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MIT Center for Transportation & Logistics



# Supply Chain Complexity: Eliminate or Embrace?

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## Supply Chain Complexity

- There is a general consensus that . . .
  - supply chains are complex,
  - they are only getting more complex, and
  - complexity adds costs to a supply chain,

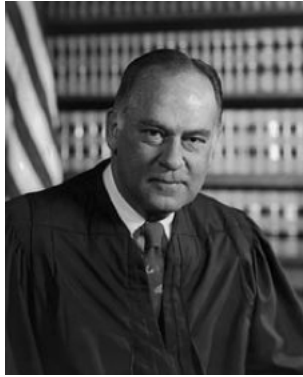
Therefore, we should look to mitigate or minimize complexity.

However, some believe that some complexity is good and should be embraced.

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## What is complexity?



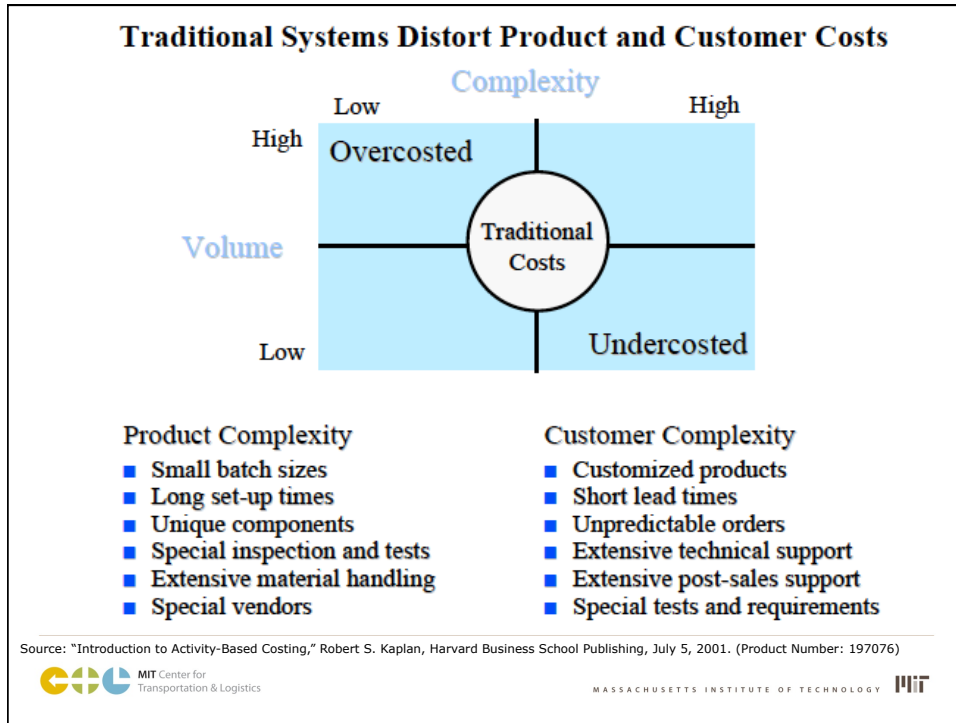
US Supreme Court Justice Potter Stewart  
1915 - 1985

"I know it when I see it"

Justice Potter Stewart, in *Jacobellis v. Ohio* regarding possible obscenity in a movie.

## Questions to Be Answered

1. What is complexity?
2. What are the drivers of complexity?
3. How is complexity introduced into a Supply Chain?
4. How can you determine which aspects of complexity to eliminate and which to embrace?
  - How can you eliminate complexity?
  - How can you embrace complexity?



## Supply Chain as a System

- Take an Engineering Systems Perspective
  - What is a variable and what is a constraint?
  - Continuous expansion of decision variables
  - Increases potential for improvement but increases both complexity and coordination requirements

**Objective:** Deliver at lowest transport cost

**Variable:**

- Select carrier to tender each load to

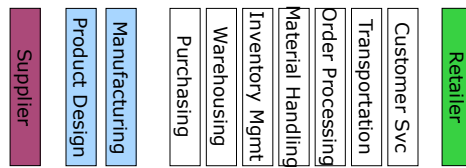
**Constraints:**

- Ship everything each day
- Must deliver within specified windows

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## Supply Chain as a System

- Take an Engineering Systems Perspective
  - What is a variable and what is a constraint?
  - Continuous expansion of decision variables
  - Increases potential for improvement but increases both complexity and coordination requirements



### Objective:

- Maximize on-shelf availability

### Variables:

- Select carrier to tender each load to
- Select time windows to deliver
- Select when to ship what from where
- Determine where to stock which form of product
- Select contract relationships
- Select who should control replenishment
- Which channel member should perform which function

