



THE ECONOMICS OF (BIG) DATA

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The Economics of (Big) Data

I What about Data?

II What about Economics?

III What about Economics of Data?

IV What about Privacy?

V What about Data Governance?

VI The Importance of Economics of (Big) Data





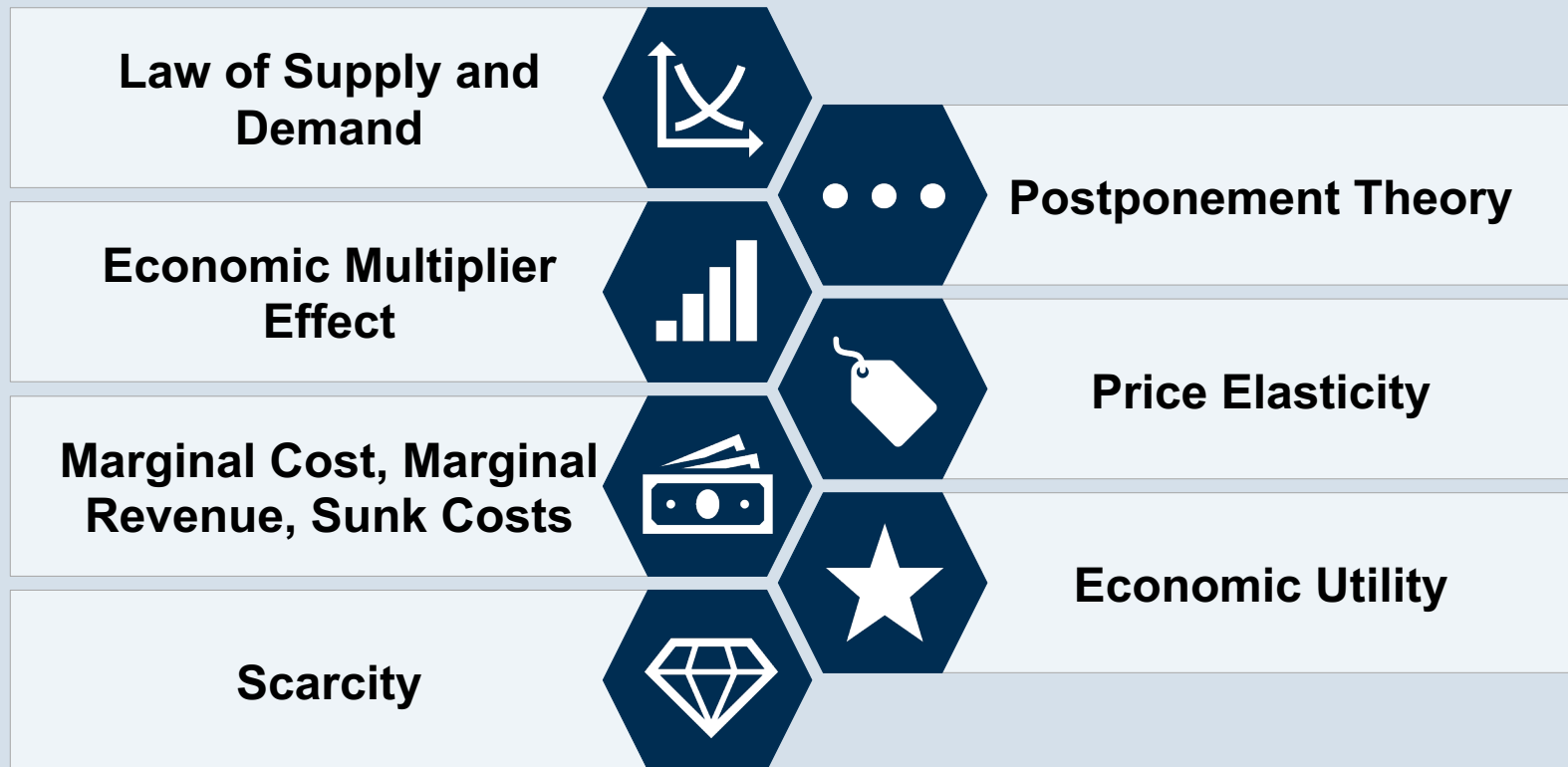
Economics is the branch of knowledge concerned with the **production, consumption, and transfer of wealth and value**. It is the scientific **study of human action and behaviors**, particularly as it relates to **human choice** and the **utilization of scarce assets** to achieve certain outcomes.



