



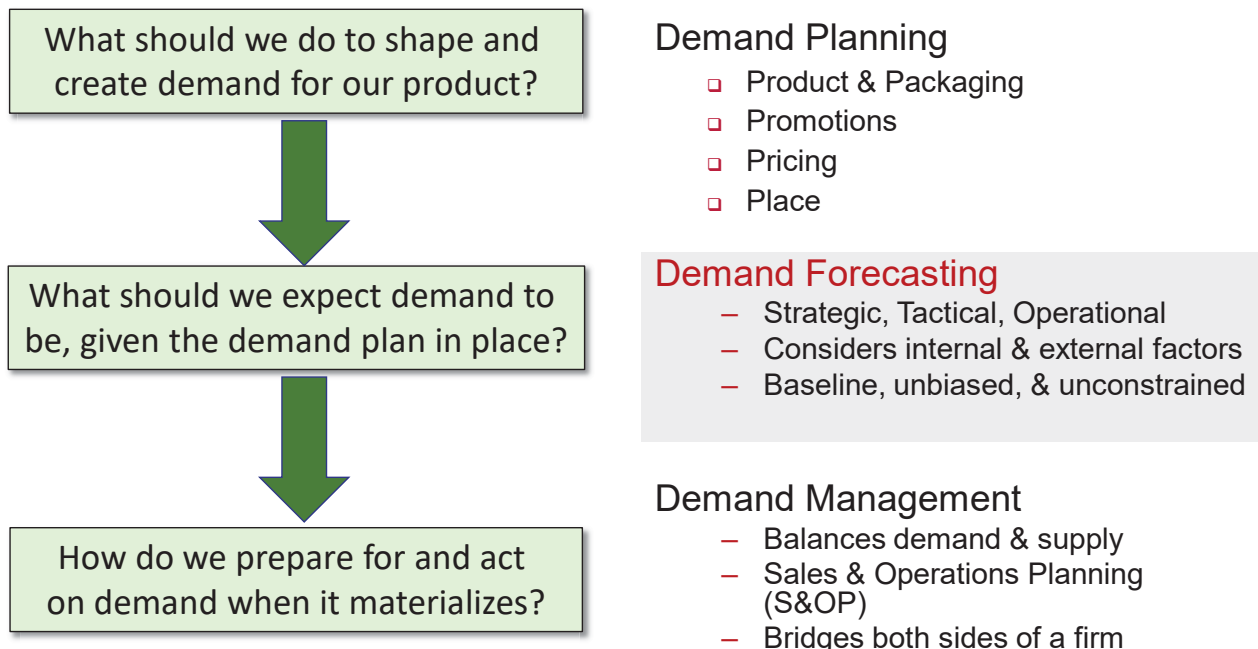
# SUPPLY CHAIN FUNDAMENTALS

## FORECASTING Introduction

THIS LECTURE IS ENABLED BY COURSE CONTENT FROM DR. CHRIS CAPLICE @ MIT

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## DEMAND PROCESS – THREE KEY QUESTIONS



Source: Material adapted from Lapide, L. (2006) Course Notes, ESD.260 Logistics Systems.

# FORECASTING LEVELS

LEVEL	HORIZON	PURPOSES
Strategic	Year/Years	<ul style="list-style-type: none"> <li>– Business Planning</li> <li>– Capacity Planning</li> <li>– Investment Strategies</li> </ul>
Tactical	Quarterly	<ul style="list-style-type: none"> <li>– Brand Plans</li> <li>– Budgeting</li> <li>– Sales Planning</li> <li>– Manpower Planning</li> </ul>
	Months/Weeks	<ul style="list-style-type: none"> <li>– Short-term Capacity Planning</li> <li>– Master Planning</li> <li>– Inventory Planning</li> </ul>
Operational	Days/Hours	<ul style="list-style-type: none"> <li>– Transportation Planning</li> <li>– Production Planning</li> <li>– Inventory Deployment</li> </ul>