### Constraints:

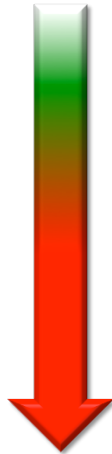
- Total delivered cost to shelf

## What is complexity? . . . from the literature

- Distinction between complicated and complex.
- Two types of complexity (Singe 1990)
  - Detail Complexity – distinct number of processes or parts within the system
  - Dynamic Complexity – unpredictability of response of the system due to interactions
- A system is complex if it “is made up of a large number of parts that interact in a non-simple way.” (Simon 1962)

Source: Bozarth et al, “Impact of Supply Chain Complexity on Manufacturing Plant Performance,” JOM 2009.

## What are the drivers of SC Complexity?

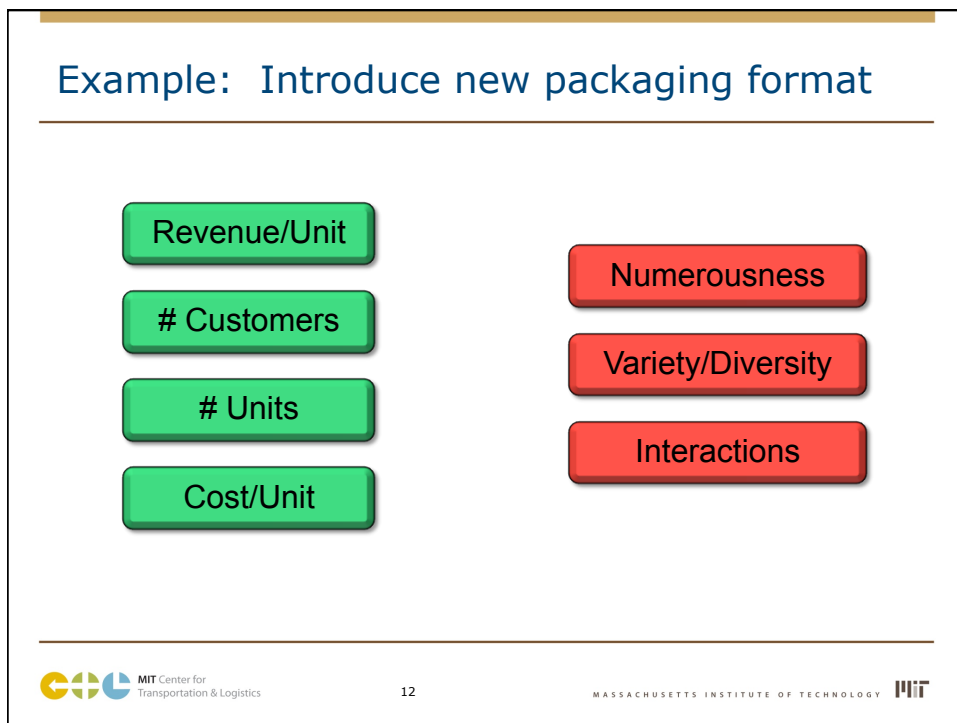
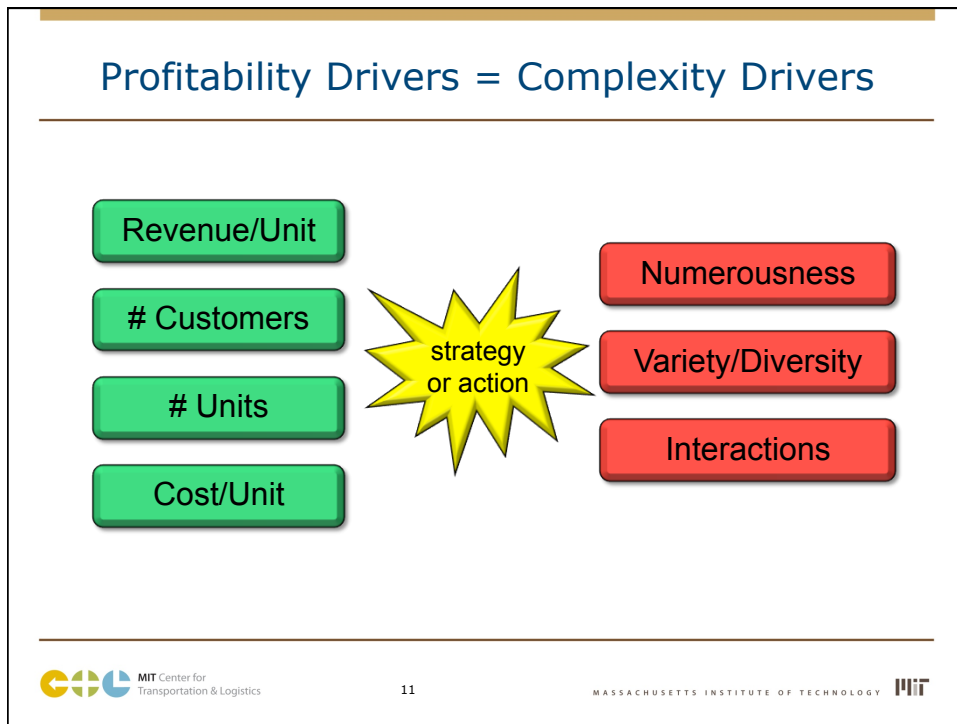


