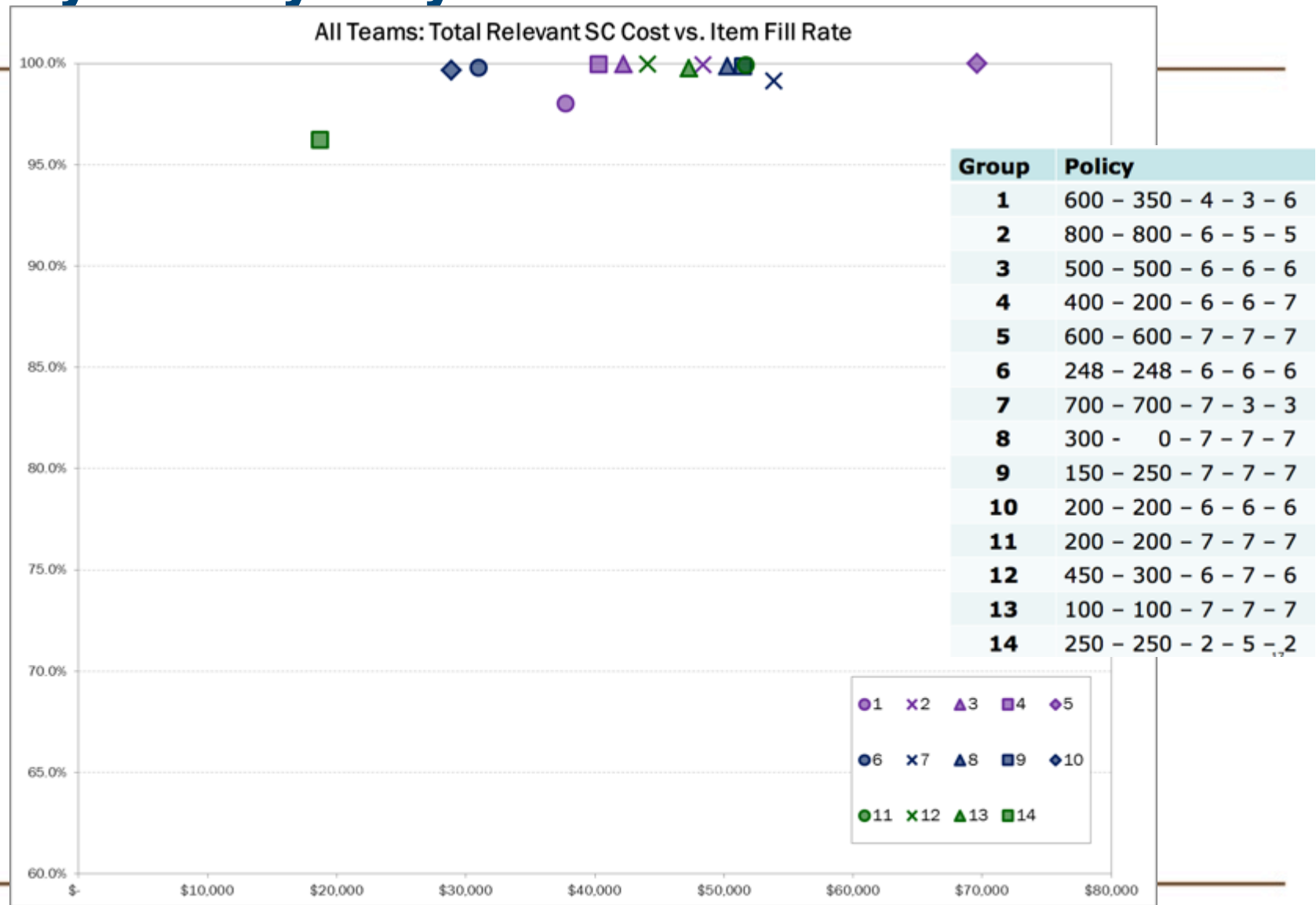
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# Older Runs