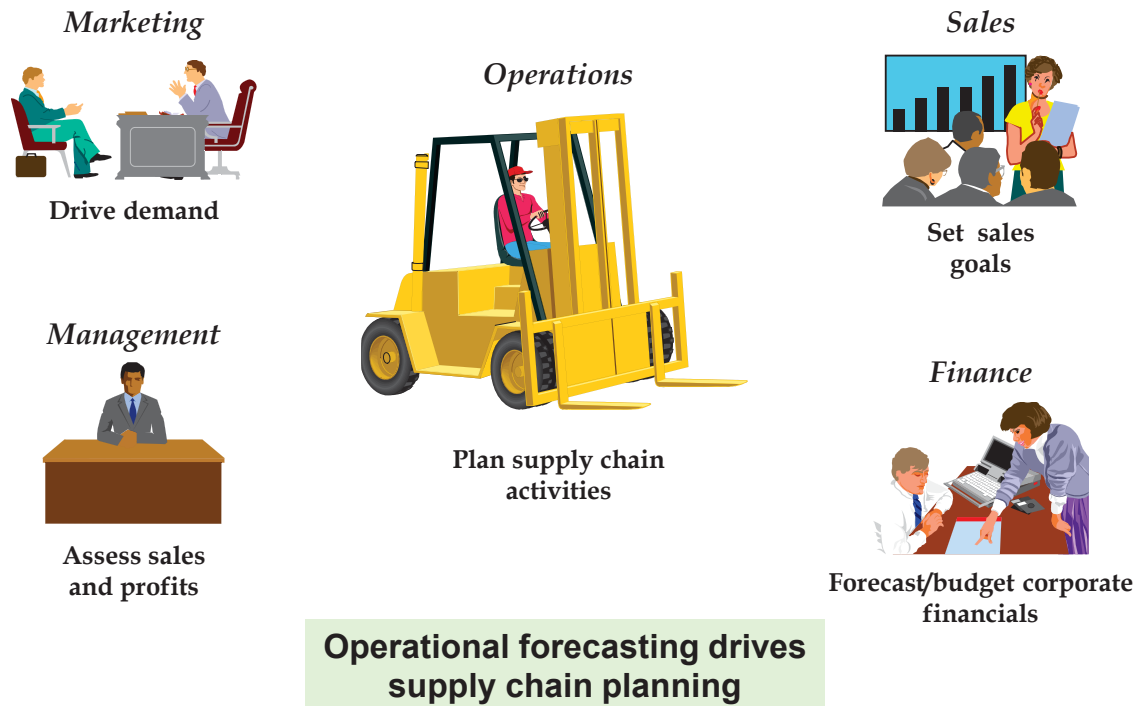
Source: Material adapted from Lapide, L. (2006) Course Notes, ESD.260 Logistics System.



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## DIFFERENT FUNCTIONS HAVE DIFFERENT OPERATIONAL NEEDS



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# WHERE SHOULD FORECASTING BELONG?

Forecasting Requirements of Various Managerial Functions

	Marketing	Sales	Finance/ Accounting	Production/ Purchasing: Long Term	Production/ Purchasing: Short Term	Logistics: Long Term	Logistics: Short Term
Needs	Annual plans (updated monthly or quarterly) for new and existing products or product changes, promotional efforts, channel placement, and pricing	Setting goals for the sales force and motivating salespeople to exceed those goals	Projecting cost and profit levels and capital needs	Planning the development of plant and equipment	Planning specific production runs	Planning the development of storage facilities and transportation equipment	Specific decisions of what products to move to what locations and when
Level	Product or product line	Territory and/or customer	Corporate, division, product line	Product (SKU)	Product (SKU)	Product by location (SKUL)	Product by location (SKUL)
Horizon	Annual	1-2 years	1-5 years	1-3 years	1-6 months	Monthly to several years	Daily, weekly, monthly
Interval	Monthly or quarterly	Monthly or quarterly	Monthly or quarterly	Quarterly	Daily, weekly, monthly	Monthly	Daily, weekly, monthly
Form	Dollars	Dollars	Dollars	Units	Units	Units/Weight/Cube	Units/Weight/Cube

