



# Supply chains and variability

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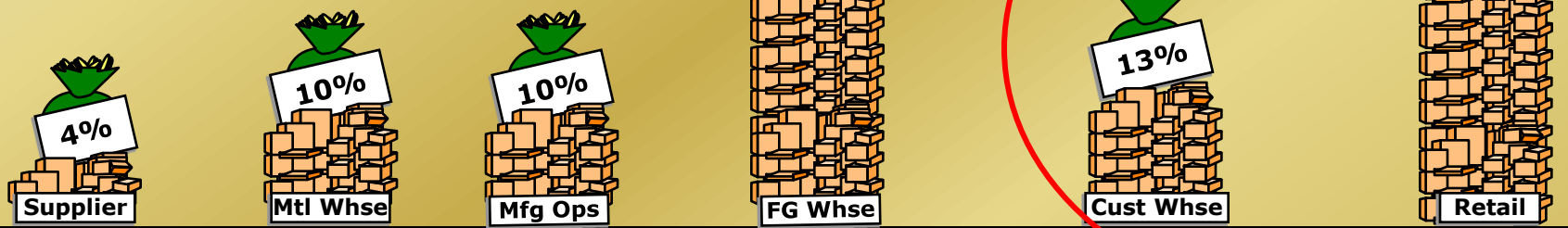


# Supply Chain Management

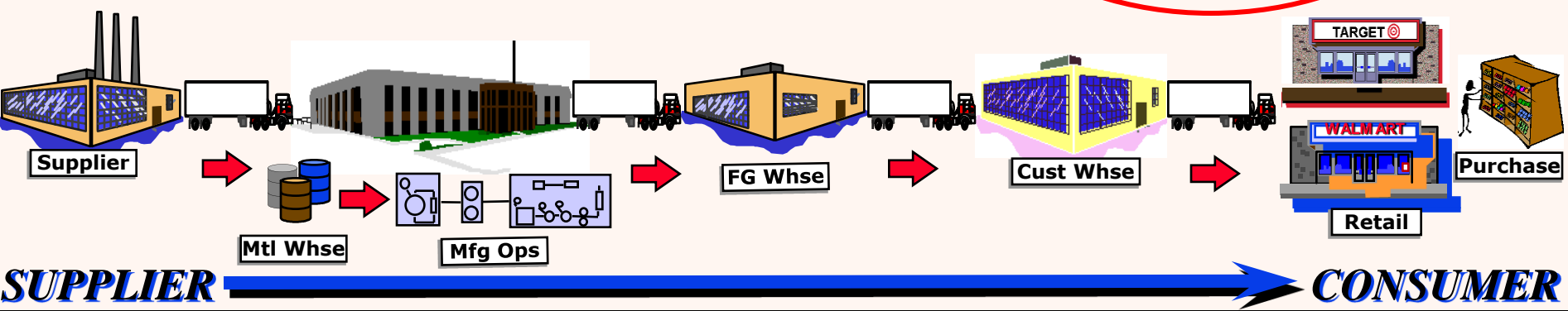
- SCM is a set of approaches utilized to **efficiently integrate** suppliers, manufacturers, warehouses, and stores, so that merchandise is produced and distributed at the **right quantities**, to the **right locations**, and at the **right time**, in order to **minimize system-wide costs** while satisfying **service level requirements**

# The Cosmetics Supply Chain

## The Inventory

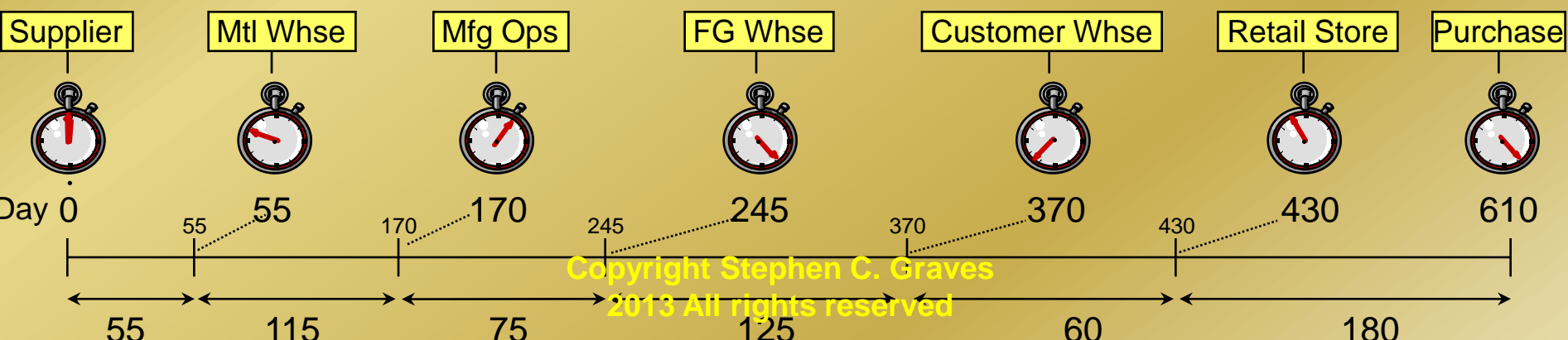


## The Chain



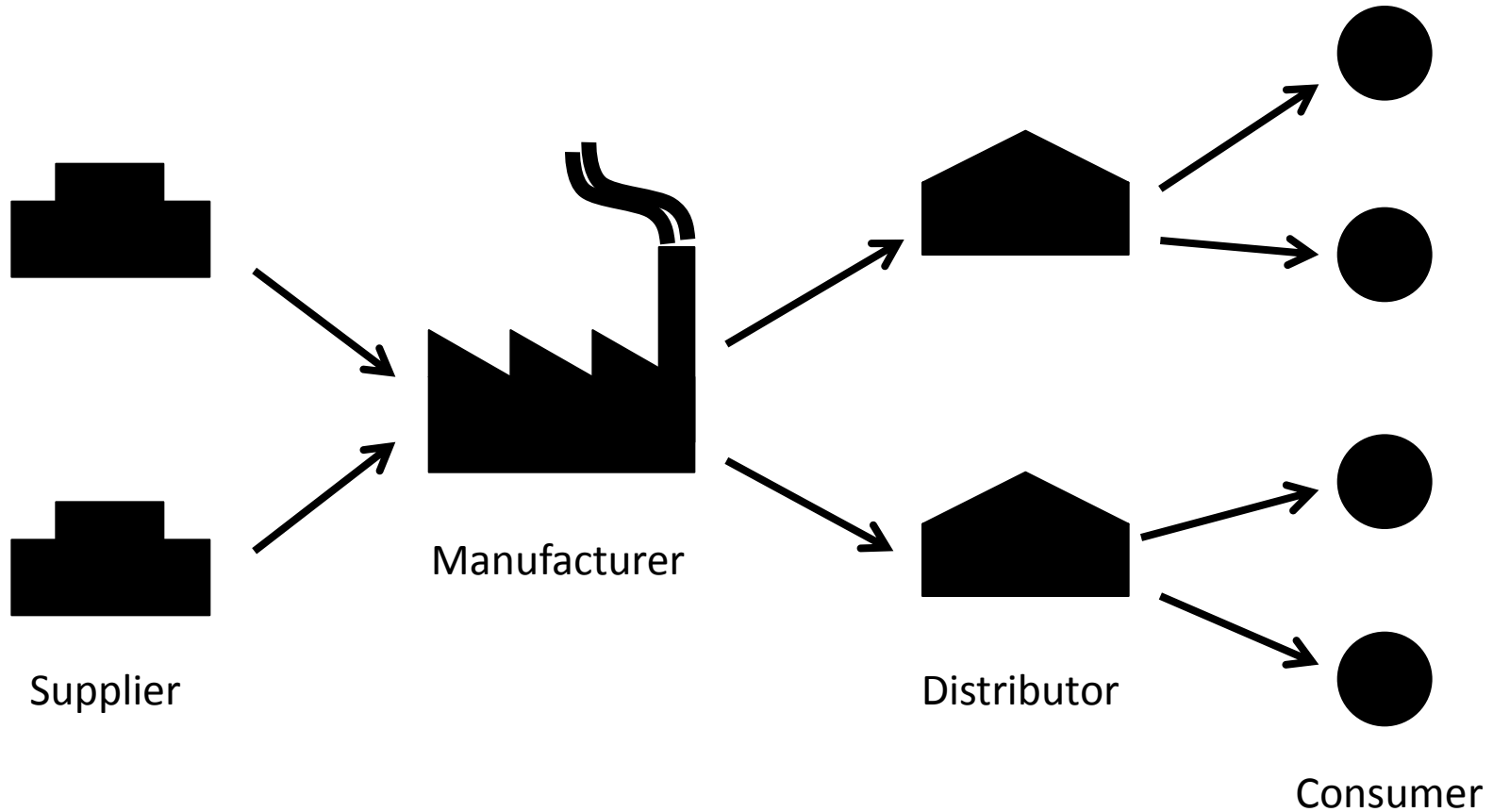
## The Time

Total = 610 days



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# What makes SCM difficult?