Economic efficiency is when **all goods and factors** of production are **distributed or allocated to their most valuable uses** and waste is eliminated or minimized.



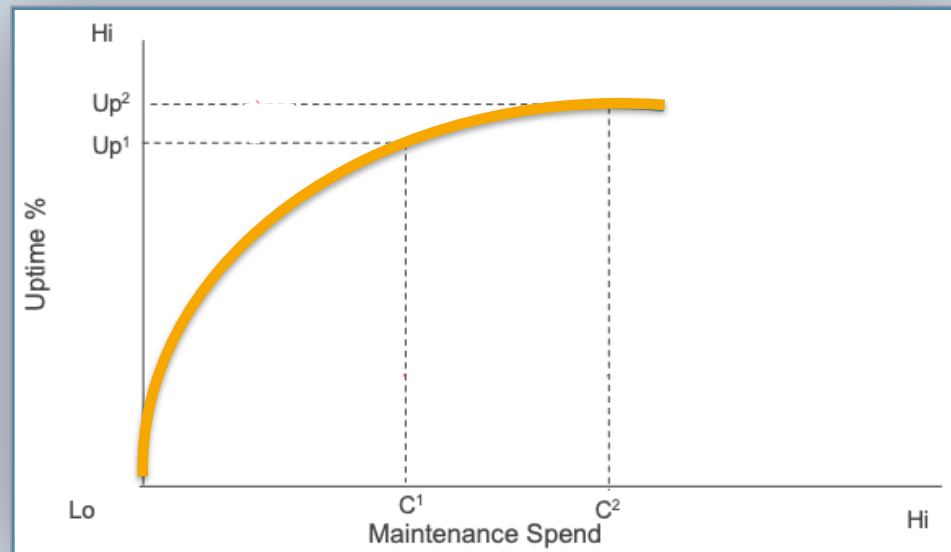
Core Economic Concepts



The Economic Value Curve

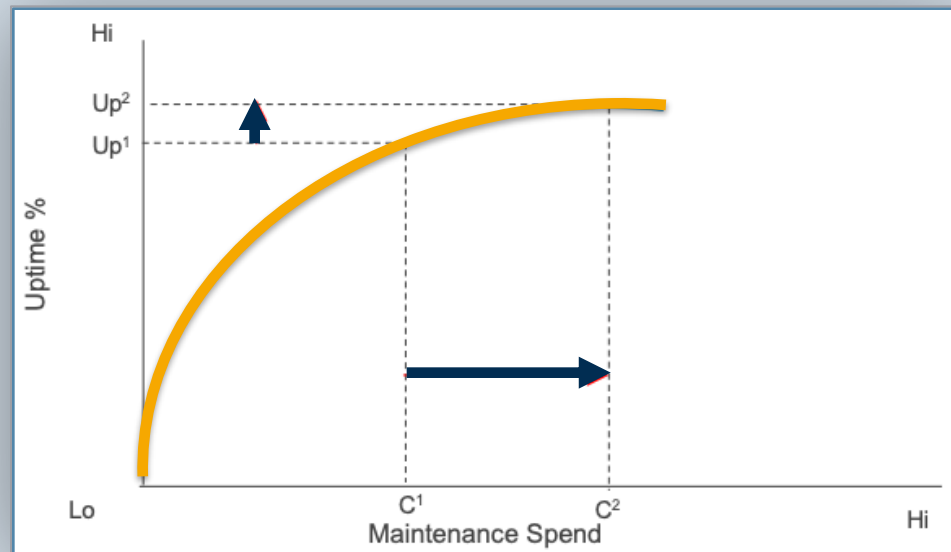


The **Economic Value Curve** measures the relationship between a dependent variable and independent variables to achieve a particular business or operational outcome.