Source: Chapter 1 - Managing the sales forecasting process



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## Forecasting Requirements by Functions

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# FORECASTING TRUISMS

## A. Forecasts are always wrong



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# FORECASTS ARE ALWAYS WRONG

## Why?

- ❑ Demand is essentially a continuous variable
- ❑ Every estimate has an “error band”
- ❑ Forecasts are highly disaggregated
  - Typically SKU-Location-Time forecasts
- ❑ Things happen . . .

## OK, so what can we do?

- ❑ Don't fixate on the point value
- ❑ Use range forecasts
- ❑ Capture error of forecasts
- ❑ Use buffer capacity or stock



# FORECASTING TRUISMS

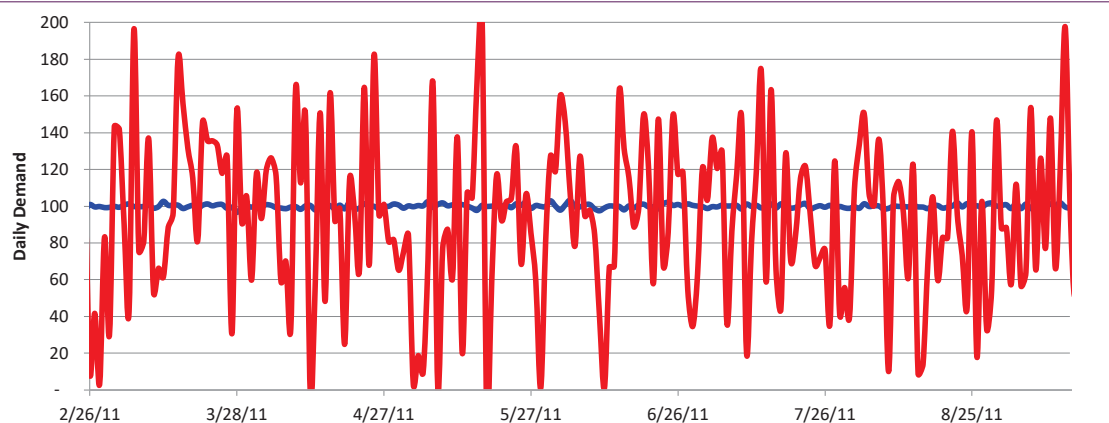
B. Aggregated forecasts are more accurate



# AGGREGATED FORECASTS ARE MORE ACCURATE

- Aggregation by SKU, Time, Location, etc.
- Coefficient of Variation (CV)
  - Definition: Standard Deviation / Mean  $\Rightarrow \sigma/\mu$
  - Provides a relative measure of volatility or uncertainty
  - CV is non-negative and higher CV indicates higher volatility

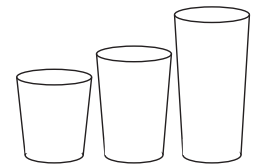
Red:  $\mu=100, \sigma=45, CV=0.45$     Blue:  $\mu=100, \sigma=1, CV=0.01$