# Types of variability

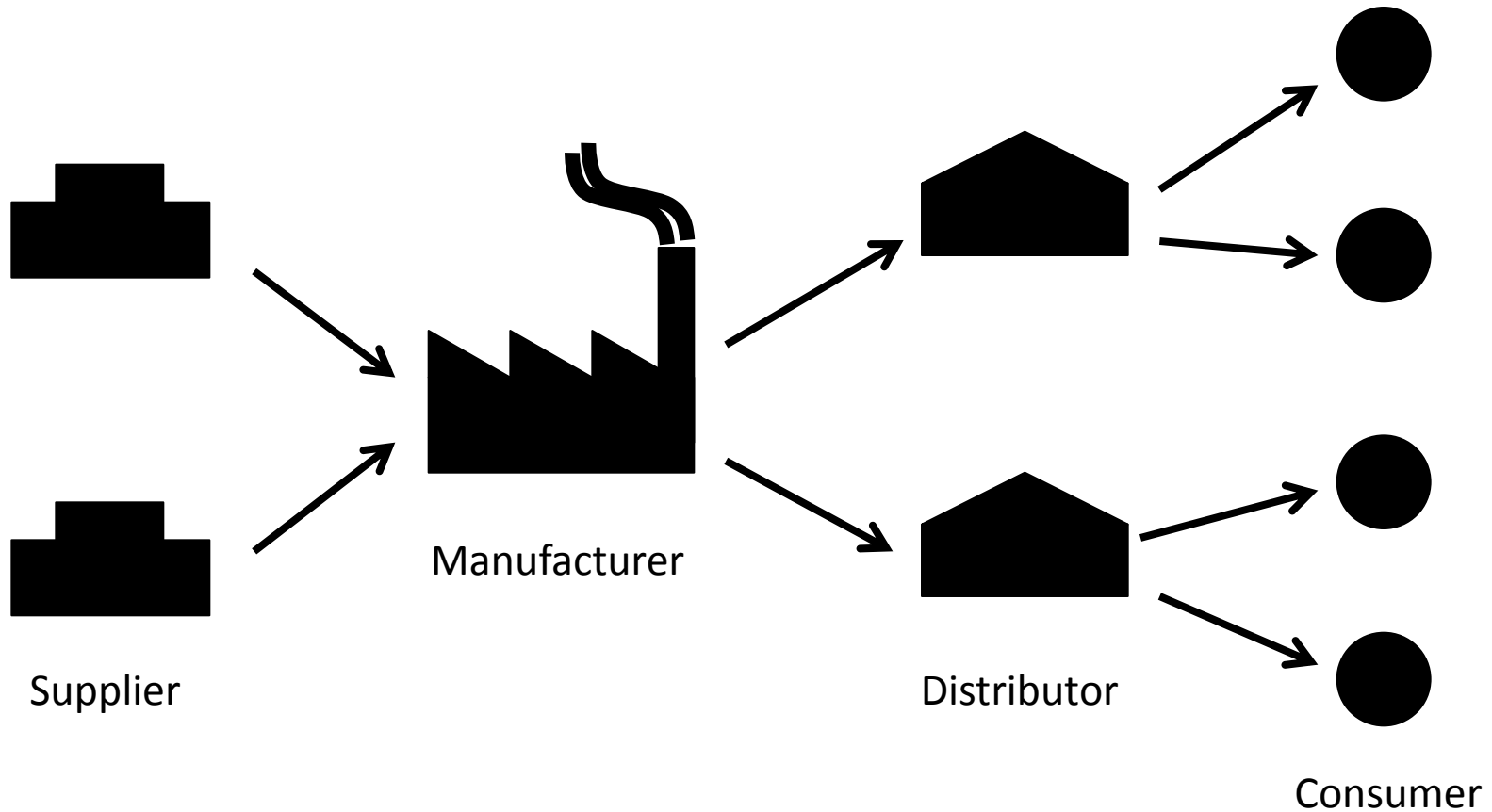
- Demand: volume, mix
- Process: yield, cycle time
- Procurement: yield, lead time, quality



# Other types of variability

- Rare and disruptive events (versus nominal variability)
- “predictable” variability, eg, cyclic patterns (versus probabilistic variability)
- Self-induced variability, eg, demand amplification (versus exogenous)

# How do SCs cope with variability?





# Counter measures: Buffers

- Buffers: inventory, capacity, time
- **Inventory** can be held across SC
- Reserved or underutilized **capacity** provides response option
- Increased process flow **time** or customer service **time** creates time window to balance supply and demand





# Counter measures: Tactics

- Product/process design to permit delayed differentiation
- Smoothing to dampen variability propagation
- Dual sourcing (& expedited shipping) to provide quick response options
- Inventory pooling
- Better forecasts, avoid distortions and delays.



# Dealing with variability: examples

- Safety stock location in a SC
- Delayed differentiation in a SC
- Dual sourcing
- Better forecast
- Smoothing and line segmentation

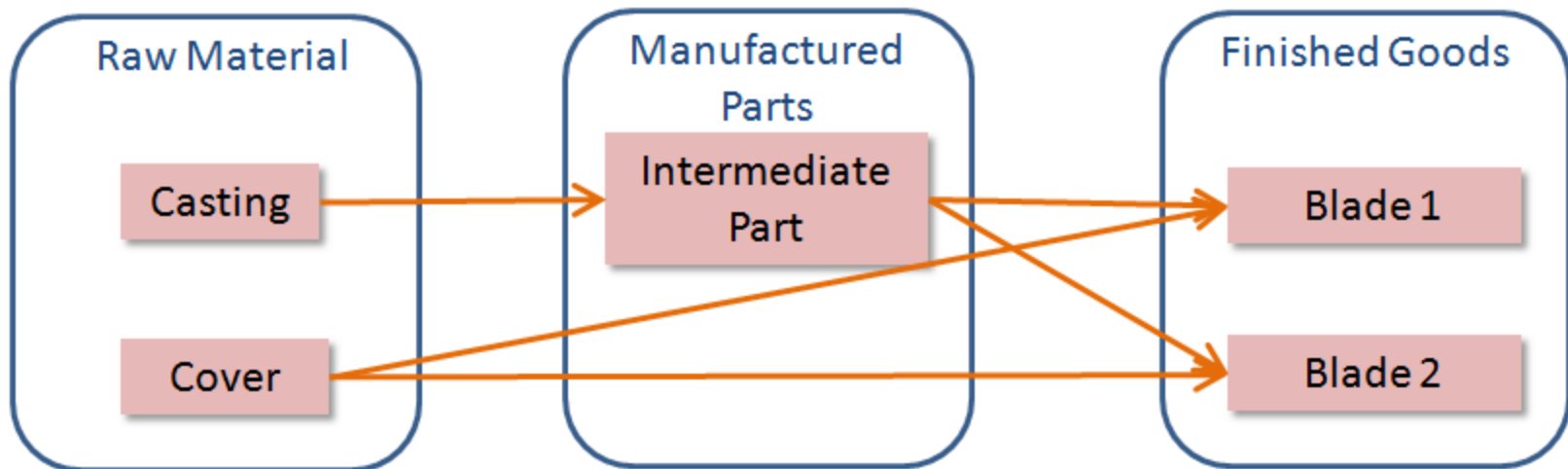


# Example

- Safety stock optimization in a supply chain
- Key concept:
  - Inventory depends on demand variability over replenishment lead-time  $LT$
  - Demand variability over replenishment  $LT$  proportional to  $\sqrt{LT}$

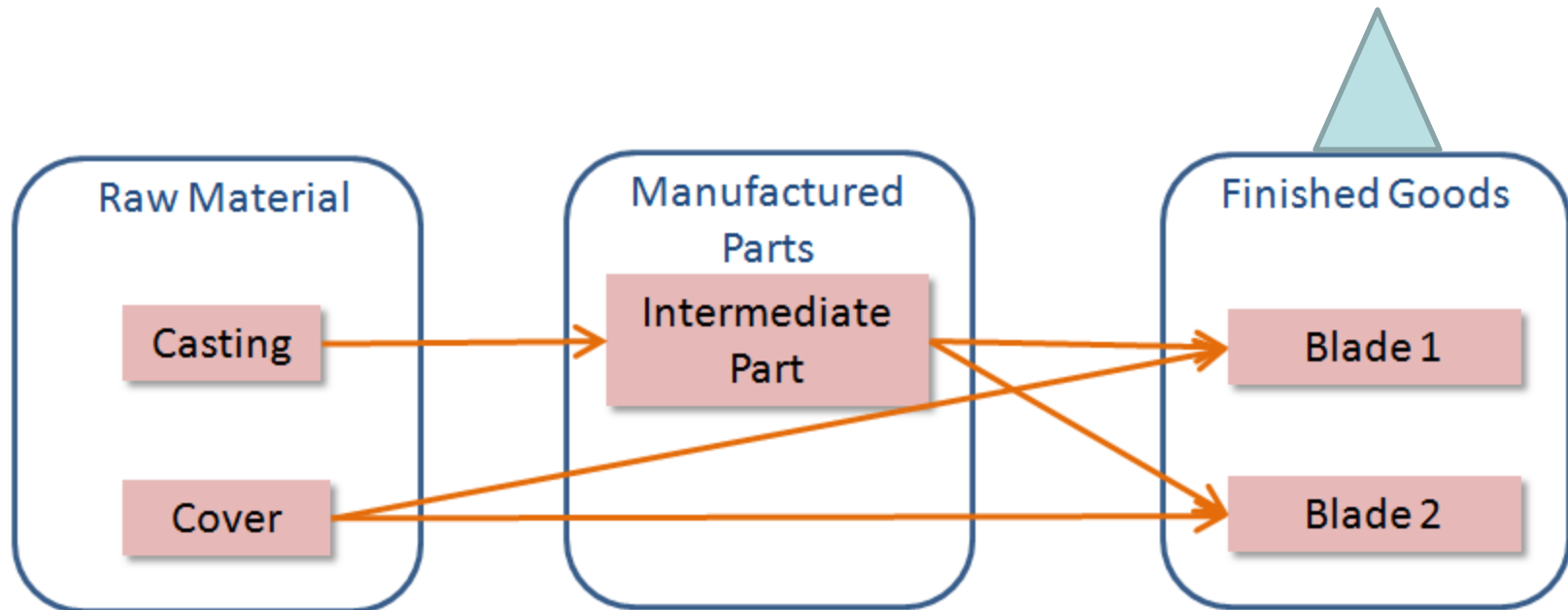
# Supply Chain Example

<u>Part</u>	<u>Part Value</u>	<u>Lead Time (weeks)</u>
Blade 1	\$400	4
Blade 2	\$425	4.5
Intermediate Part	\$250	2
Cover	\$2	1
Casting	\$75	8



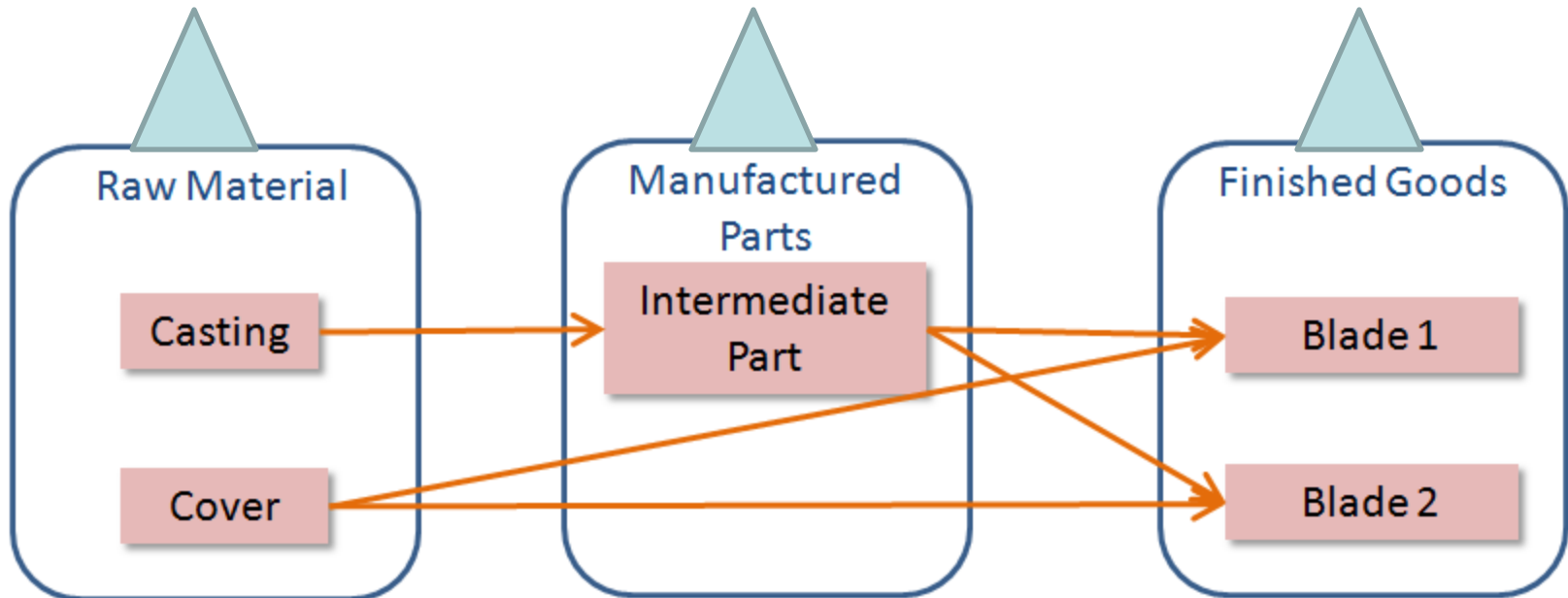
# Hold only FGs; total inventory = \$189,000