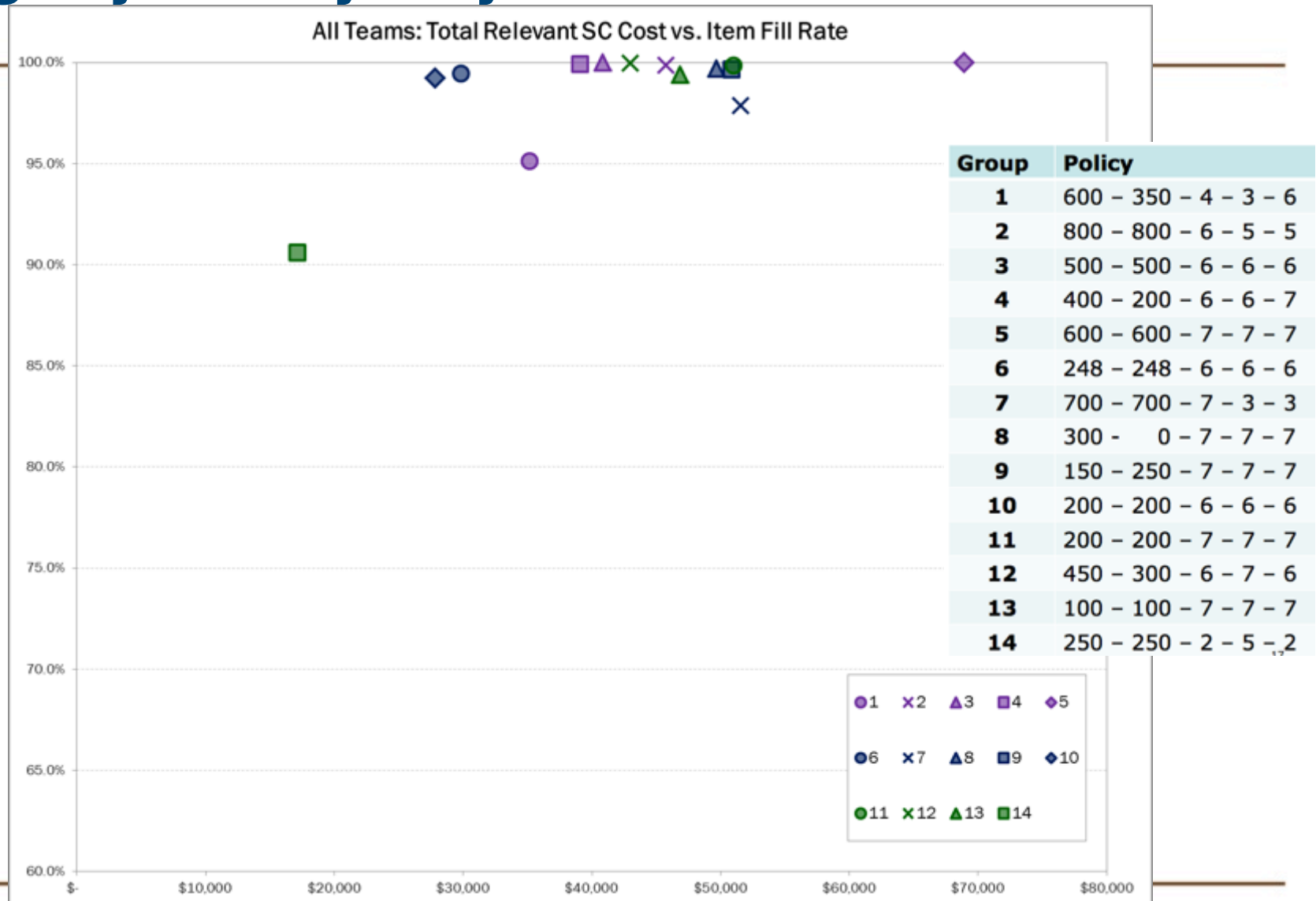
# Sunny Days Scenario



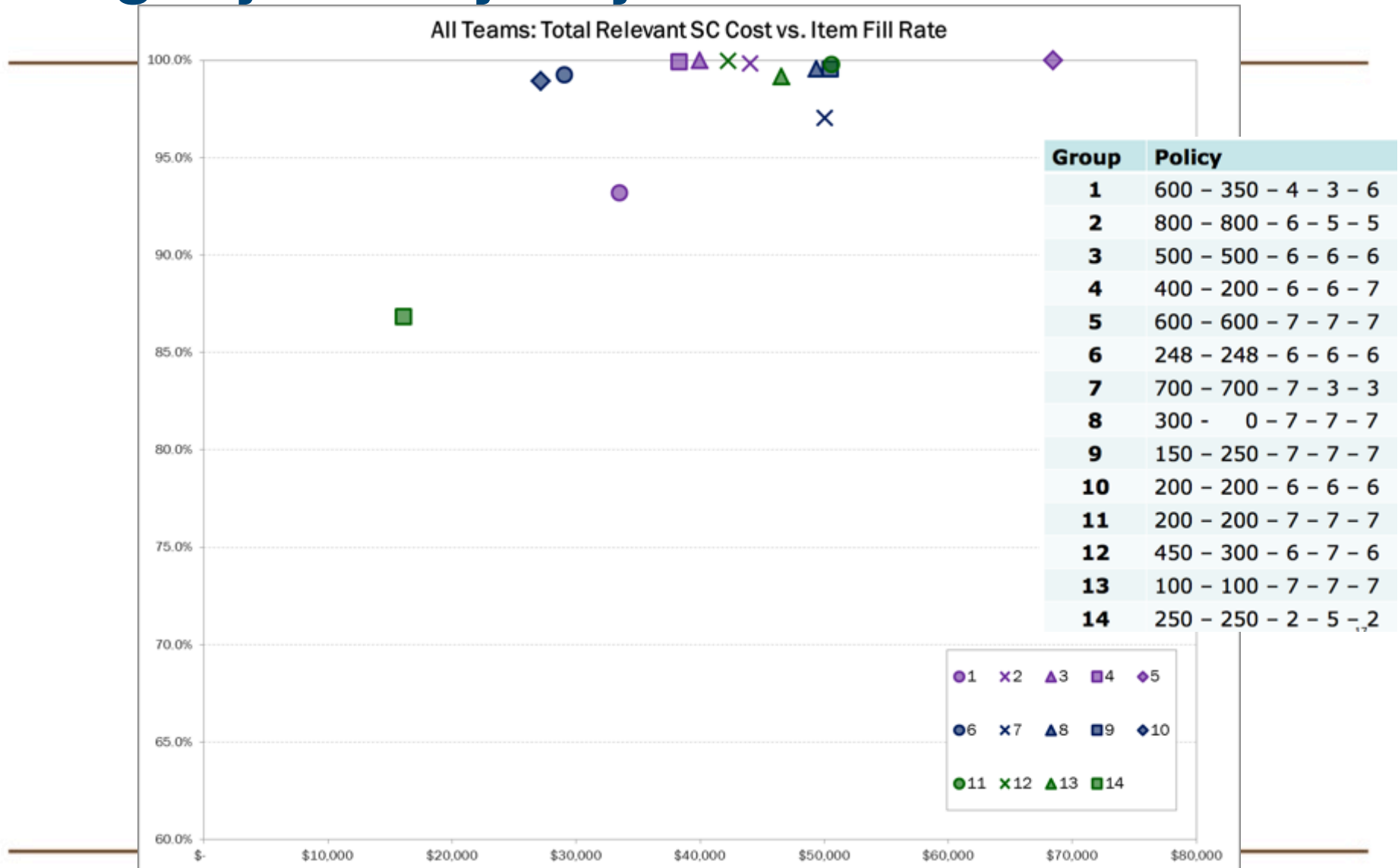
# Partly Sunny Days Scenario



# Slightly Sunny Days Scenario

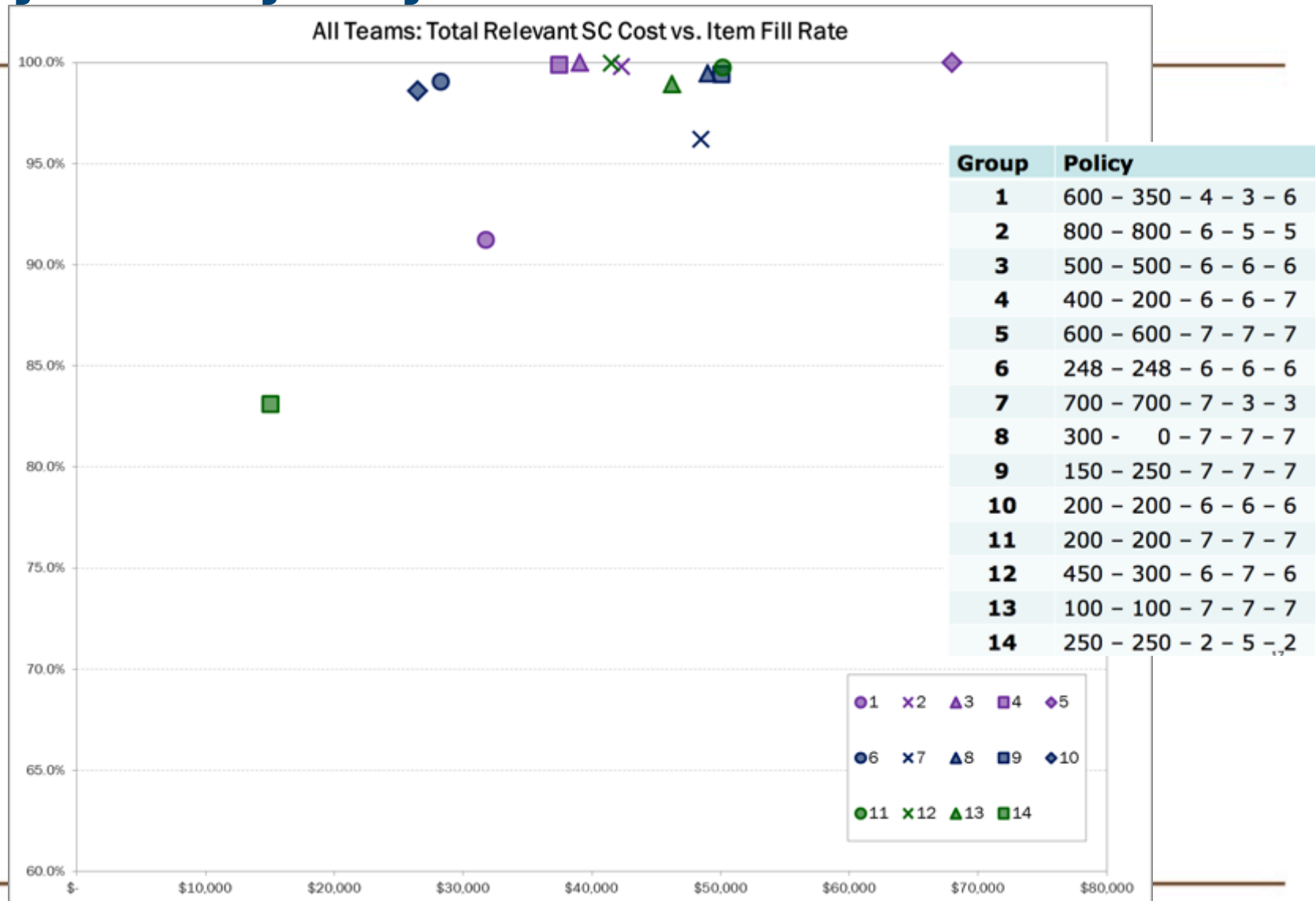


# Slightly Cloudy Days Scenario

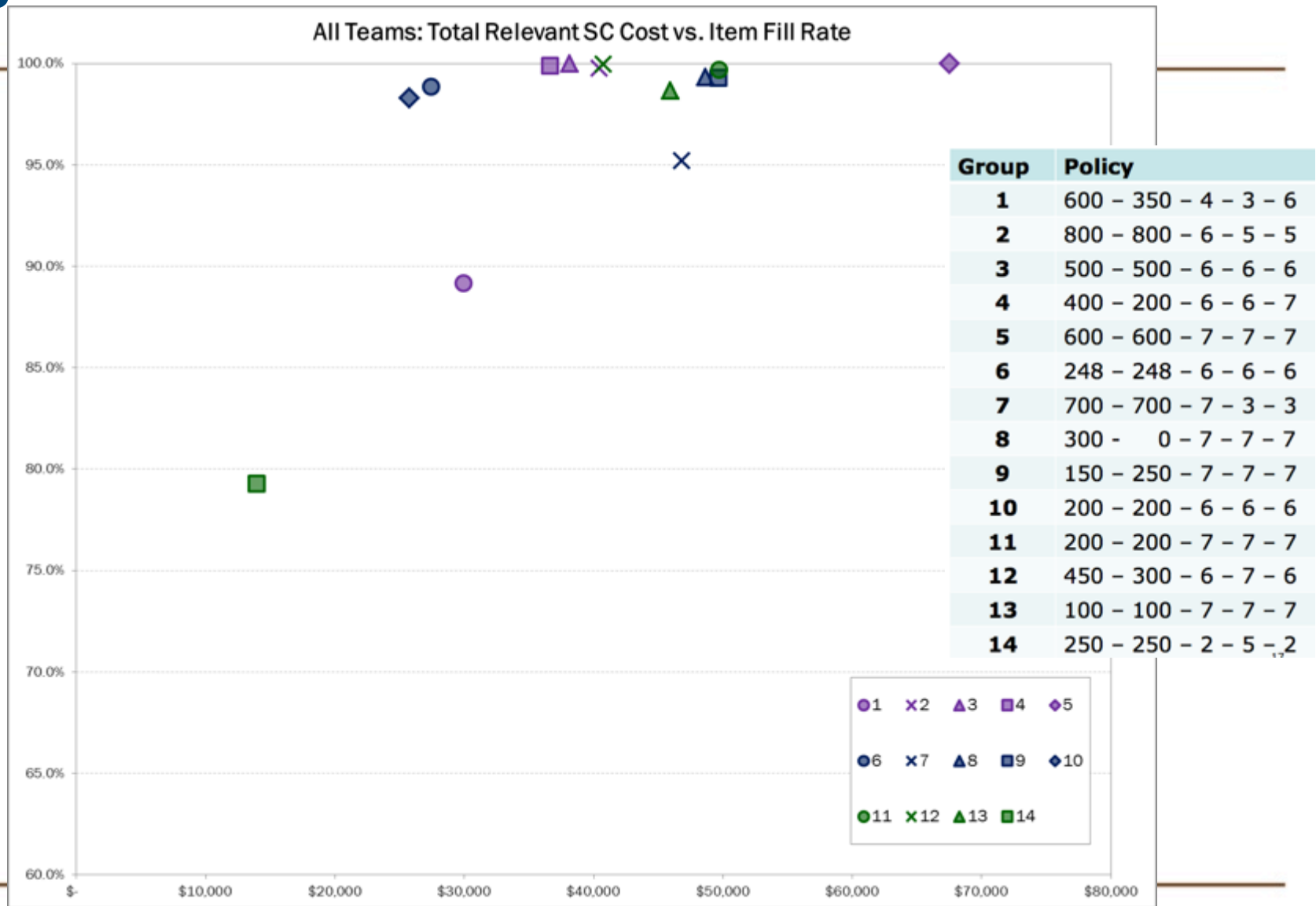




# Very Cloudy Day Scenario



# Nightmare Scenario



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## Thoughts?

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- What factors affect the performance?