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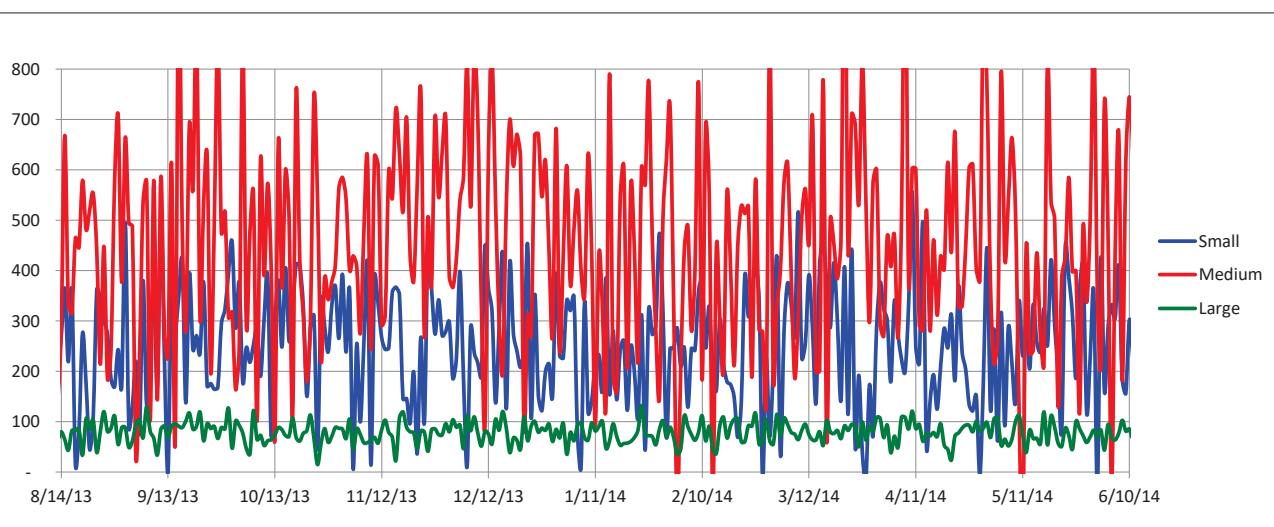
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## AGGREGATING BY SKU



### ■ Coffee Cups and Lids @ the Sandwich Shop

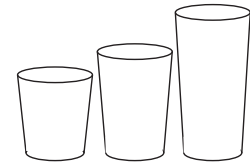
- |          |                    |           |  |
|----------|--------------------|-----------|--|
| - Large  | $\sim N(80, 30)$   | CV = 0.38 | Large: Stable, Do not sell many            |
| - Medium | $\sim N(450, 210)$ | CV = 0.47 | Medium has the highest volatility          |
| - Small  | $\sim N(250, 110)$ | CV = 0.44 | Smalls: Average sellers, medium volatility |



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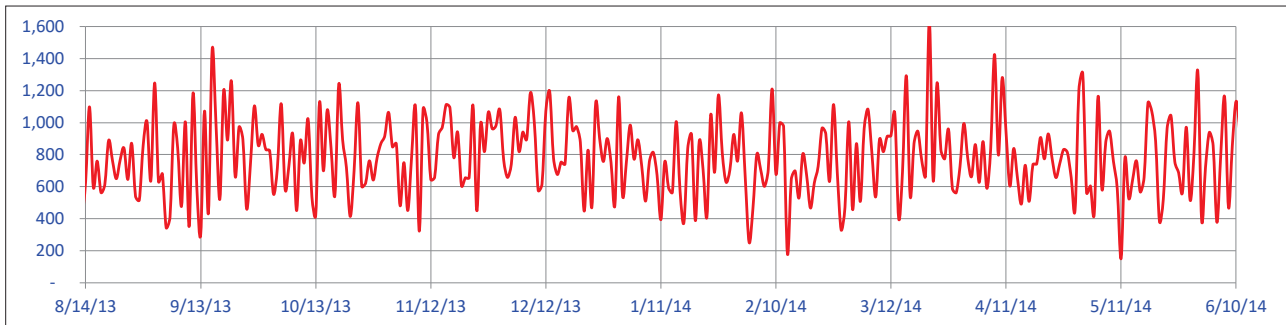
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# AGGREGATING BY SKU (RISK POOLING)



- What if I design cups with a common lid?
- Common Lid  $\sim N(780, 239)$   $CV = 0.31$ 
  - $\mu = (80 + 450 + 250) = 780$  units/day
  - $\sigma = \sqrt{30^2 + 210^2 + 110^2} = 239$  units/day