1. Numerousness
2. Variety/Diversity
3. Interconnections/Interactions
4. Opacity of Interactions
5. Dynamic Effects

Source: Mitchell, "Complexity – A Guided Tour" Oxford Press 2009.

## Why do we care?

- Complexity is not introduced for complexity's sake
- Drivers of complexity = Drivers of profitability
- Drivers of profitability
  - Increase revenue per unit
  - Increase the number of customers
  - Increase number of units sold
  - Decrease cost per unit
- Implicit to every strategy or action intended to improve profitability is a hidden cost of complexity



## Example: Launch new product line

Revenue/Unit

# Customers

# Units

Cost/Unit

Numerousness

Variety/Diversity

Interactions

## Example: Open a joint DC for online and traditional retail replenishment

Revenue/Unit

# Customers

# Units

Cost/Unit

Numerousness

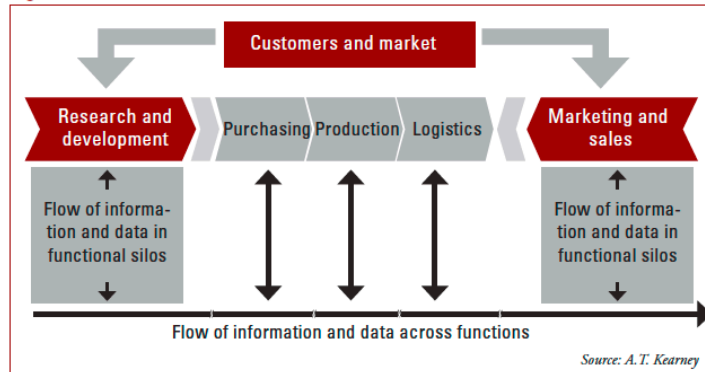
Variety/Diversity

Interactions

## Where does complexity enter the supply chain?

Complexity enters at the ends!

Desire for unique solutions

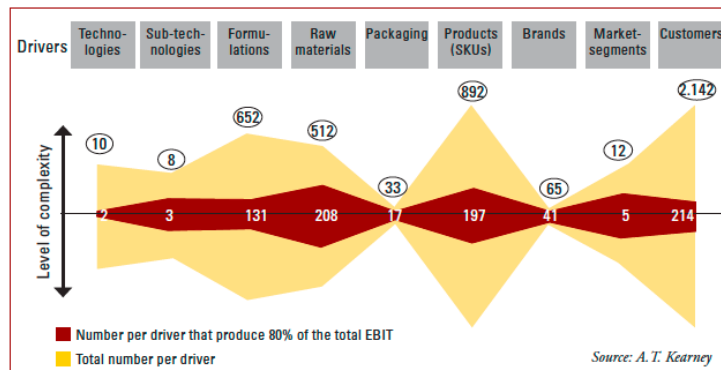


Desire for a wide and diverse product portfolio.

Source: A.T. Kearney

## Identifying where complexity lies

Complexity "fingerprint"



Packaging - 17 of 33 configurations account for 80% of EBIT (52%)

Customers - 214 of 2142 (just 10%) customers account for 80% of EBIT



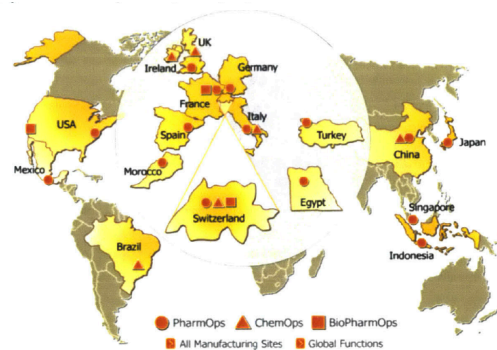
## How to determine good vs. bad?