Part	Part Value (\$)	Lead Time (weeks)	Service Time (weeks)	Safety Stock (units)	Safety Stock Value (\$)
Blade 1	\$400	4	0	150	60,000
Blade 2	\$425	4.5	0	305	129,000
Intermediate Part	\$250	2	10	0	0
Cover	\$2	1	1	0	0
Casting	\$75	8	8	0	0



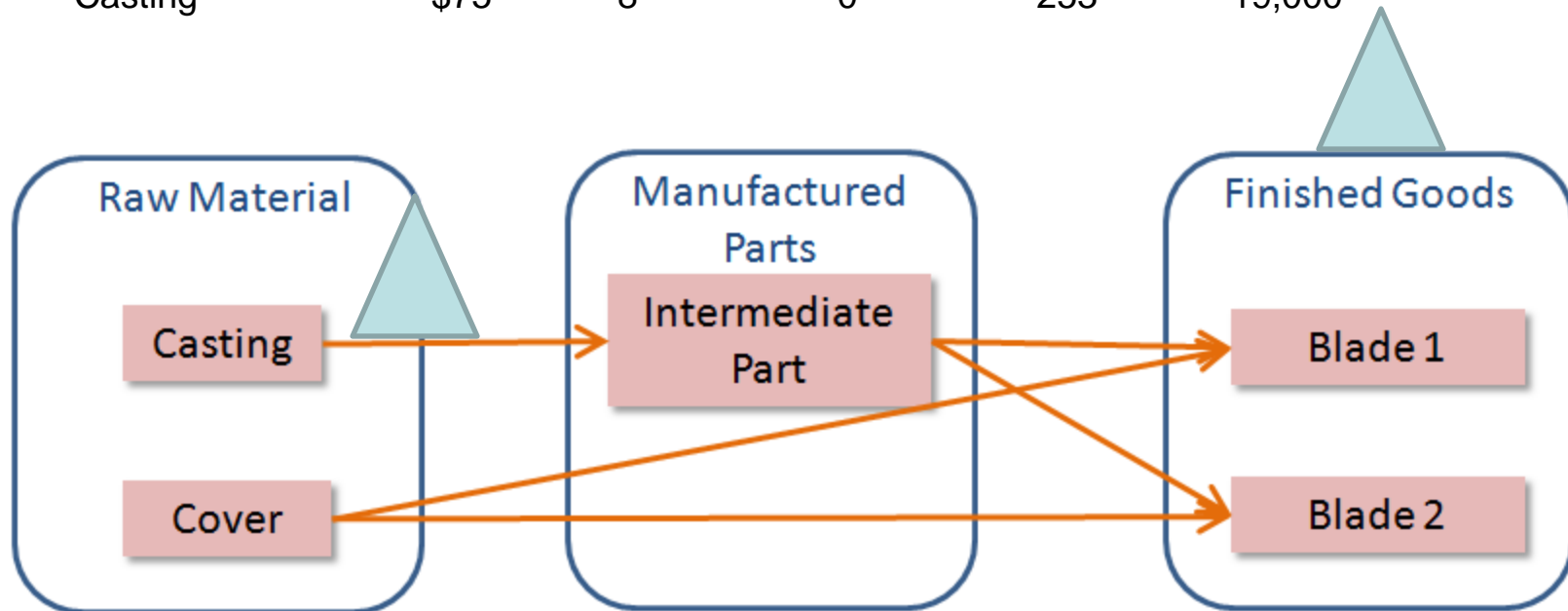
# Hold SS at each stage; total inventory = \$136,000

Part	Part Value (\$)	Lead Time (weeks)	Service Time (weeks)	Safety Stock (units)	Safety Stock Value (\$)
Blade 1	\$400	4	0	80	32,000
Blade 2	\$425	4.5	0	170	72,000
Intermediate Part	\$250	2	0	126	32,000
Cover	\$2	1	0	89	200
Casting	\$75	8	0	253	19,000



# Optimal SS strategy – hold castings; total inventory = \$126,000

Part	Part Value (\$)	Lead Time (weeks)	Service Time (weeks)	Safety Stock (units)	Safety Stock Value (\$)
Blade 1	\$400	4	0	98	39,000
Blade 2	\$425	4.5	0	204	87,000
Intermediate Part	\$250	2	2	0	0
Cover	\$2	1	1	0	0
Casting	\$75	8	0	253	19,000





# Example

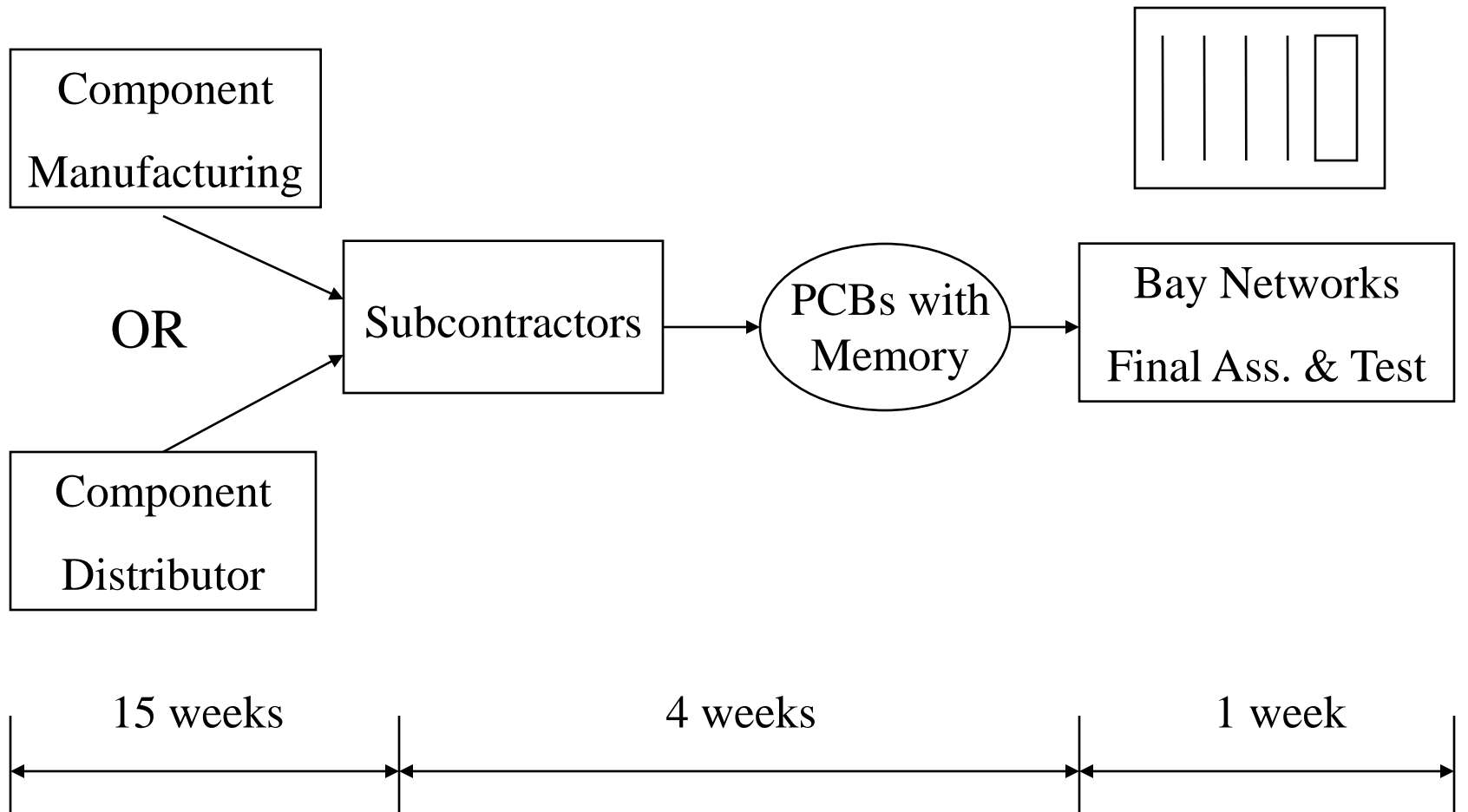
- Delayed product differentiation
- Key Concept
  - Pooling reduces variability