Large	$\sim N(80, 30)$	$CV=0.38$
Med.	$\sim N(450, 210)$	$CV=0.47$
Small	$\sim N(250, 110)$	$CV=0.44$
Lids	$\sim N(780, 239)$	$CV=0.31$



## Example of Modularity or Parts Commonality

- Reduces the relative variability
- Increases forecasting accuracy
- Lowers safety stock requirements

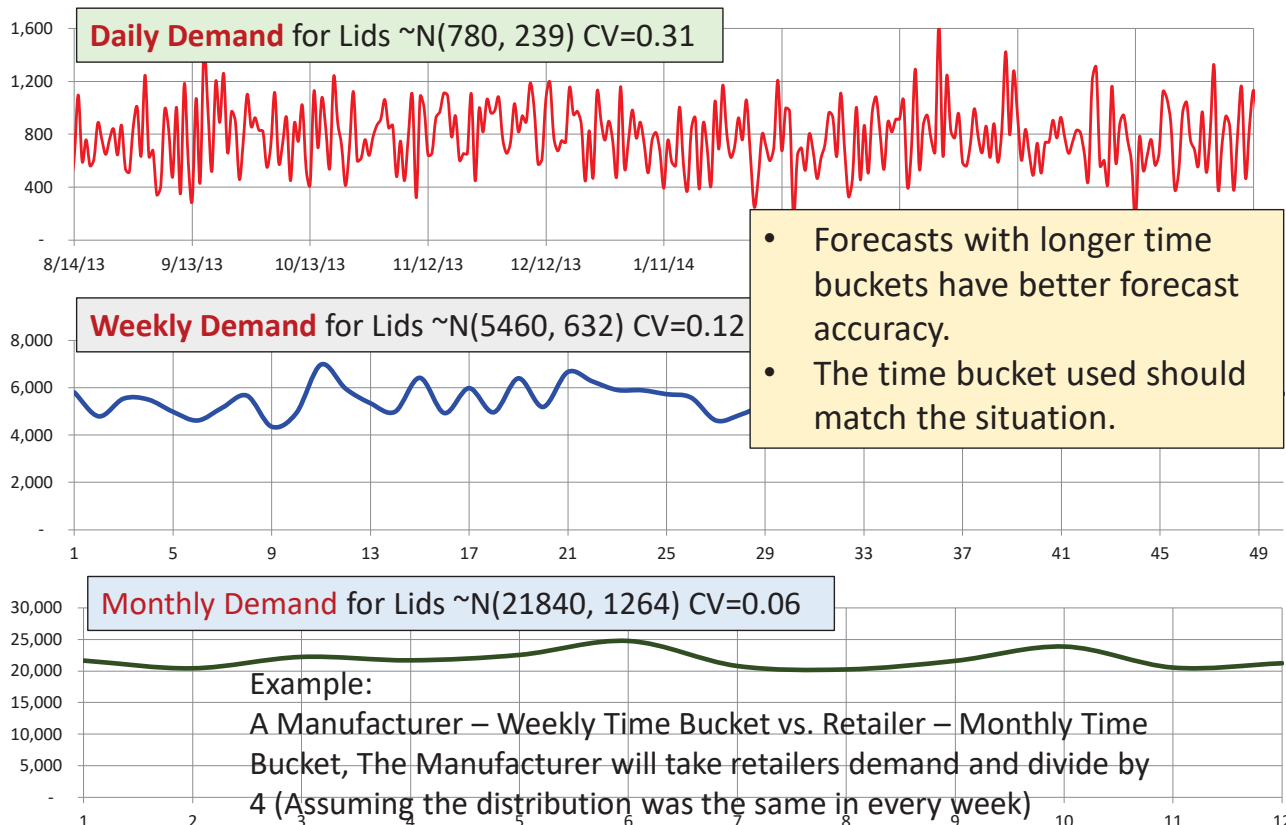
- Engineers can design common parts across, If I aggregate by SKUs or designing Modularity
- Risk Pooling!