- Value Destroying
  - Does the cost of complexity outweigh the value?
  - Does it introduce greater confusion to the customer?
  
- Value Creating
  - Is the cost of the complexity less than the increase in value to the customer?
  - Does the added complexity provide potentials for flexibility?
  - Does the added complexity create a competitive advantage?

## Complexity Example: Novartis



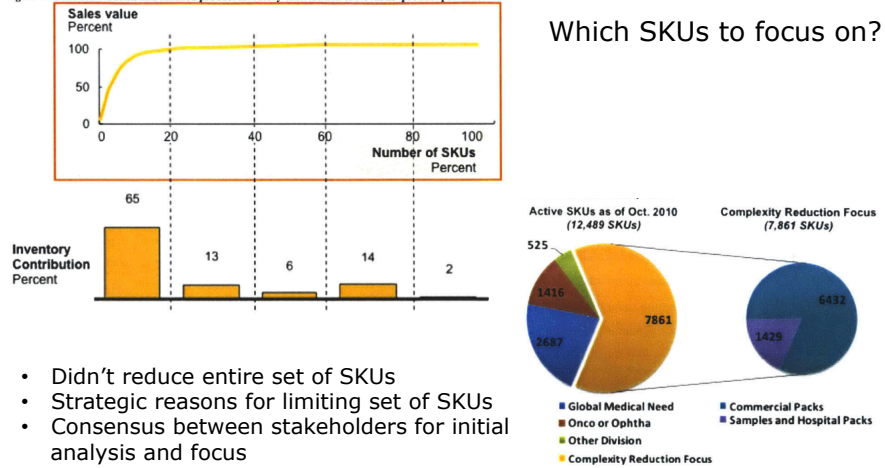
- Complexity Reduction Initiative (2010)
  - 14,000 SKUs sold across 140 countries
  - Multiple dosage forms (film-coated tablets, pre-filled syringes, sugar coated pills, etc.)
  - Multiple pack sizes and formats
  - Regulatory requirements – same product produced at two plants creates two SKUs
  - Difficulty in retiring products – some required by regulation others due to mergers



## Complexity Example: Novartis



Figure 4 - Sales contribution and finished product inventory contribution of Novartis' product portfolio

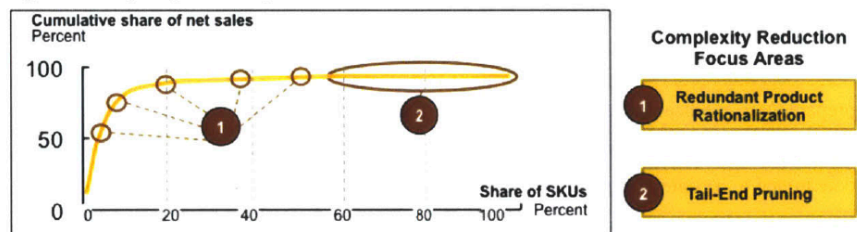


19 Source: Leiter, K., "Assessing and Reducing Product Portfolio Complexity in the Pharmaceutical Industry," MIT Thesis 2011.

## Complexity Example: Novartis



- Simultaneous Two Pronged Approach
  - Redundant Product Rationalization
  - Tail-end Pruning



20 Source: Leiter, K., "Assessing and Reducing Product Portfolio Complexity in the Pharmaceutical Industry," MIT Thesis 2011.

## Complexity Example: Novartis



### Step #1: Redundant Product Rationalization

- Bottoms up approach
- Identify redundant profits by product
- Match true customer requirements and align to products
  - Example: one month vs. two month dosage packs

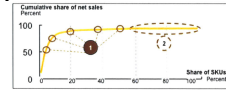


Figure 8 - Redundant product rationalization process

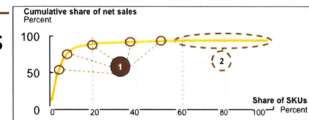


21 Source: Leiter, K., "Assessing and Reducing Product Portfolio Complexity in the Pharmaceutical Industry," MIT Thesis 2011.