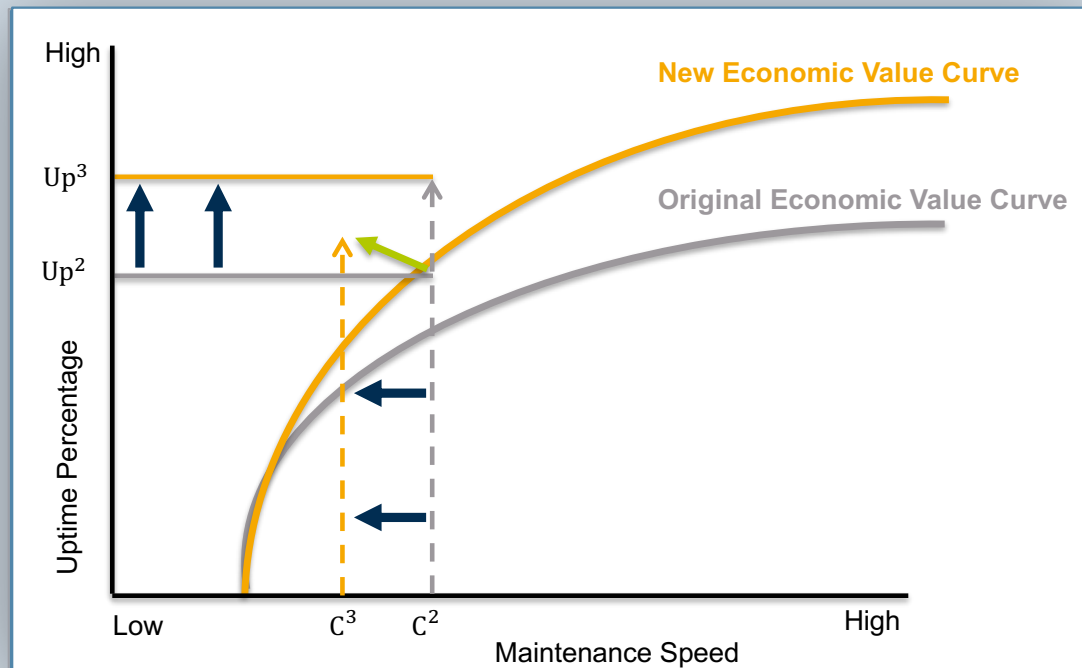




The **Law of Diminishing Returns** is a measure of the decrease in marginal or incremental output of production as the amount of a single factor of input is incrementally increased, while the amounts of all other factors of production stay constant.