$$\sigma_{A+B} < \sigma_A + \sigma_B$$



# Example: Bay Networks



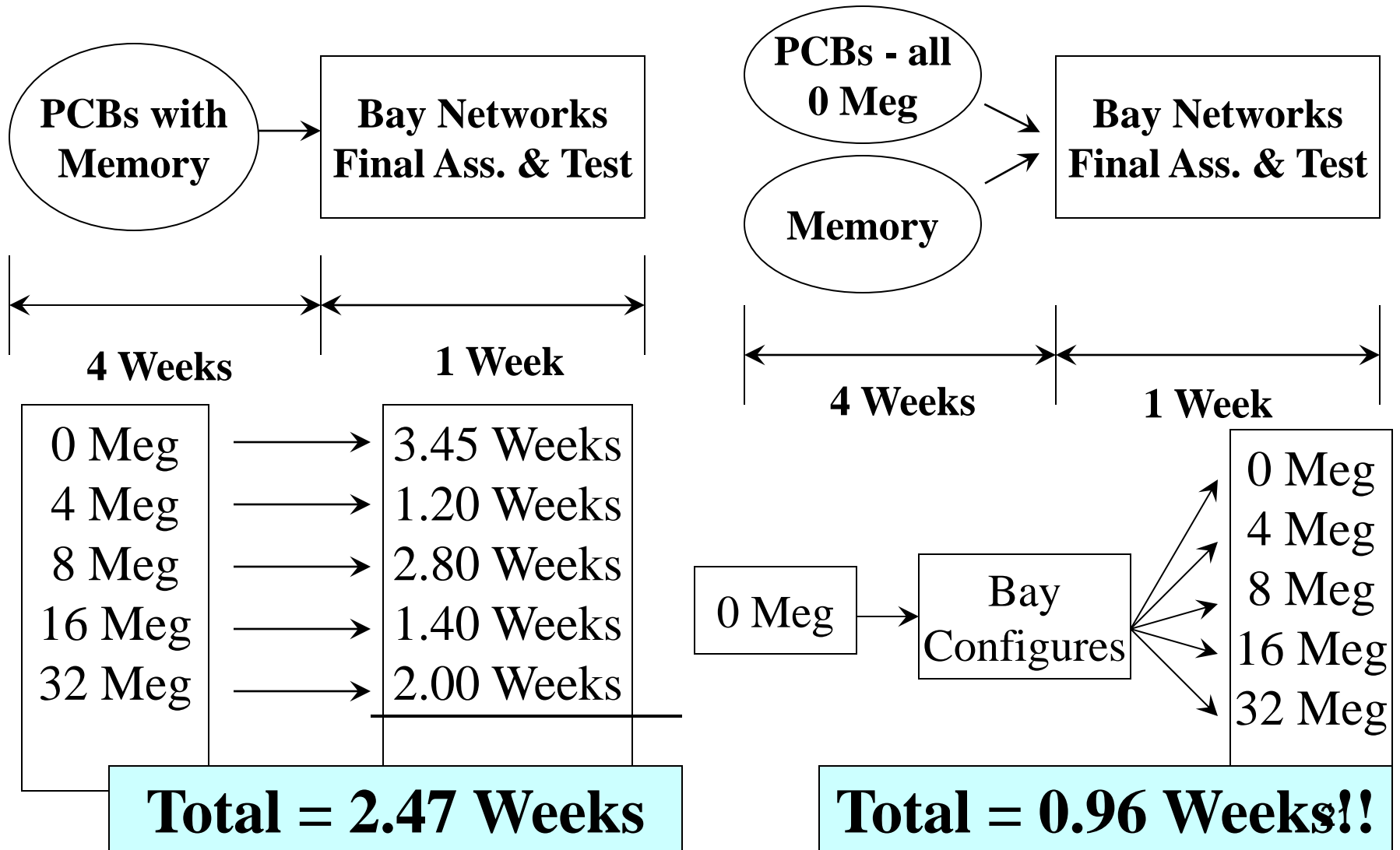
# Risk Pooling of PCB's decreases demand uncertainty

Individual memory flavors are highly volatile as evidenced by the quarterly forecast error.

**Aggregating or Risk-Pooling the PCB's by configuring memory later in the process decreases forecast error and required safety stock!**

PCB Model	Ave. Forecast % Error	Next Qtr Forecast (Units)	Service Level Fraction from inventory	Material Safety Stock (Units)	Material Safety Stock (%)
ENET MTR 0	37%	730	.83	210	28.7
ENET MTR 4M	13%	500	.83	49	9.7
ENET MTR 8M	30%	6000	.83	1396	23.3
ENET MTR 16M	15%	1800	.83	204	11.4
ENET MTR 32M	21%	60	.83	10	16.4
<b>AGGREGATE</b>	<b>10%</b>	<b>9090</b>	<b>.83</b>	<b>730</b>	<b>8.0</b>

# Bay Networks' new process



# Substantial dollar value reduction

Original Scenario

*Safety Stock for EACH configuration*

Safety Stock = \$934,500.00

With Delayed Differentiation

*Safety Stock for GENERIC configuration*

Safety Stock = \$365,000.00



**This Methodology can be applied to 6 other multi-memory flavored motherboards for additional savings.**

# Planning Question

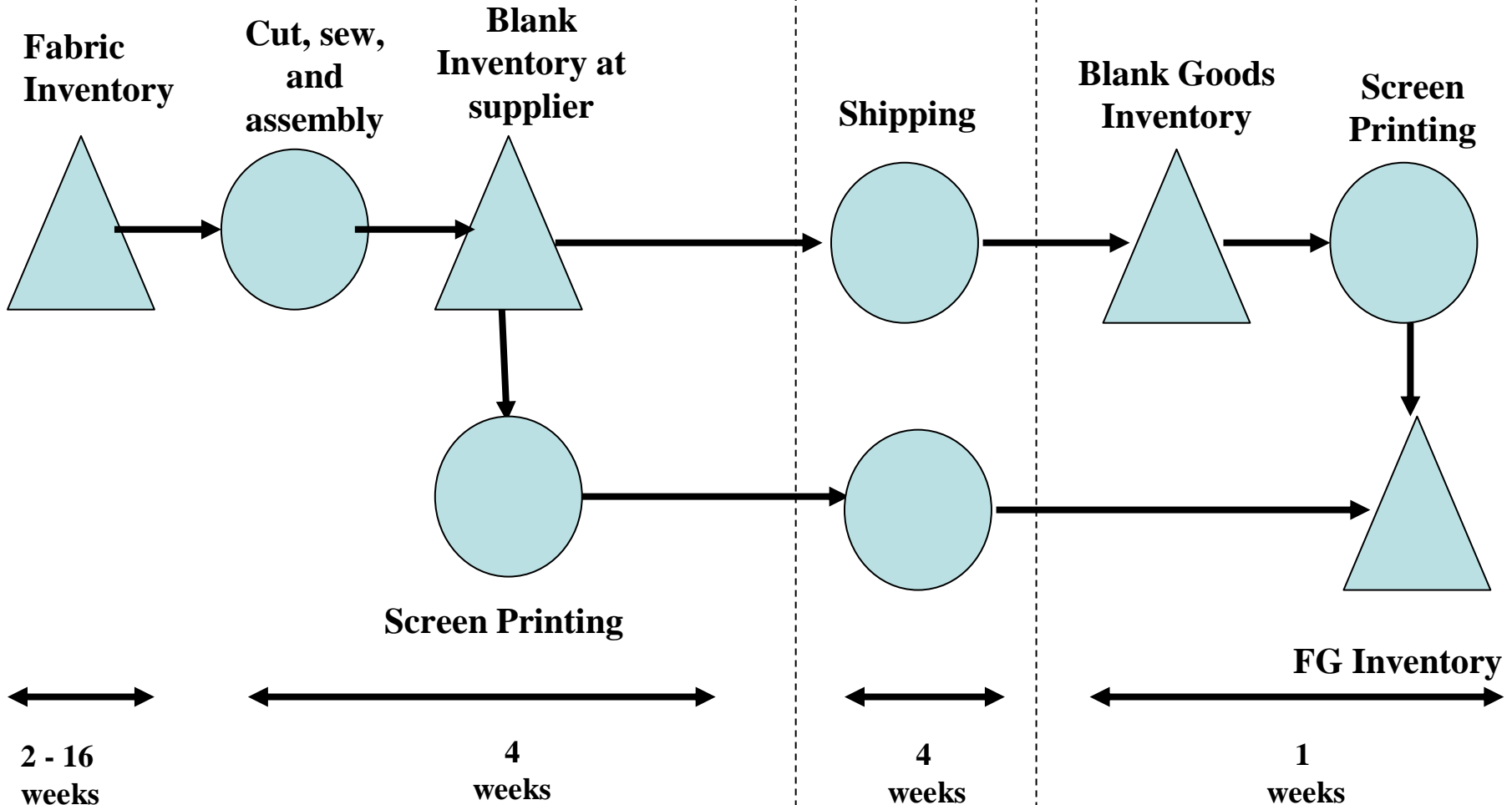
- How should Reebok plan and manage inventory to manage costs while providing the flexibility required to meet demand for NFL Replica jerseys?



# Internal Supply Chain

**Contract Manufacturers (CM)**

**Reebok (Indianapolis)**





# Example

- Dual sourcing, e.g., via two transportation modes
- Key Concept
  - Option value from time-cost tradeoff

# Background

- Camera production moved to Asia, mostly to sub-contractors
- Long transit times – 5-7weeks by ocean, 1-2 weeks by air
- Primary customers are major retailers (e.g. Walmart); each has individual packaging requirements
- Product postponement occurs in US DC's

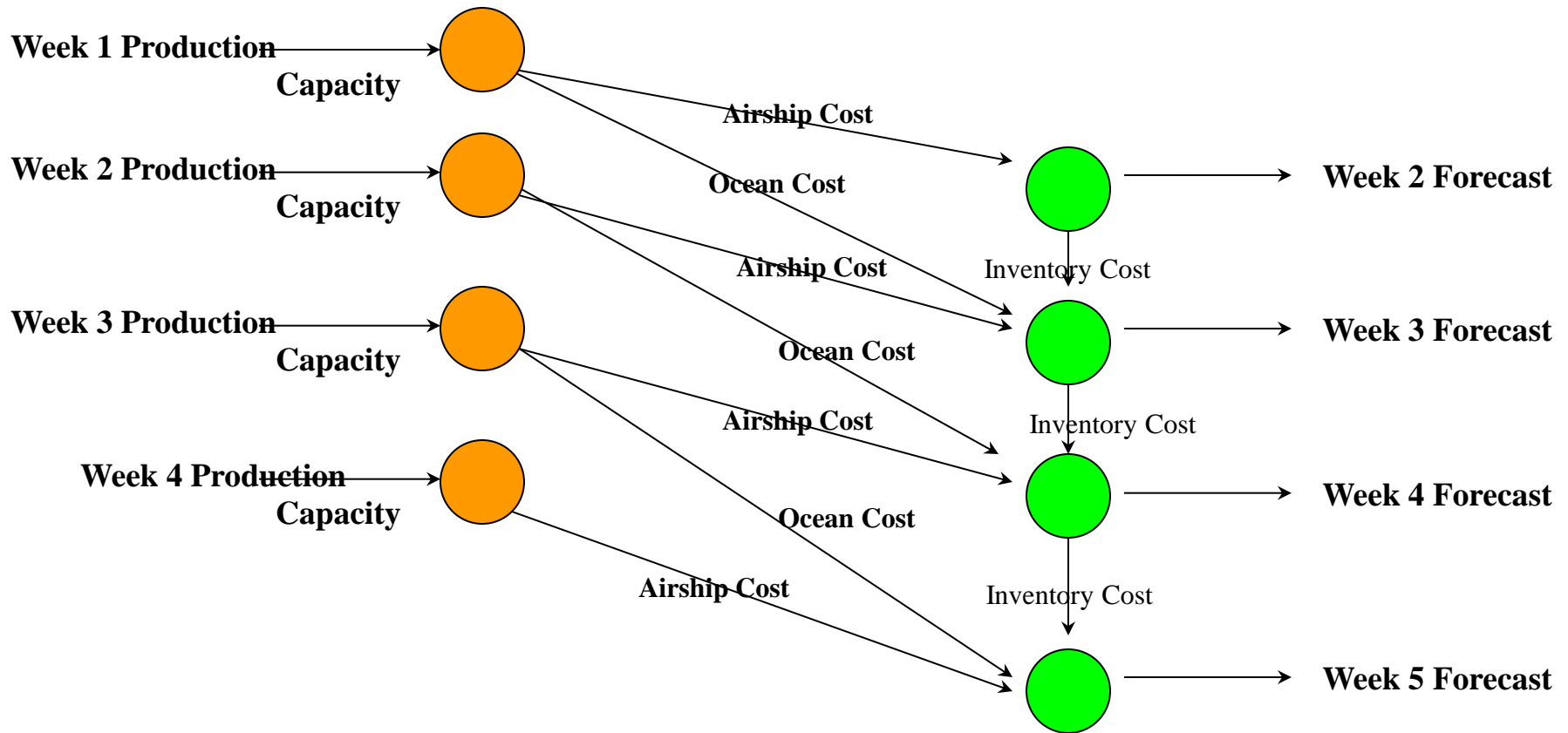


# Background

- Large forecast errors for new products
- New products shipped by air initially to fill pipeline, to meet launch dates, to keep inventory low
- Production capacity constraints due to long lead times for tooling and components