## Complexity Example: Novartis



- Redundant Product Rationalization Results
  - Reduced SKUs by 30% with no sales loss
  - Reduced SKUs lead to better forecasting
  - Very resource intensive initiative
  - Required buy-in by heads of finance & marketing



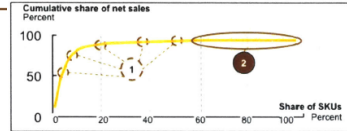
Brands Reviewed	Active SKUs in Local Portfolio	Rationalization Impact	Remaining SKUs	Driver
Brand A	24	-2	22	• Cannot prune SKUs – High packsize variety necessary
Brand B	54	-23	31	• Medium pack pruned – 100% sales compensation confirmed
Brand C	62	-25	37	• Medium pack pruned – 100% sales compensation confirmed
Brand D	31	-4	27	• 4 redundant or non-critical SKUs pruned with no sales loss
Brand E	33	-6	27	• Hospital packs pruned and pruning of medium pack to be evaluated
Brand F	14	-4	10	• Hospital packs and medium packs – replaced by other commercial pack
Brand G	20	-8	12	• Hospital packs and medium packs – replaced by other commercial pack

In these 7 brands, the CPO achieved 30% reduction in SKUs (72 SKUs) without sales loss



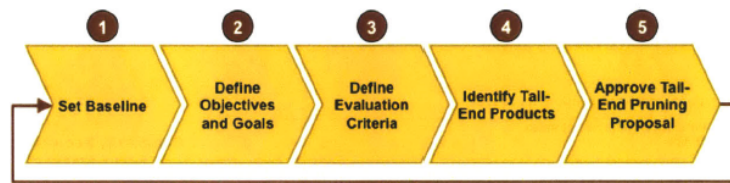
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## Complexity Example: Novartis



### Step #2: Tail-end Pruning

- Top-down approach
- Identify and remove small less profitable products
- Devil is in the details and the tail always regenerates

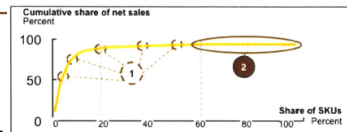


Repeat Annually



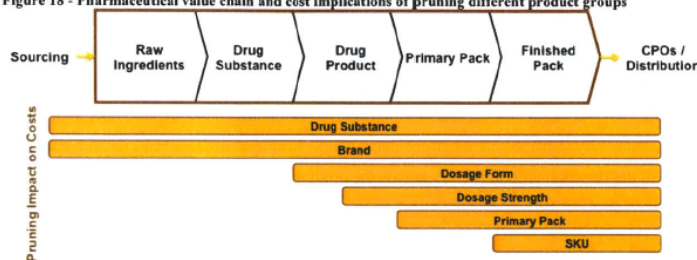
23 Source: Leiter, K., "Assessing and Reducing Product Portfolio Complexity in the Pharmaceutical Industry," MIT Thesis 2011.

## Complexity Example: Novartis



- Tail-end Pruning
  - What level of detail makes sense?
  - Measure by SKU by Brand by Drug . . .
  - Two approaches considered:
    - MILP – when high quality data is available
    - Criteria Threshold – when data is imperfect

Figure 18 - Pharmaceutical value chain and cost implications of pruning different product groups

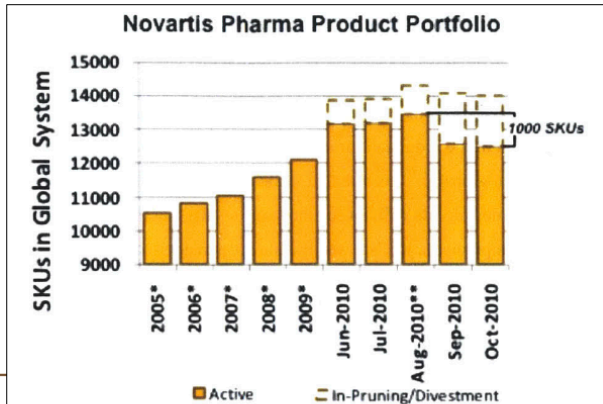


24 Source: Leiter, K., "Assessing and Reducing Product Portfolio Complexity in the Pharmaceutical Industry," MIT Thesis 2011.

## Complexity Example: Novartis



- Results of Complexity Reduction Initiative (2010)
  - Approximately 1100 SKUs pruned
  - 43 complete brands were pruned!
  - Inventory savings of \$22 M



25 Source: Leiter, K., "Assessing and Reducing Product Portfolio Complexity in the Pharmaceutical Industry," MIT Thesis 2011.