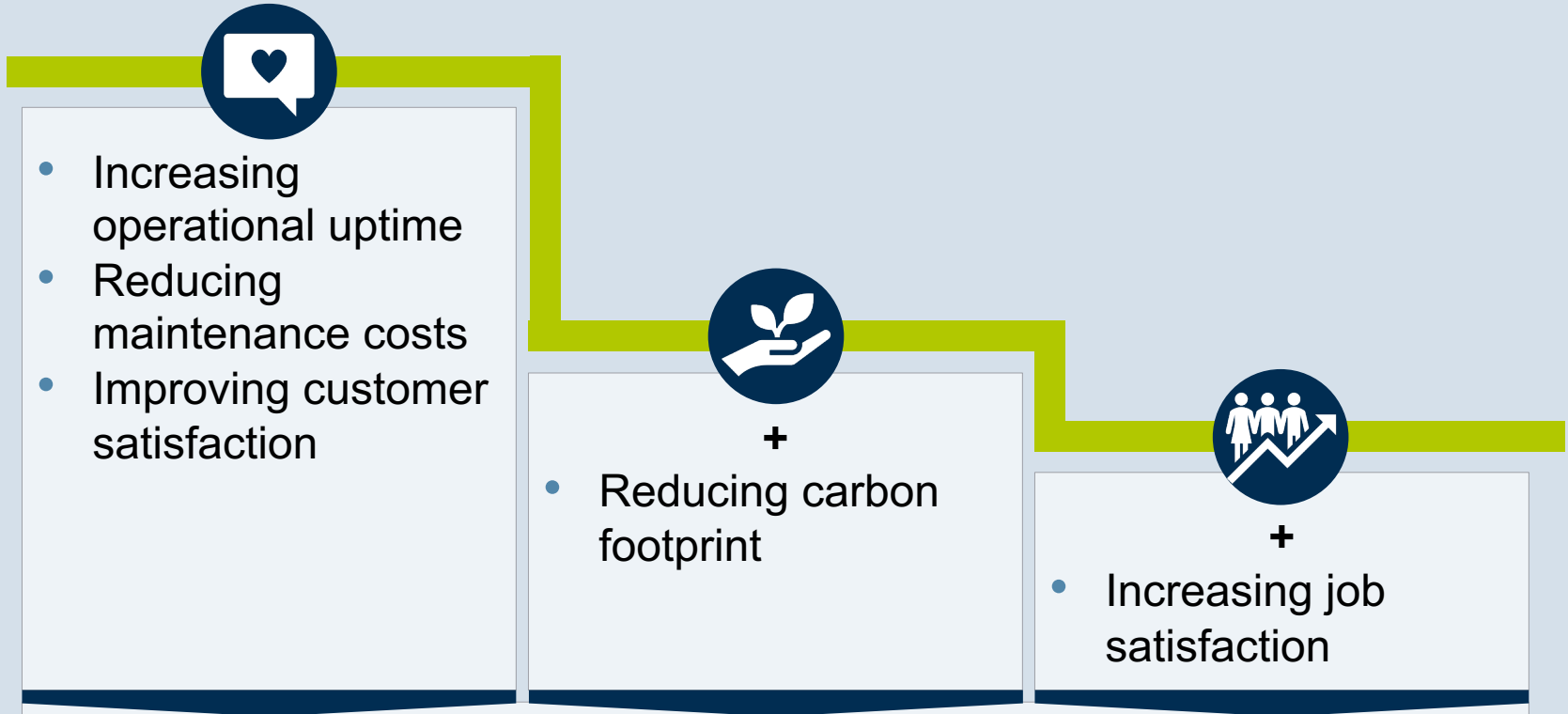


Transforming the Economic Value Curve



The way to beat the **Law of Diminishing Returns** is to leverage analytics to create a new **Economic Value Curve**.
That is, increase Uptime with less maintenance spend.