- How can you improve your mitigation strategy?
- What did you learn from the game?

# Key takeaways: Mitigation policy

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- **Multiple ways to protect – at different costs**
  - Different policies do well under different scenarios
  - Test policies against a portfolio of scenarios
- **Scenario creation is an informed process**
- **Downstream matters more than Upstream**
  - For this supply chain – not necessarily universally true
  - DC protection helps mitigation Plant and Supplier failure
- **Combination of Redundancy & Flexibility**
  - Typically most reasonable approach is mixed
  - Redundant inventory covers before backup capacity activated
  - Flexibility (backup capacity) covers for longer term

# Supplementary reading

- Amanda J. Schmitt. *Strategies for customer service level protection under multi-echelon supply chain disruption risk*, Transportation Research Part B 45 (2011) 1266–1283.
- Amanda J. Schmitt, Mahender Singh. *Quantifying supply chain disruption risk using Monte Carlo and discrete-event simulation*, Proceedings of the 2009 Winter Simulation Conference, 1237-1248.
- Amanda J. Schmitt, Mahender Singh. *A Quantitative Analysis of Disruption Risk in a Multi-Echelon Supply Chain*.
- Amanda J. Schmitt. *Learning how to manage risk in global supply networks*, white paper, Aug. 2009.
  - Global supply chain risk management. MIT CTL white paper