## Complexity Example: Hewlett Packard



- Hewlett-Packard circa 2008
  - More than a billion customers in 170 countries
  - Wide variety of product lines and SKUs
    - > 2,000 Laser Printers
    - >15,000 Server SKUs
    - > 8 million Laptop & Desktop configurations
  - Multiple sales channels with variety of order cycle times
  - Shorter overall product lifecycles
  - New products constantly introduced
    - Marketing decision based on marginal revenue improvement
    - Minimal supply chain input on costs



26 Source: Ward et al.: HP Transforms Product Portfolio Management with Operations Research Interfaces 40(1), pp. 17-32, ©2010 INFORMS

## Complexity Example: Hewlett Packard



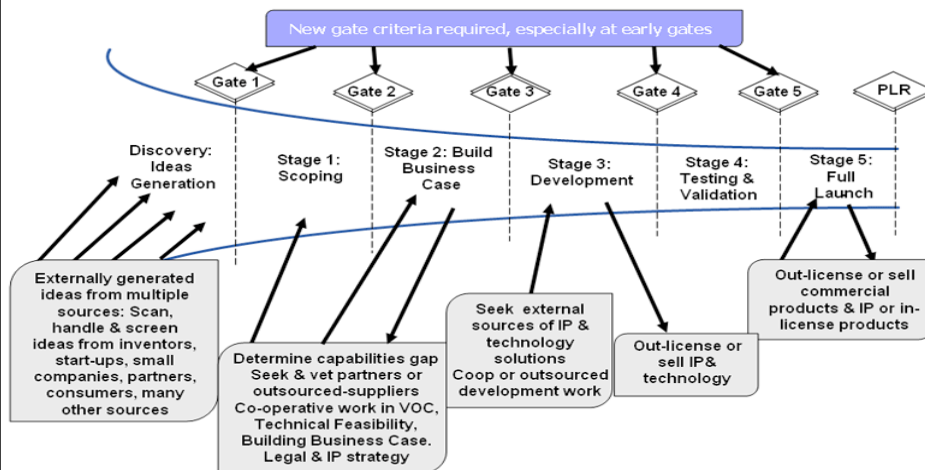
- Portfolio Rationalization Project
  - Focus on Personal Systems Group (PSG)
  - Configurable PC products
  - Low per SKU costs – but high underlying costs
  - Orders must ship 100% complete – one component short kills entire order
  - Lead to long and unpredictable Order Cycle Time (OCT)
  
- Two Simultaneous Initiatives
  1. New Product ROI Screening
    - keeping overly complex products out
  2. Revenue Coverage Optimization
    - for pruning existing products



Source: Ward et al.: HP Transforms Product Portfolio Management with Operations Research Interfaces 40(1), pp. 17–32, ©2010 INFORMS

## New Product Introduction Process (Stage-Gate)

Open Innovation Stage-Gate®: External Interfaces (In-Bound & Out-Bound) at Multiple Points in the Process

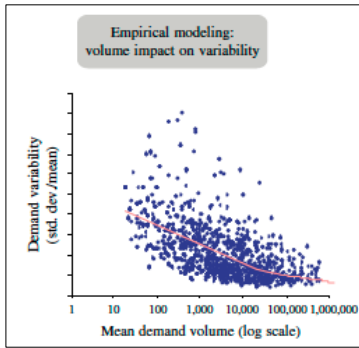


# Complexity Example: Hewlett Packard



## #1: New Product ROI Screening

- ABC approach with volume and variety as distinct drivers
- Used mix of approaches (ABC, regression) for variety drivers
  - More SKUs lead to higher returns
  - Lower volumes leads to higher variability



Cost type	Nature of relationship	Cost categories
Variable complexity costs	Volume-driven	<ul style="list-style-type: none"> <li>• Material costs: volume discounts</li> <li>• Variability-driven costs: excess costs (financing, storage, depreciation, obsolescence, fire sales) and shortage costs (material price premiums, expediting, lost sales because of shortages)</li> </ul>
Fixed complexity costs	Variety-driven	<ul style="list-style-type: none"> <li>• Resource costs: R&amp;D, testing, product management, etc.</li> <li>• External cash outlays: tooling, costs to contract manufacturer</li> <li>• Indirect impacts of variety: manufacturing switching costs, warranty-program expenses, quality impacts, returns costs</li> </ul>

Low Volumes of a SKU drive Costs

# SKUs drive Costs

### Complexity ROI

$$= \frac{(\text{Incremental margin} - \text{Variable complexity costs})}{(\text{Fixed complexity costs})}$$

# Complexity Example: Hewlett Packard



## #1: New Product Screening

- Formed cross functional team (SC, Finance, Mkt) to validate approach
- Reach consensus on *reasonable* rather than *exact* cost model
- Created user friendly tool to assess Complexity ROI for new products

**LaserJet variety cost-benefit calculator**

Model Number / Name of Proposed Model: **ABC123**

Platform: **XXX**

Description:

Product Category: **Of None**

Is a new accessory required? **No**

Is the model being added as part of NPI? **Yes**

What kind of accessory is being added? **Class 1**

Is new documentation required? **No**

Which supply chain? **Low Tech**

**Model Statistics**

Proposed lifetime (months)	15
Monthly volume	5,900
SKU added with Model	31
List price	\$349
Hardware net revenue / unit	\$309
Contrib. margin / unit	\$79