Transforming the Economic Value Curve

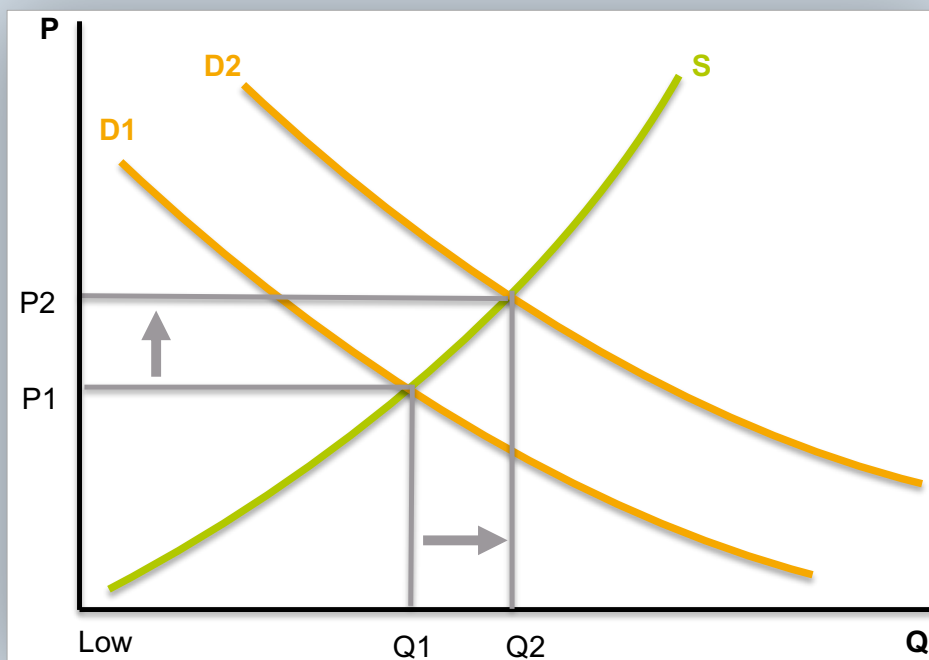


The more **diverse** the set of variables against which the analytics need to optimize and the more **granular** the results, the more **holistic** the **transformation** of the organization's **economic value curve**.

The Law of Supply and Demand



The **Law of Supply and Demand** dictates the relationship between the quantity of a commodity that producers wish to sell at various prices and the quantity that consumers wish to buy.



S = supply
D = demand
P = price
Q = quantity

The Economic Multiplier Effect



The **Economic Multiplier Effect** is a ratio of the impact of an incremental increase in investment on the resulting incremental increase in value.

+2.6%



Product Dev.

New product introduction

+3.5%



Call Center

Customer retention

+2.0%



Marketing

Customer acquisition

+2.5%



Sales

Promotional effectiveness



Customer Point of Sales Data

Marginal Propensity to Consume



The **Marginal Propensity to Consume (MPC)** equals change in output as a ratio to the change in investment.

$$\begin{array}{c} \text{MPC} \quad \text{⚖️} \\ \text{Marginal Propensity to} \\ \text{Consume} \end{array} = \frac{\begin{array}{c} \text{Change in} \\ \text{Output/Production} \quad \text{🏗️} \end{array}}{\begin{array}{c} \text{Change in} \\ \text{Input/Investment} \quad \text{💰} \end{array}}$$



By focusing marketing spend on the top 5 deciles of customers (propensity-to-buy analytic score), we can capture 90% of predicted customer spend with only half the budget.

Marginal Costs



Marginal Cost is the incremental change in the total cost that arises when the quantity produced is incremented by one unit; that is, it is the **cost of producing one more unit of a good**.



Fixed Costs

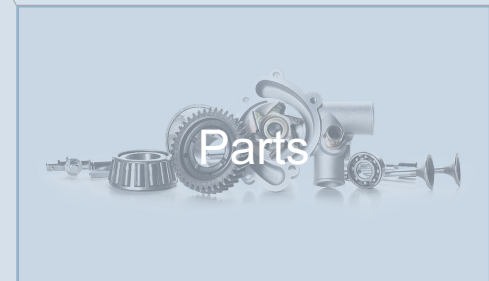
do not vary with the level of production