# Model Description

## NETWORK STRUCTURE (Min-cost, Max-Flow)



# Findings

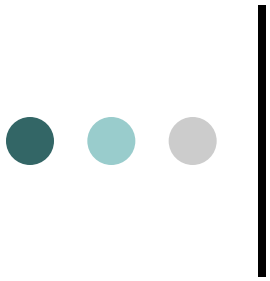
- Model can save transportation costs by increased use of ocean
- Most optimal policies use a mix of ocean and air
- *Ocean shipments set to cover base demand; air used for quick response for variable demand*
- Simple network model is easy to implement, and can aid current planning process



# Example

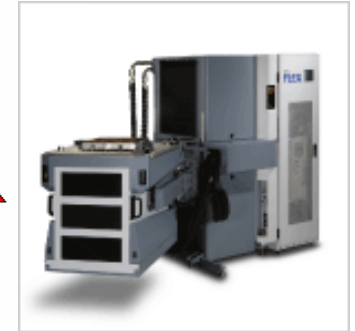
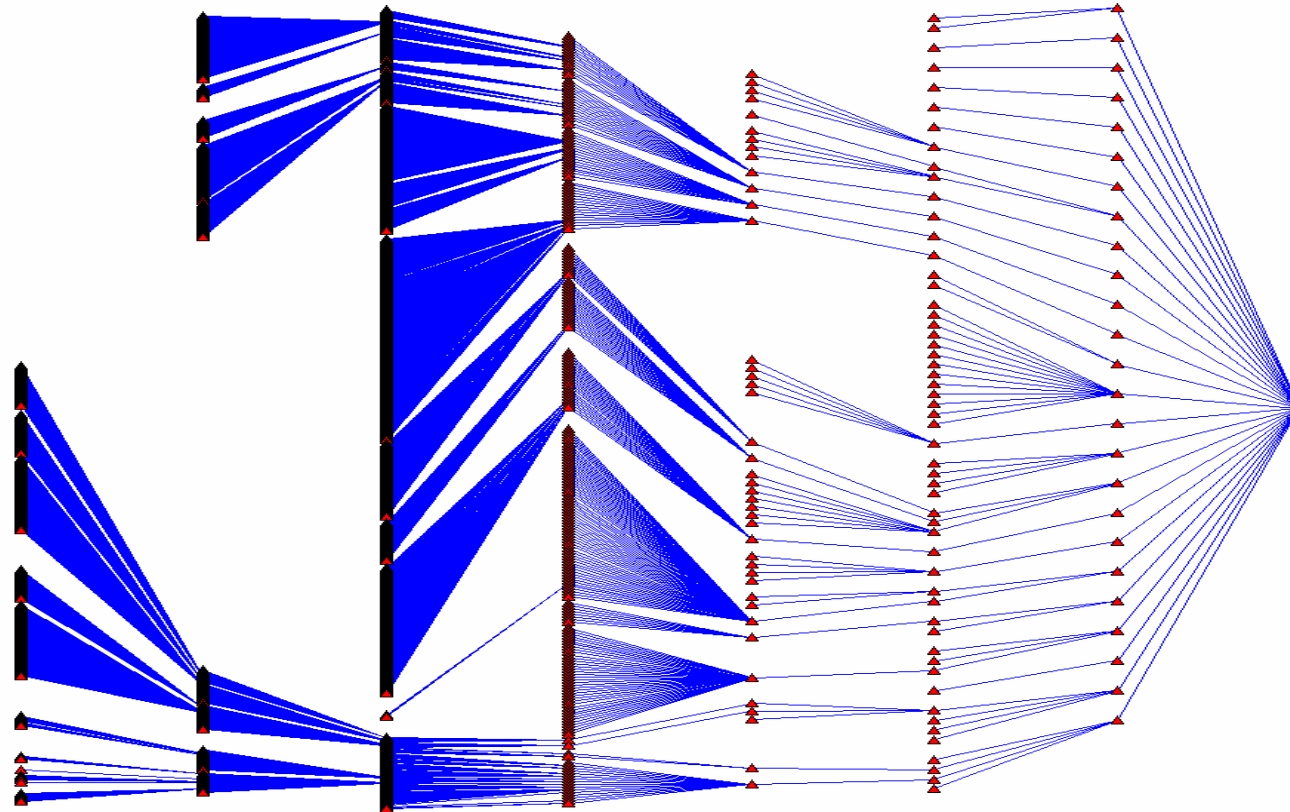
- Supply chain modeling, accounting for evolving forecast process
- Key Concept
  - Forecast accuracy improves as target date gets closer

*$n$  week ahead  $\sigma < (n + 1)$  week ahead  $\sigma$*



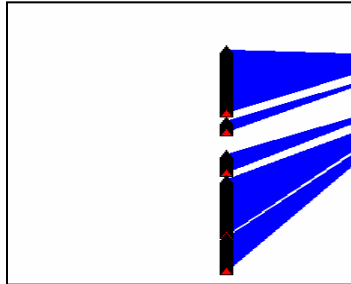
- Motivation:

- Electronic test system manufactured by Teradyne, Inc.
- Lack of global method to optimize inventory over the large (~4,000 part-locations) supply chain
- Supply chain decisions driven by evolving master assembly schedules
- Schedules quite accurate in the near term (~next few weeks), but virtually useless further out (>10 weeks)

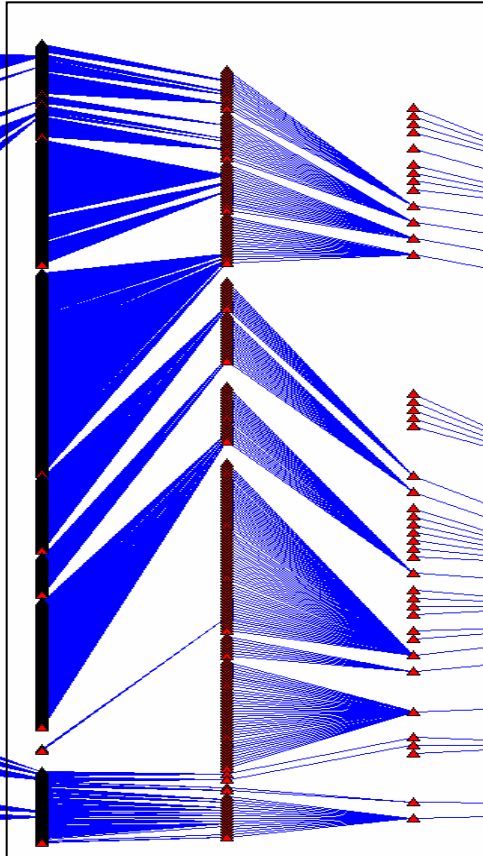


- Electronic test system manufactured by Teradyne, Inc.
- 3,866 part/locations
- Used real data on supply chain topology, lead times, costs of parts

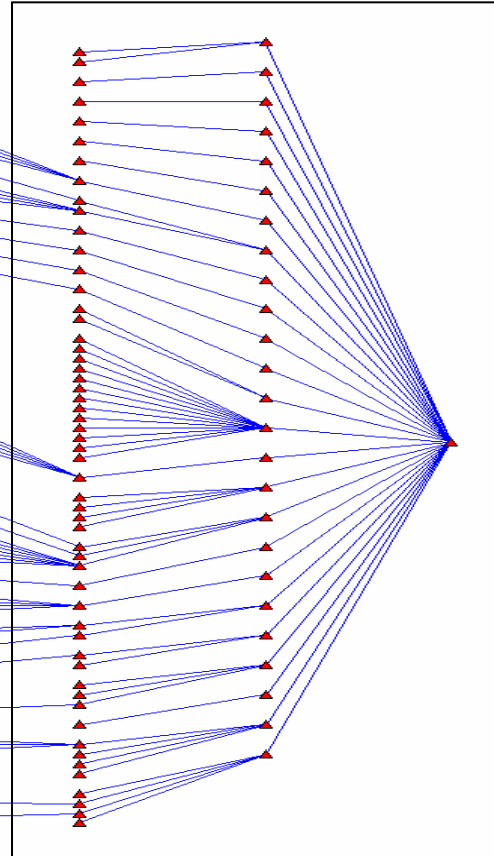
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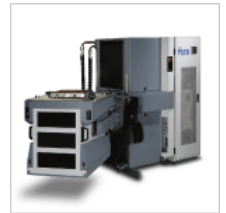
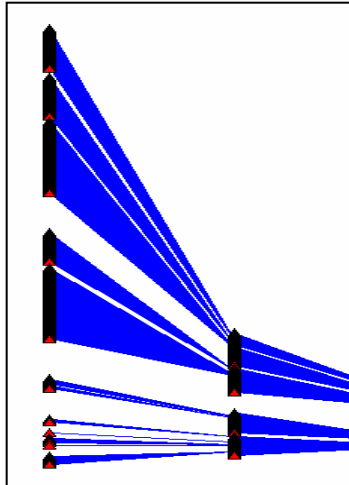
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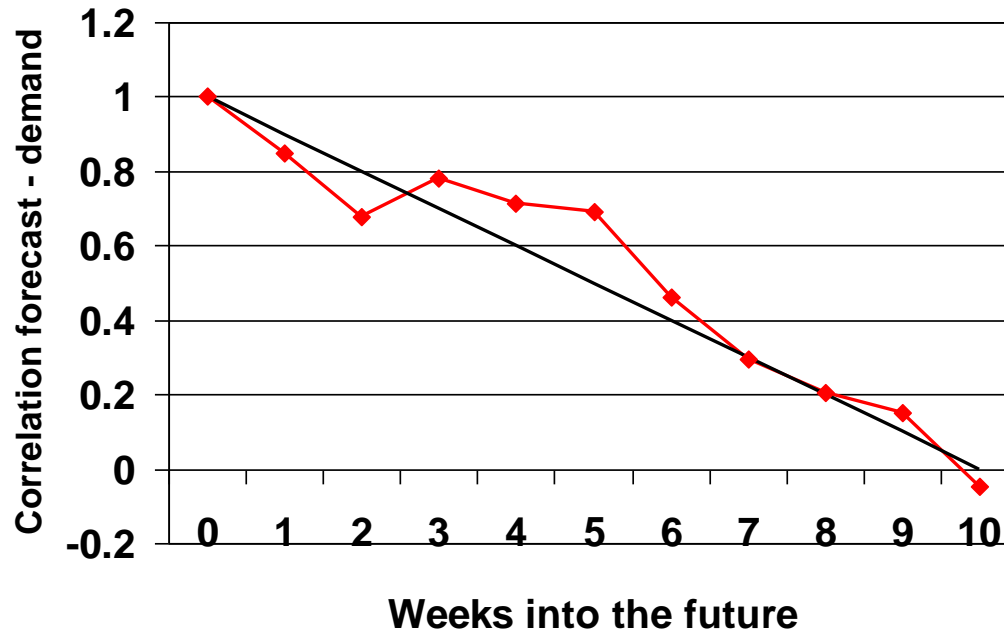