**Engine Requirements**

Engines	% of Volume	Monthly Volume	Total Volume	Avg Net Rev/Unit
110V NW BL	40	2,360	1,880	\$506
220V NW BL	40	2,360	1,680	\$556
110V NW BL MJU	10	590	400	\$596
220V NW BL MJU	10	590	400	\$596

**Incremental volume**

Percent incremental volume	45
Total cannibalized units per month	3,245

**Forecast**

	Monthly	Lifetime	Incremental
Volume (units)	5,900	88,500	39,825
Hardware revenue	\$3,981,000	\$30,138,000	\$13,100,425
Contrib. margin	\$466,100	\$6,993,500	\$3,148,175

**Cannibalization**

Related Product #1	Related Product #2
Name: ABC	Name: DEF
% of contrib: 9%	% of contrib: 20%
Cannib'd units: 2,598	Cannib'd units: 649

**Related Products**

Product	Planned	Adjusted	Planned	Adjusted
Product lifetime (months)	17	17.0	14	14.1
Monthly volume	5,000	2,404	2,000	1,351
List price	\$369	\$369	\$279	\$279
Hardware net revenue / unit	\$349	\$349	\$279	\$279
Contri. margin / unit	\$89	\$89	\$59	\$59

**Estimated unaccounted costs of adding model**

**Opportunity Costs:**

Lost Sales Due to Stockouts	\$17K - \$37K
Total	\$2K - \$4K

**COGS + Contra-Revenue Impacts:**

Inventory holding, storage and financing	\$17.5K - \$37.6K
Excess & obsolescence / Fire sales	\$3.9K - \$7.7K
Expediting	\$1.1K - \$2.3K
Price protection	\$3.9K - \$8.3K
Spare parts inventory-driven costs	\$0.7K - \$1.5K
Material cost volume discounts	\$0.0K - \$0.0K
MCH (packaging & setup)	\$12.5K - \$26.9K
Refurb & returns	\$12.5K - \$18.9K
Warranty	\$3.0K - \$19.2K
Total	\$60K - \$158K

**Operating-expense impacts:**

Sales & Mktg OH	\$10.0K - \$18.9K
Product data mgmt	\$0.6K - \$11.8K
Commodity mgmt	\$3.9K - \$5.0K
Mfg program mgmt	\$5.0K - \$10.0K
Planning & Forecasting	\$0.6K - \$10.0K
Product completion center	\$3.4K - \$9.9K
Sr. mgmt attention for evaluations	\$2.0K - \$5.0K
Test center	\$0.0K - \$0.0K
Other unaccounted costs	\$2.0K - \$0.0K
Total	\$17.7K - \$32.0K

**Grand total** **\$234K - \$489K**

**ROI:**

ROI Assessment	\$2.53M - \$2.53M
Incremental margin	\$2.47M - \$2.39M
Adj. incremental margin	\$1.77K - \$330K
Fixed cost	\$15.5K - \$2.6K

**Cutoff values**

Yellow zone ROI	1.1
Green zone ROI	1.1

**Minimum % incremental to quality**

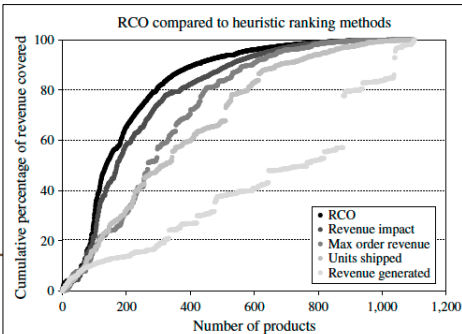
...for green zone	45
...for yellow zone	19

## Complexity Example: Hewlett Packard



### #2: Revenue Coverage Optimization

- Pruning existing products
- Maximizing value of active portfolio
- Measuring revenue generation by item misses interactions and interdependencies
- RCO answers the question: If I could only have 100 products, which should I choose?
- New metrics:
  - Order Coverage – percent of previous order that could be filled with existing portfolio
  - Revenue Coverage – revenue (margin) of covered orders as a percent of the total revenue



## Complexity Example: Hewlett Packard

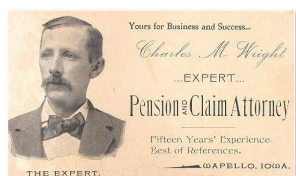


- Portfolio Rationalization Project Results
  - Over \$500 M saved since 2005
  - Product adoption rate improved from 18% to 85%
  - Shift from revenue focused to margin focused management
  - LaserJet SKU count reduced by 40% in 3 years (2006-9)
  - RCO eliminated 3,300 of 11,00 SKUs from HPs Business Critical Systems division
  - Soft benefits
    - Higher customer satisfaction
    - Less confusion for sales and customers
    - Higher forecasting accuracy
    - Better organizational efficiency – forcing Green, Blue & Red to talk!