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# AGGREGATING BY TIME



- Forecasts with longer time buckets have better forecast accuracy.
- The time bucket used should match the situation.

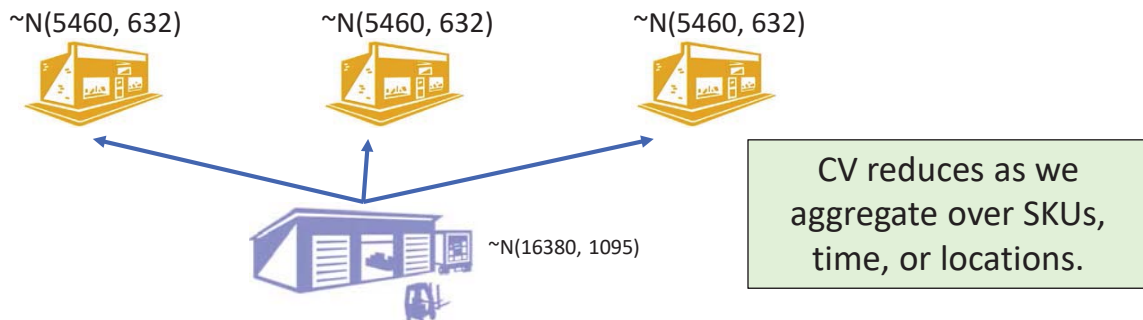


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# AGGREGATING BY LOCATIONS

- Suppose we have three sandwich shops
  - Weekly lid demand at each  $\sim N(5460, 632)$ ,  $CV=0.12$

*~ weekly demand example from previous slide*



- What if demand is pooled at a common Distribution Center?
  - Weekly lid demand at DC  $\sim N(16380, 1095)$   $CV=0.07$

$$CV_{ind} = \frac{\sigma}{\mu}$$

$$CV_{agg} = \frac{\sigma\sqrt{n}}{\mu n} = \frac{\sigma}{\mu\sqrt{n}} = \frac{CV_{ind}}{\sqrt{n}}$$