Production Sites

Variable Costs

vary with the level of production



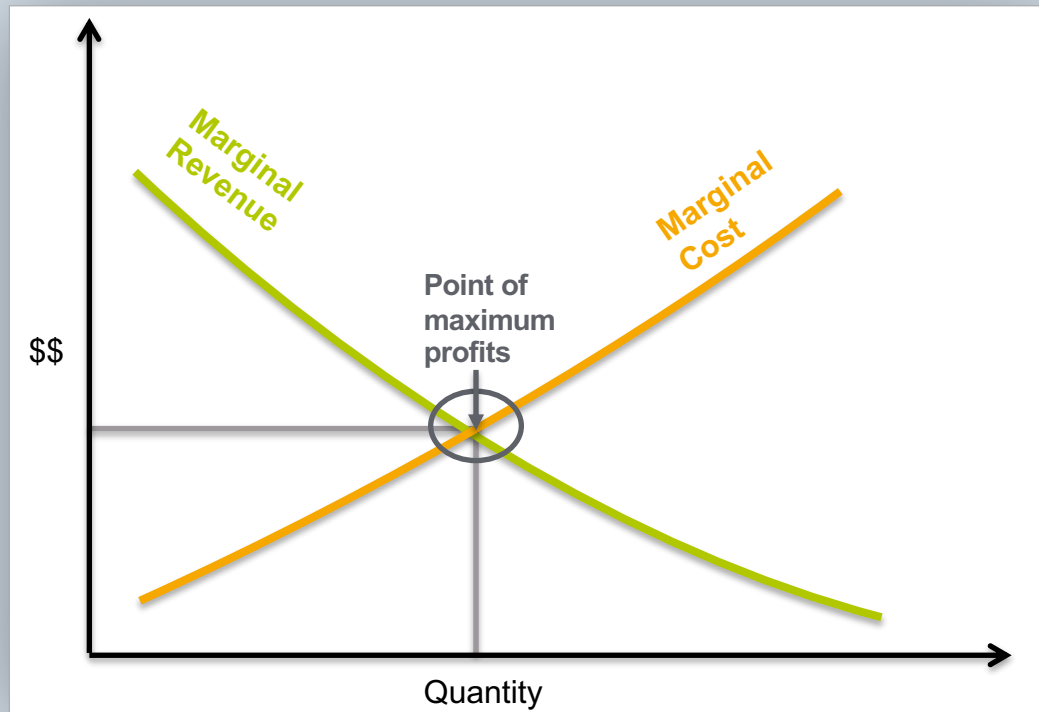
Parts



Marginal Revenue versus Marginal Cost



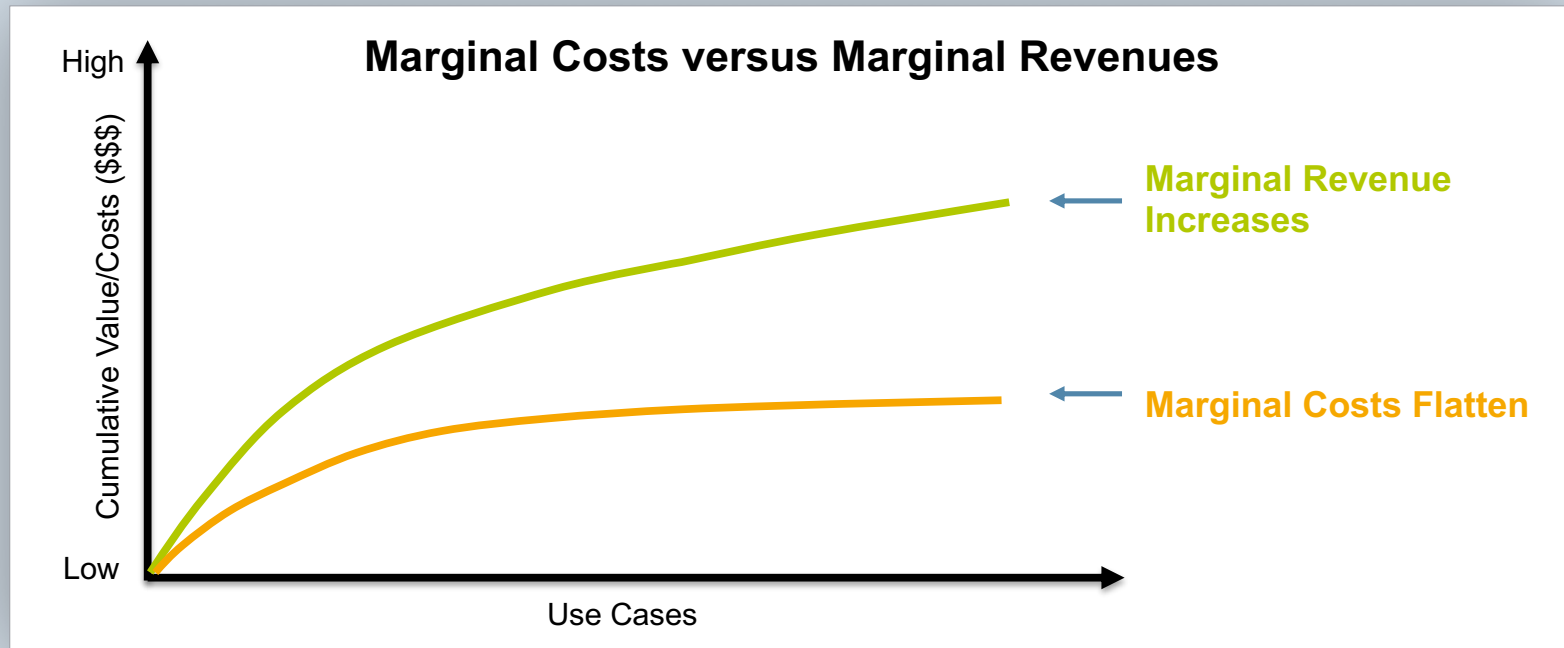
An organization seeking to maximize its profits should produce up to the point where the **Marginal Cost** equals the **Marginal Revenue** for each additional unit of production.