Teradyne



Other suppliers

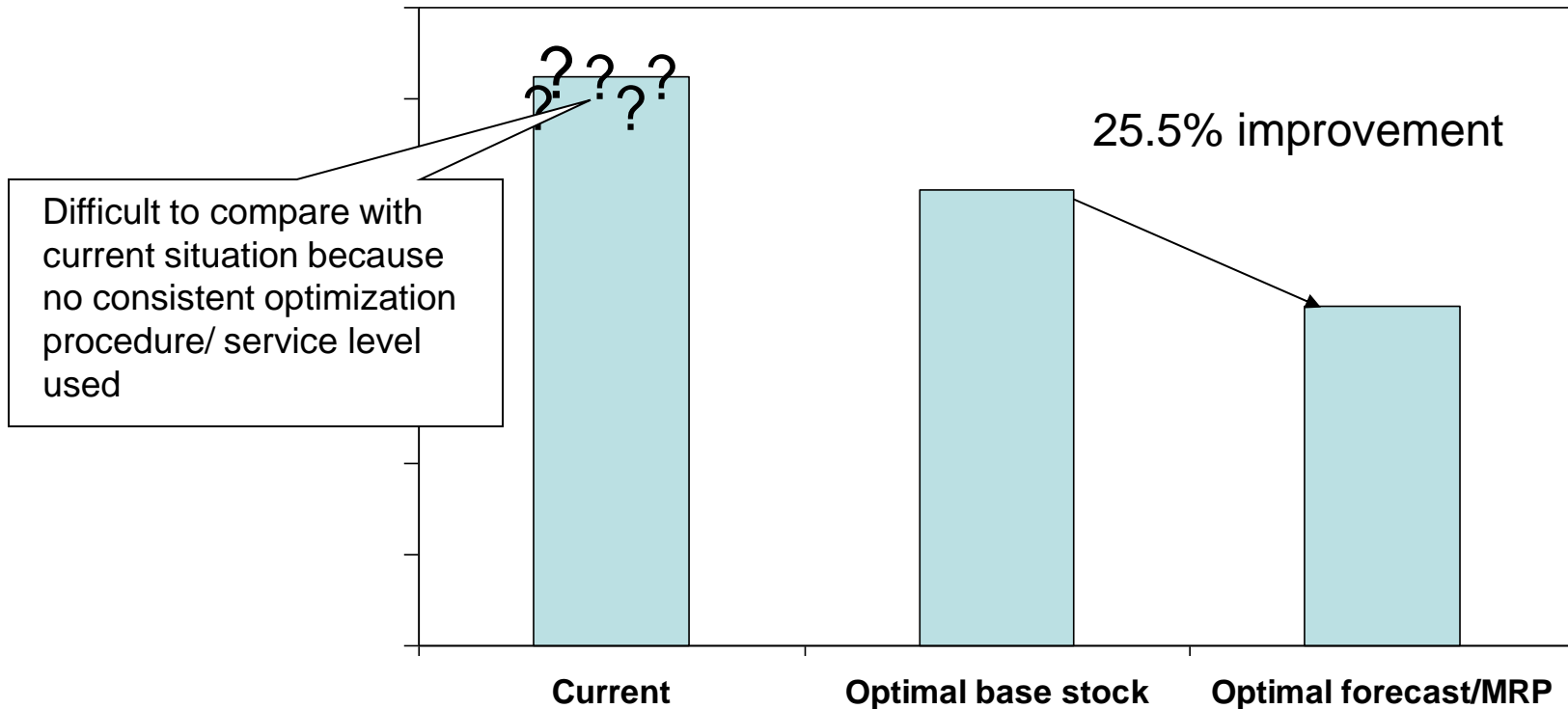




- Schedule contained booked and “preliminary” orders, and got increasingly locked down as the date of delivery approach
- The schedule was effectively a forecast, and we used data on past schedule changes to calculate  $F(L)$
- As a forecast of actual demand, it was fairly accurate in the short term but useless >10 weeks out



## Total cost



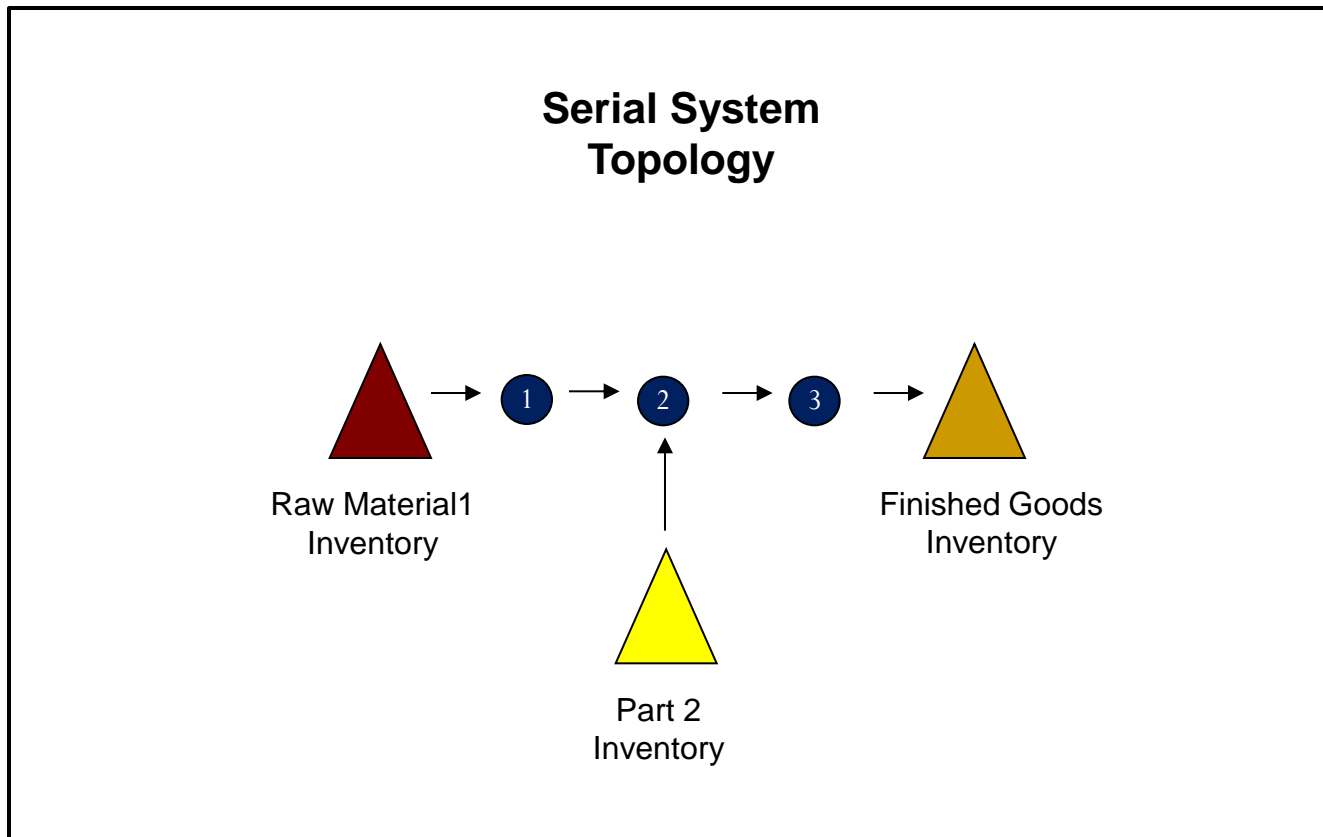
- **In the forecasted case, most savings were far downstream, where forecasts were accurate**
- Optimization time ~1 minute on a laptop computer



# Example

- Smoothing and line segmentation
- Key Concept
  - Upstream variability depends on downstream actions
  - WIP inventory can act as a damper