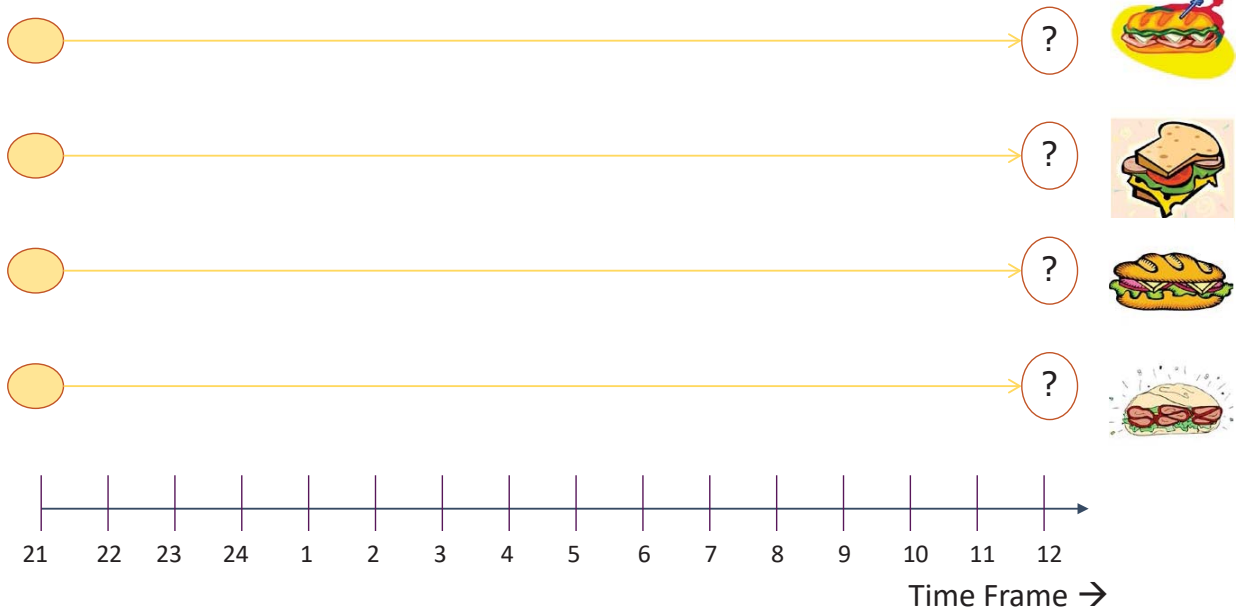


# FORECASTING TRUISMS

C. Shorter horizon forecasts are more accurate



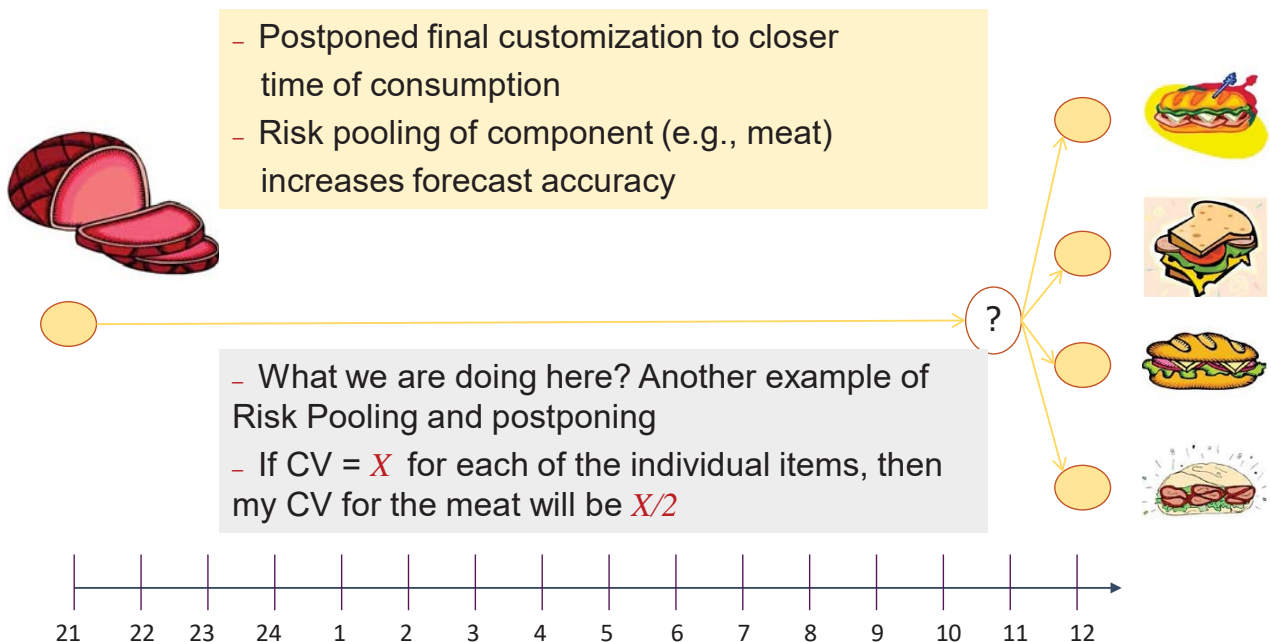
# FORECASTING FOR SHORTER HORIZONS IS MORE ACCURATE THAN LONGER



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# FORECASTING FOR SHORTER HORIZONS IS MORE ACCURATE THAN LONGER



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# FORECASTING TRUISMS

- Forecasts are always wrong
  - ▢ Use ranges & track forecast error
- Aggregated forecasts are more accurate
  - ▢ Risk pooling reduces CV
    - By SKU
    - By Time
    - By Locations
- Shorter time horizon forecasts are more accurate
  - ▢ Postpone customization until as late as possible