## What about embracing complexity?

- What industry has:
  - Very small batch sizes
  - Long set up times with very short desired lead times
  - Highly customized products (no two are alike)
  - Unpredictable order frequency
  - Many many very small customers



## Printing Business Cards



- Traditional Process
  - Relatively high design costs & time
  - High switch over and set up costs between runs
  - Individual card runs – requires high minimum orders
  - Rough costs are about \$10-\$20 per MSI
    - Business cards are 2" x 3.5" so 500 cards ≈ 3.5 MSI = \$35
- Vistaprint
  - Founded in 1995 – profitable in 2001 – IPO 2005
  - Printing business cards and other marketing for micro-businesses

## Embracing Complexity Example



### Online Design & Ordering

The screenshot displays the Vistaprint website interface. At the top, there is a navigation bar with links for Home, Specials, English, Help, 1.866.614.8002, Log In, My Account, and Cart. Below the navigation bar, there are several promotional banners and product categories. The main banner features 'WHAT'S HOT THIS SUMMER: POSTCARDS' with a 'Get Started' button. Other banners include 'Music lessons for all ages', 'Lana Boutique SALE', and 'Take \$10 OFF your first massage!'. Below these, there are four product category tiles: 'Premium Business Cards', 'Marketing Materials', 'Signs & Banners', and 'Invitations & Announcements'. Each tile includes a brief description and a 'See More Products' link. The bottom of the page features the MIT logo and the text 'MIT TRANSFORMATIVE TECHNOLOGY'.

## Embracing Complexity Example



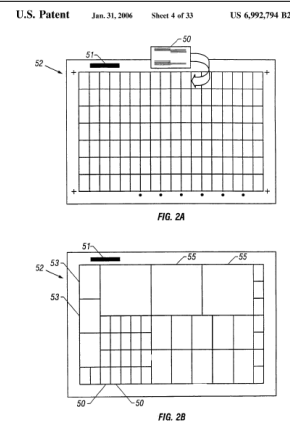
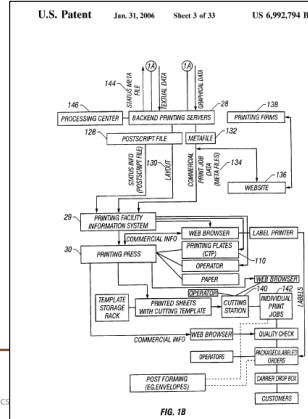
- Integrated Production Processes
  - Software tied directly from ordering & design to production
  - Gang Run Printing - Batching together different print jobs into a single print run on a single sheet.
  - Automated sorting, aggregating, and organizing of jobs



## Embracing Complexity Example



- A "minefield of patents"
- Initial patents filed in France in 2000
- 28 issued in US as of 2013
- Example; VistaBridge - Patent 6,992,794

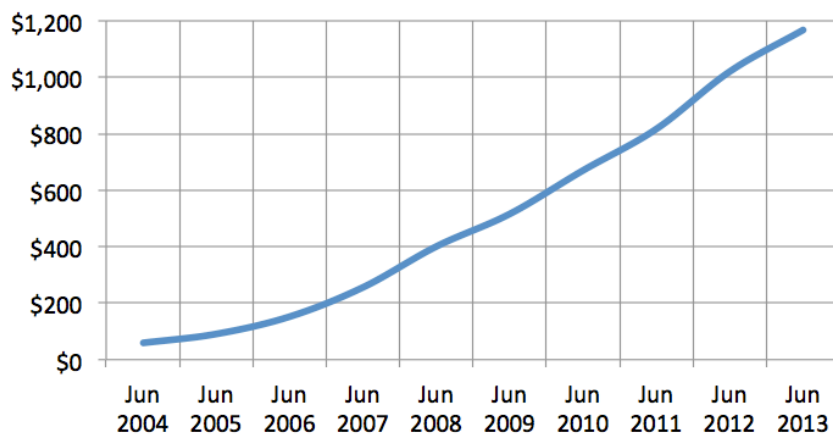


## Embracing Complexity



### Vistaprint Results

### Revenue (\$, million)



## Questions to Be Answered

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