Example: two products

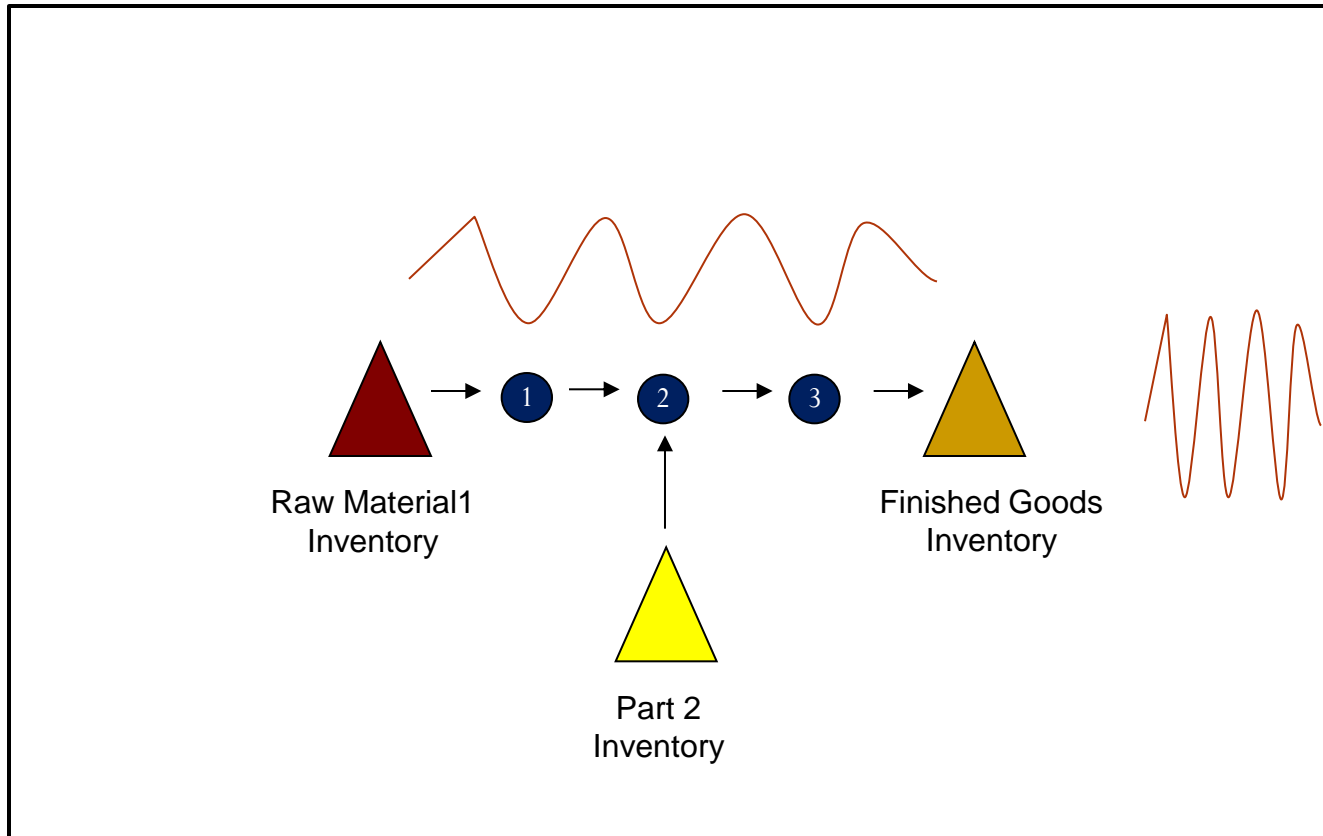


Stage 1: parts fabrication

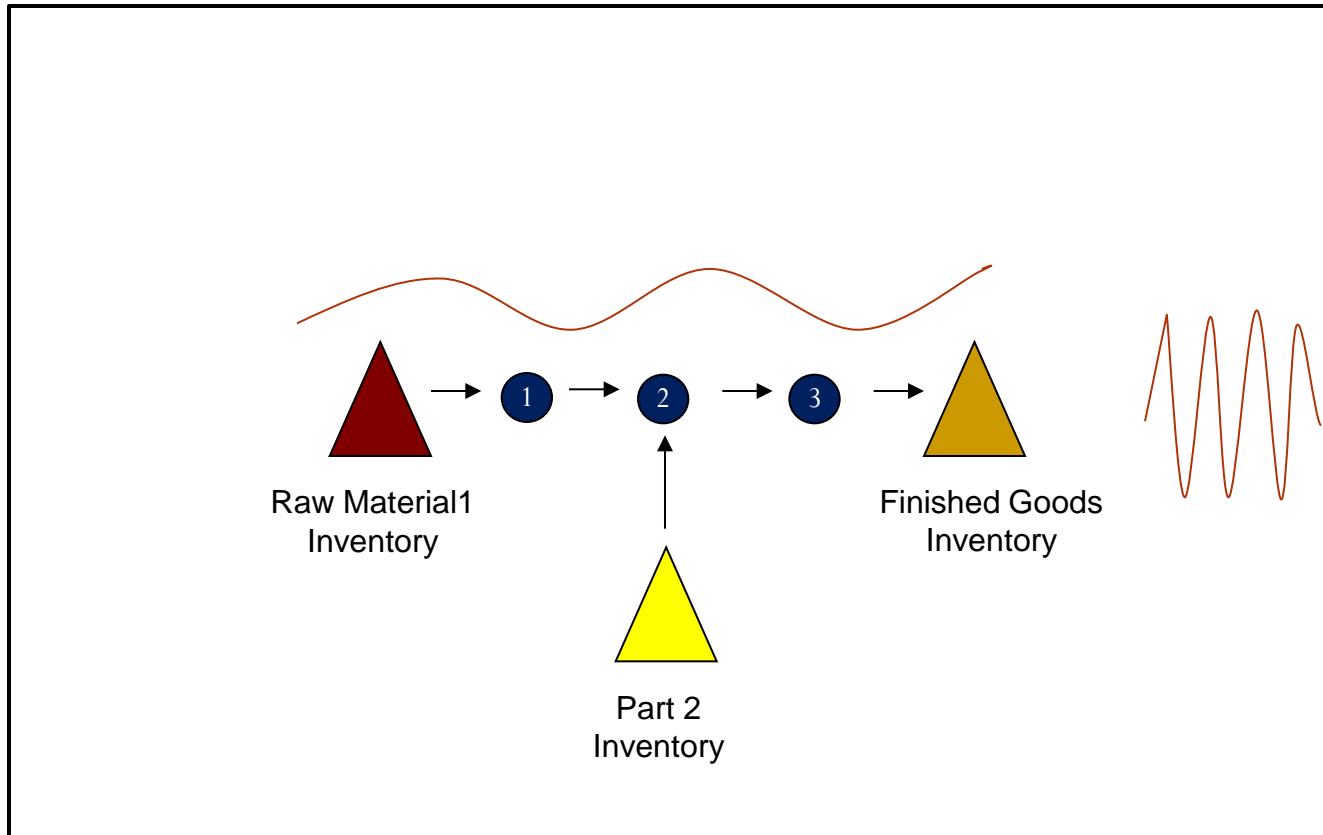
Stage 2: assembly

Stage 3: packaging and test

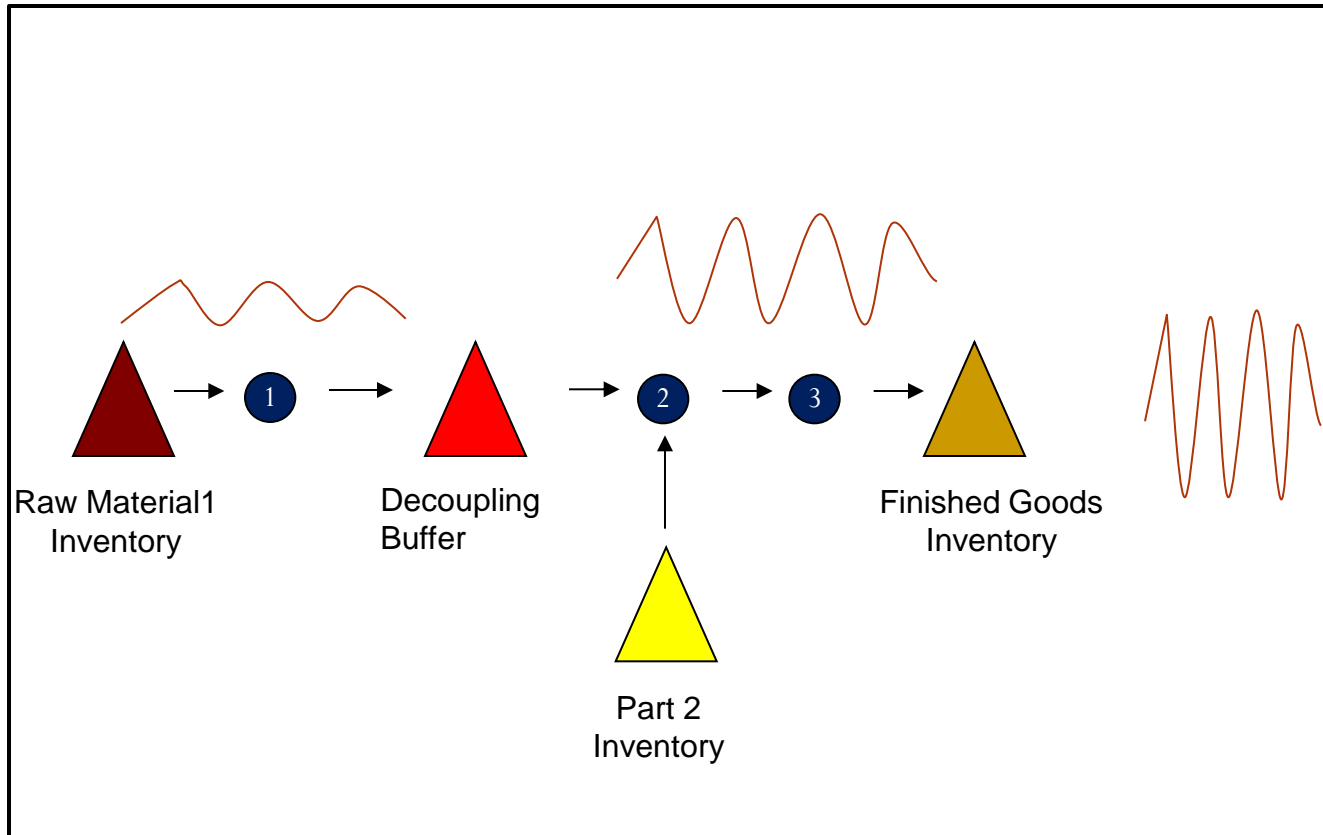
## Example: moderate smoothing

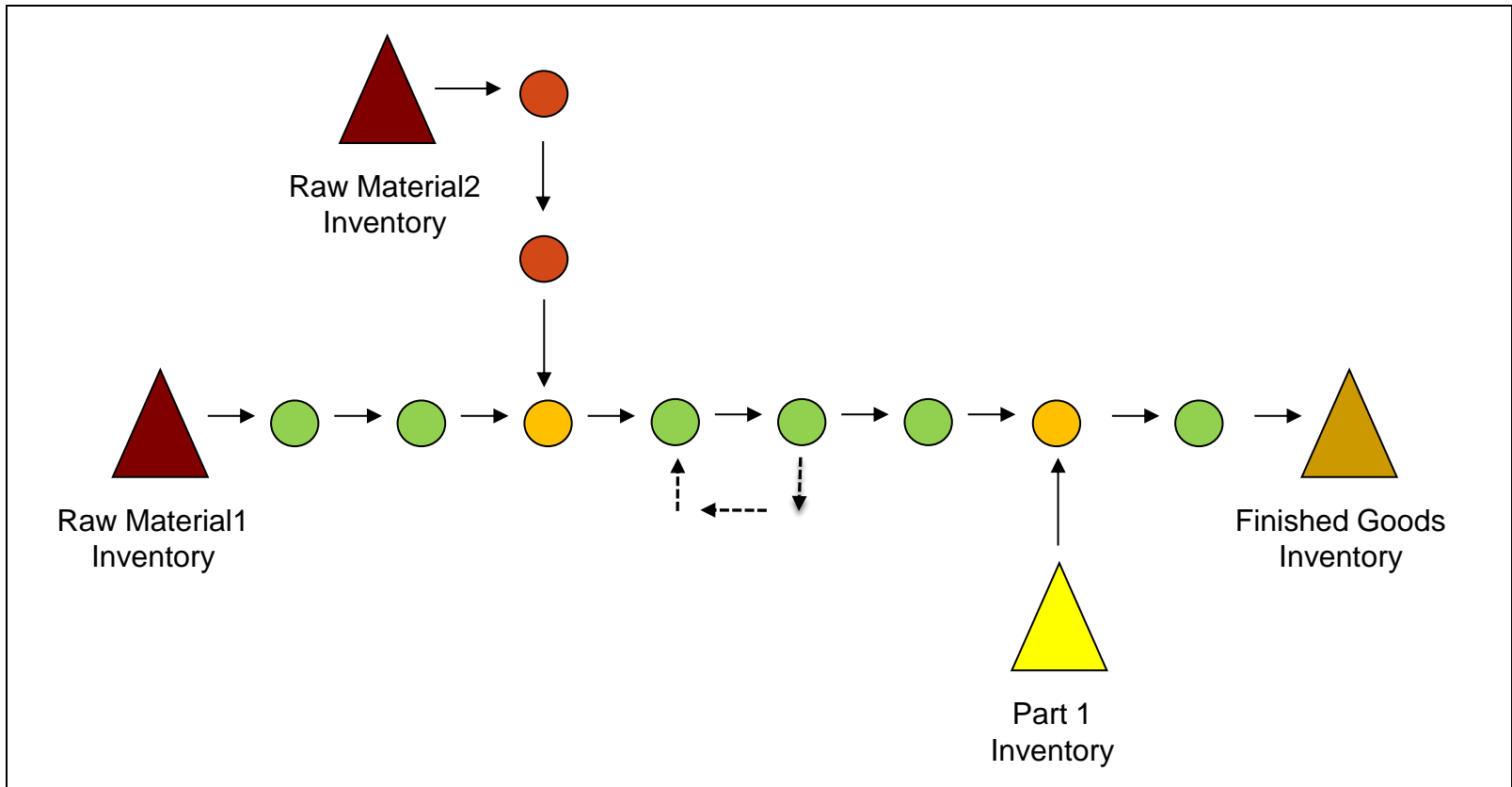


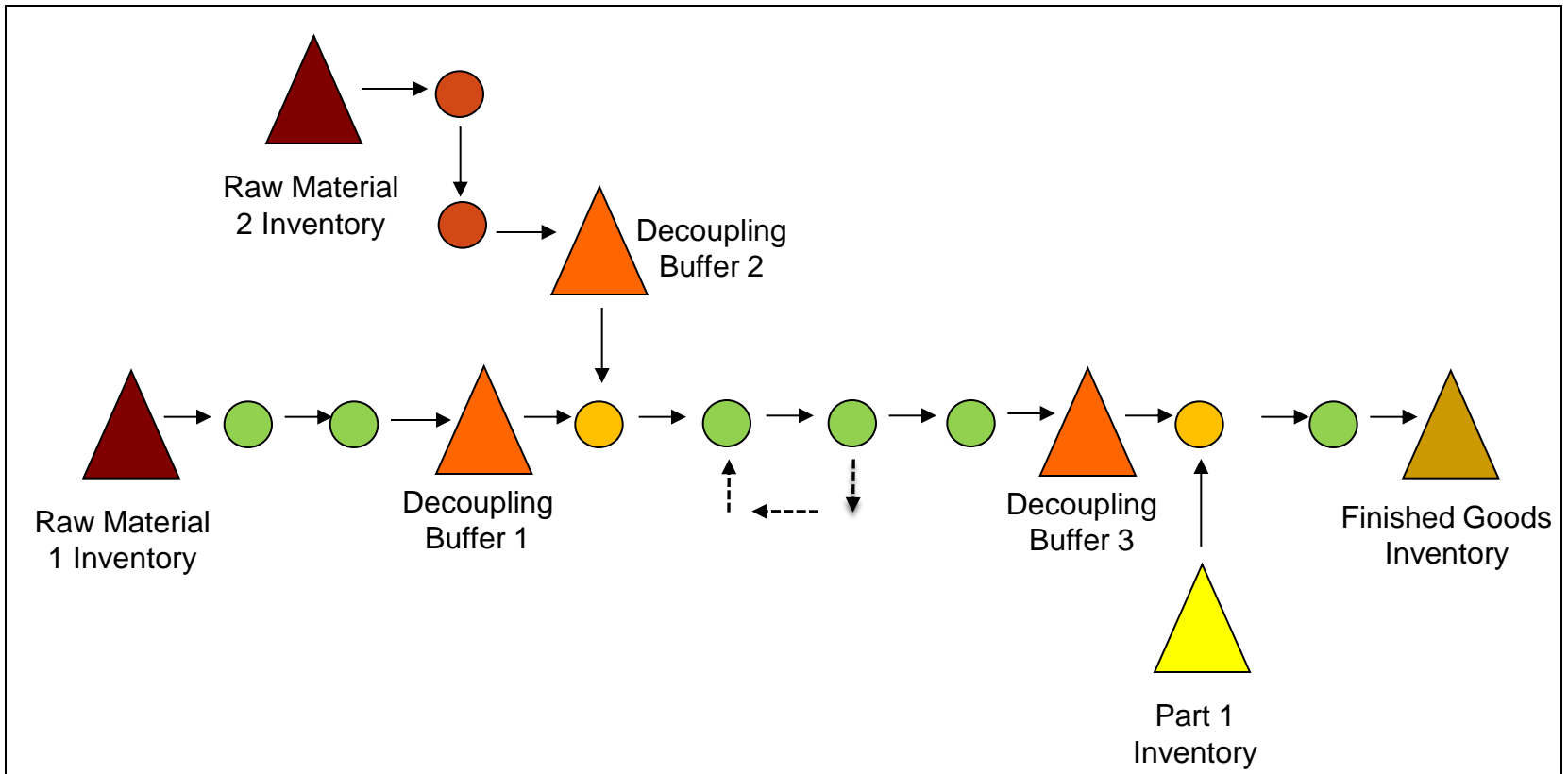
## Example: extensive smoothing



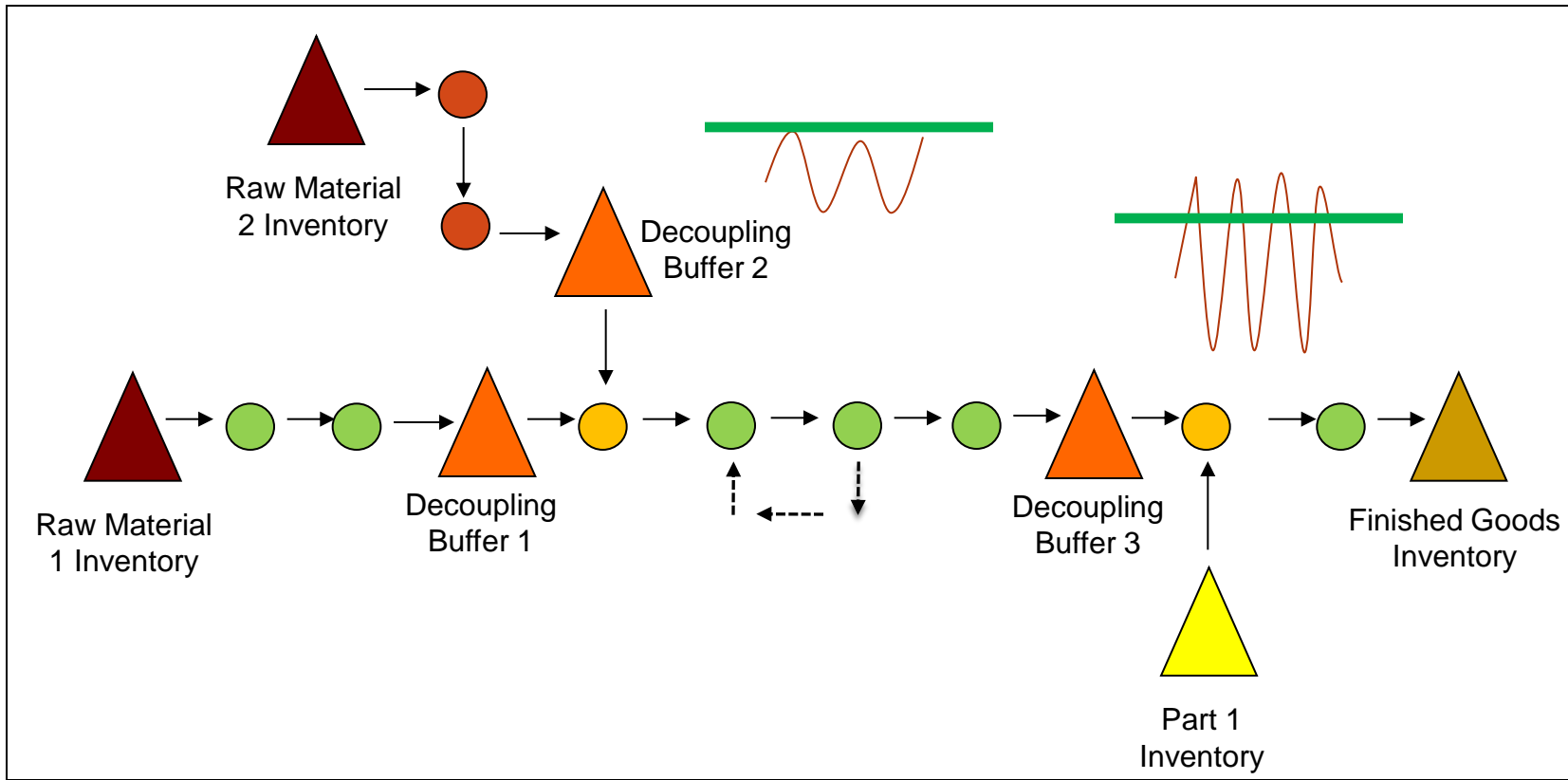
## Example: multiple segments











*Cycle Time = 2 days*

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# Findings

- Higher level of smoothing is needed when:
  - OT cost is high relative to inventory cost
  - Process utilization is high
  - Forecast/Demand variance is high
- Decoupling buffers are needed:
  - To isolate bottleneck processes
  - Prior to high value-add processes
  - To separate operations with differing costs of flexibility (or OT)



# Wrap-Up: Dealing with variability

- Safety stock location in a SC
- Delayed differentiation in a SC
- Dual sourcing
- Better forecast
- Smoothing and line segmentation