# ORIE 6154 - Pricing and Revenue Management

Instructor: Siddhartha Banerjee

Semester: Fall 2016

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#### **Essential Course Information**

Instructor

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Office hours: W 2pm-4pm (or by appointment)

# Essential Course Information (contd.)

Lectures

Course Number: ORIE 6154 Class time: TR 1:25-2:40pm Class location: Philips 307

Course Communication:

Website: http://people.orie.cornell.edu/sbanerjee/

ORIE6154/orie6154f16.html

BlackBoard for all announcements (search for ORIE 6154)

ORIE 6154 - Introduction

Pricing and Revenue Optimization

"...application of analytics to predict consumer behavior and optimize product availability, and price to maximize revenue..."

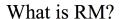
Pricing and Revenue Optimization

"...application of analytics to predict consumer behavior and optimize product availability, and price to maximize revenue..."

Selling the right product to the right customer at the right time for the right price

ORIE 6154 - Introductio

A canonical example





- Consider the decisions faced in selling a house?
  - When should we put it on the market?
  - What price should we ask?
  - Given an offer, should we accept it?
  - If there are no offers, should we <u>lower the</u> <u>asking price</u>? If so, <u>by how much</u>? <u>When</u>?

Courtesy: Huseyin Topaloglu

Optimizing a firm's "interface with the market"

Selling formats: auctions, negotiations, posted prices

Demand estimation/learning

Capacity control of scarce resources

Dynamic pricing and price discrimination

Choice modeling; segmentation; assortment optimization

Multiple products and markets

Competition with other firms

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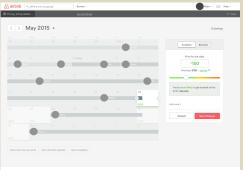
Complementary to Supply-Chain Management

Concerned with minimizing production costs

ORIE 6154 - Introduction

# Why study RM now?

Canonical example ++



Courtesy: www.guesty.com



# Why study RM now?

#### Advances in technology

Automated transactions

Better monitoring tools and extensive data

More fine-grained market control

New application settings

#### Advances in methodology

Better learning and estimation techniques

Rich and growing toolbox for decision making

- RM studies design decisions of a monopolist seller
  - Capacity/pricing/segmentation decisions
  - Price-taking buyers/exogenous demand models
  - Competition with other firms
- Market design considers optimization of the overall marketplace

How market rules affect buyer/seller equilibrium

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#### **Examples**

• Point-to-point pricing for car2go: revenue management Dynamic pricing in Uber/Lyft: market design

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#### Examples

- Point-to-point pricing for car2go: revenue management Dynamic pricing in Uber/Lyft: market design
- AirBnB Reputation mechanisms: market design
   AirBnB price recommendation tool: revenue management (?)

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- AirBnB Reputation mechanisms: market design
  AirBnB price recommendation tool: revenue management (?)

ORIE 6154: Revenue Management, ORIE 6180: Market Design

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#### Course Structure

Mix of lectures (for initial fundamentals), seminar-style discussions (for more recent developments).

4 assignments +1 prelim

Final project

# 10/13

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Final project

#### Prerequisites:

Probability and stochastic processes: at the level of ORIE 6500

Optimization: at the level of ORIE 6300

Microeconomics, game theory, algorithms: useful, but not required

ORIE 6154 - Introduction

# Warmup (and some history)

The creation story: RM in the Airline Industry

• Airline Deregulation Act (1978): No price regulations, free market entry

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- Airline Deregulation Act (1978): No price regulations, free market entry
- New low-cost carriers: People Express (1981)
- American Airlines respond with Super-Saver Fares (1978)
  - 30-days advance purchase, business vs. leisure (price discrimination)
  - Few seats at discounted price (capacity control)
  - DINAMO Dynamic Inventory Allocation and Maintenance Optimizer

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  - DINAMO Dynamic Inventory Allocation and Maintenance Optimizer
- Note: Not a price war; better revenue management

# RM in the Airline Industry

# Results of the New Strategy

- AMR shares initially plunged on announcement of "Ultimate Super Saver" fares Jan. 1985
  - Analysts thought it was the start of a price war
  - "American cannot operate profitably at these fares"
- DINAMO proved to be surprisingly effective
  - AA total revenues rose
  - Competitors suffered: e.g. People Express

1984 \$60M profit (all-time high) — DINAMO

1985 \$160M loss

1986 Bankruptcy, sold to Continental

Courtesy: Huseyin Topaloglu

# RM in the Airline Industry

The Multiple Fare-Class Capacity Allocation Problem

So what did American Airlines do?