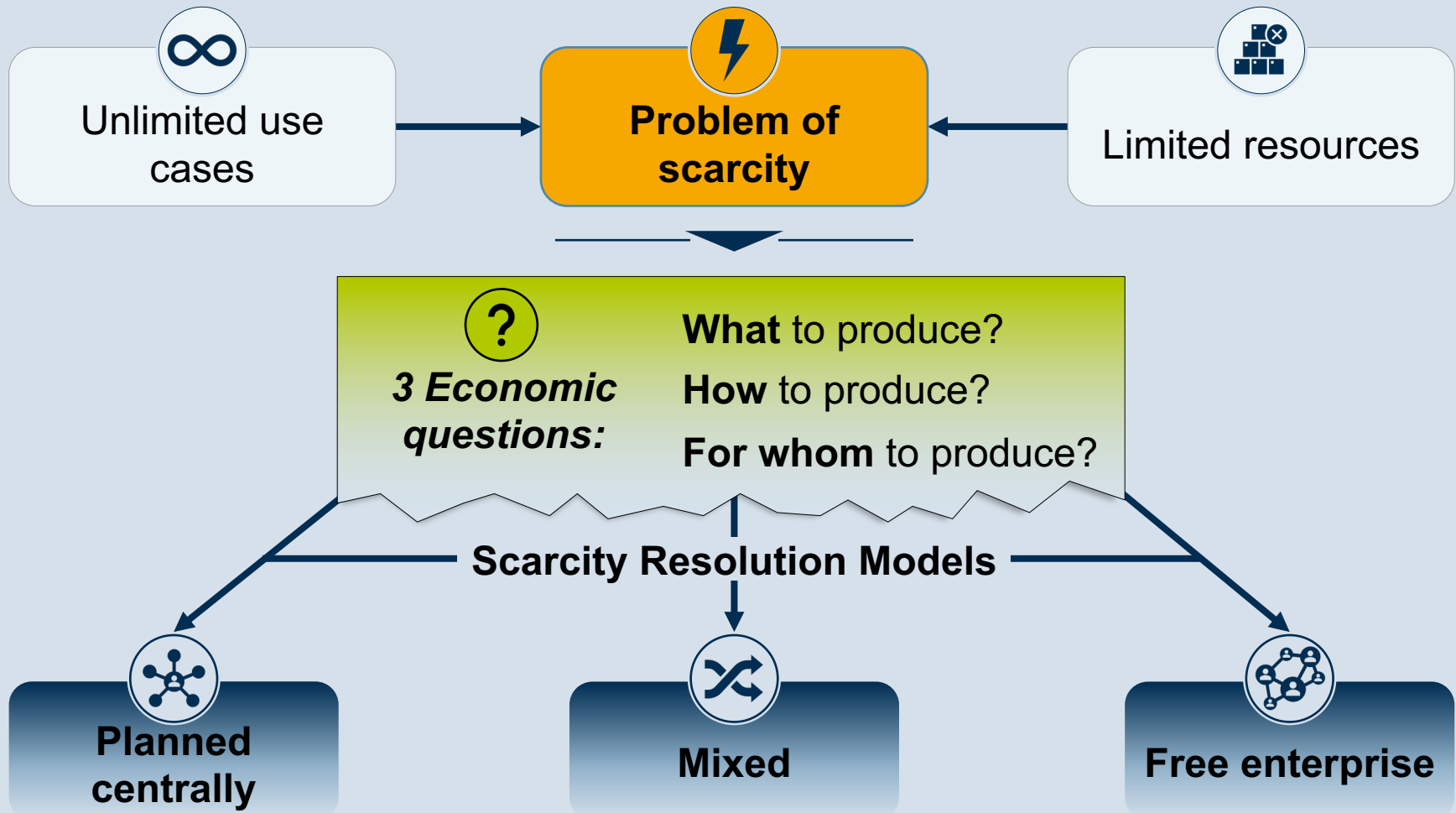
Marginal Costs and Sunk Costs



Sunk Costs are costs that have already been incurred and cannot be recovered.



Dilemma of Scarcity

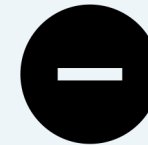
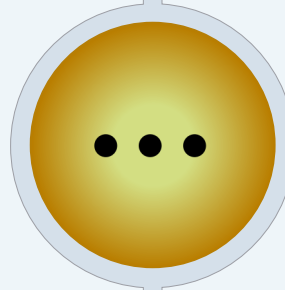




Postponement Theory is an economic strategy that maximizes possible benefits and minimizes risks by delaying a decision in order to gain additional data or analytic insights.



Costs of Type I error
(false positive)



Costs of Type II error
(false negative)



What are the **Type I Error** (False Positive) and **Type II Error** (False Negative) risks and costs associated with the decision?



What is the **estimated effectiveness** of the current decision given the Type I and Type II decision risks?



What data *might* be needed to improve the effectiveness of that decision given the Type I and Type II errors?



How much more accurate can the decision be made given these new data sources and additional data science time?



Price Elasticity of demand is the quantitative measure of consumer behavior that indicates the quantity of demand for a product/service depending on its increase or decrease in price.

$$\begin{array}{c} \epsilon \\ \text{Price Elasticity} \\ \text{of Demand} \end{array} = \frac{\begin{array}{c} \Delta q / q \\ \text{\% change in quantity} \end{array}}{\begin{array}{c} \Delta p / p \\ \text{\% change in price} \end{array}}$$

$\epsilon > 1$: **elastic** demand \longrightarrow demand is **sensitive** to a price increase

$\epsilon < 1$: **inelastic** demand \longrightarrow demand is **insensitive** to a price increase

Elastic and Inelastic Goods

Inelastic Goods



- Demand only reacts weakly or not at all to price changes
- E.g., Energy

Elastic Goods



- Demand reacts strongly to price changes
- E.g., Beverages



Take into consideration all the costs associated with data:



Confidence in data is everything!

The Economic Utility Function



An economic good yields utility to the extent to which it is useful for satisfying a consumer's want or need.



Marginal utility is the utility gained by consuming an additional unit of a good/service.

Consumers will strive to **maximize their utility** or value.



Utility from data and analytics is measured by the perceived value received from the consumption or **usage of an additional unit of data** and analytic assets.

