



Flight Overbooking: Models and Practice

16.75J/1.234J Airline Management

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Lecture Outline

- **Overbooking Terminology and Relationships**
- **Evolution of Airline Overbooking Models**
 - Manual/Judgmental
 - Deterministic Model
 - Probabilistic/Risk Model
 - Cost-Based Overbooking Model
- **Costs of Denied Boardings and Spoilage**
- **Customer Service and Goodwill Issues**



Background: Flight Overbooking

- **Determine maximum number of bookings to accept for a given physical capacity.**
- **Minimize total costs of denied boardings and spoilage (lost revenue).**
- **U.S. domestic no-show rates can reach 15-20 percent of final pre-departure bookings:**
 - On peak holiday days, when high no-shows are least desirable
 - Average no-show rates have dropped, to 10-15% with more fare penalties and better efforts by airlines to firm up bookings
- **Effective overbooking can generate as much revenue gain as fare class seat allocation.**



Overbooking Terminology

- **Physical Capacity** **CAP**
- **Authorized Capacity** **AU**
- **Confirmed Bookings** **BKD \leq AU**
- **Waitlisted passengers** **WL**
- **Go-show passengers** **GS**
- **Stand-by passengers** **SB**



Overbooking Terminology (cont'd)

- **No-shows** **NS**
- **Show-ups** **SU**
- **No-show rate** **NSR**
- **Show-up rate** **SUR**
- **Passengers Boarded** **PAX**
- **Denied Boardings** **DB**
- **Spoilage** **SP**



Overbooking Relationships

- 1. $PAX = \min [BKD - NS + GS + SB, CAP]$
 $= BKD + GS - NS + SB - DB$**
- 2. $BKD = NS + SU$**
- 3. $SU = PAX + DB - GS - SB$**
- 4. $NSR = (BKD - SU) / BKD$**
- 5. $SUR = SU / BKD = 1.0 - NSR$**
- 6. $SP = CAP - PAX$, only when $BKD = AU$**



Evolution of Airline Overbooking Models

- **Overbooking models try to minimize:**
 - Total costs of overbooking (denied boardings plus spoilage)
 - Risk of “excessive” denied boardings on individual flights, for customer service reasons
- **Mathematical overbooking problem:**
 - Find $OV > 1.00$ such that $AU = CAP * OV$
 - But actual no-show rate is highly uncertain



1. Manual/Judgmental Approach

- **Relies on judgment of human analyst to set overbooking level:**
 - Based on market experience and perhaps recent no-show history
 - Tendency to choose $OV = 1 + NSR$ (or lower)
 - Tendency to focus on avoidance of DB

- **For $CAP=100$ and mean $NSR=.20$, then:**

$$AU = 100 (1.20) = 120$$



2. Deterministic Model

- **Based on estimate of mean NSR from recent history:**
 - Assume that $BKD=AU$ (“worst case” scenario)
 - Find AU such that $AU - NSR*AU = CAP$
 - Or, $AU = CAP/(1-NSR)$
- **For $CAP=100$ and $NSR=0.20$, then:**

$$AU = 100/(1-.20) = 125$$



3. Probabilistic/Risk Model

- **Incorporates uncertainty about NSR for future flight:**
 - Standard deviation of NSR from history, STD
- **Find AU that will keep DB=0, assuming BKD=AU, with a 95% level of confidence:**
 - Assume a probability (Gaussian) distribution of no-show rates
- **Keep show-ups less than or equal to CAP, when BKD=AU:**
 - Find SUR*, so that $AU \times SUR^* = CAP$, and $Prob[AU \times SUR^* > CAP] = 5\%$
- **From Gaussian distribution, SUR* will satisfy:**

$$Z = 1.645 = \frac{SUR^* - SUR}{STD}$$

where SUR = mean show-up rate

STD = standard deviation of show-up rate



Probabilistic/Risk Model (cont'd)

- **Optimal AU given CAP, SUR, STD with objective of DB=0 with 95% confidence is:**

$$\text{AU} = \frac{\text{CAP}}{\text{SUR} + 1.645 \text{ STD}} = \frac{\text{CAP}}{1 - \text{NSR} + 1.645 \text{ STD}}.$$

- **In our example, with STD= 0.05:**

$$\text{AU} = 100 / (1 - 0.20 + 1.645 * 0.05) = 113$$

- **The larger STD, the larger the denominator and the lower the optimal AU, due to increased risk/uncertainty about no-shows.**



Probabilistic Model Extensions

- 1. Reduce level of confidence of exceeding DB limit:**
 - Z factor in denominator will decrease, causing increase in AU
- 2. Increase DB tolerance to account for voluntary DB:**
 - Numerator becomes (CAP+ VOLDB), increases AU
- 3. Include forecasted empty F or C cabin seats for upgrading:**
 - Numerator becomes (CAP+FEMPTY+CEMPTY), increases AU
 - Empty F+C could also be “overbooked”
- 4. Deduct group bookings and overbook remaining capacity only:**
 - Firm groups much more likely to show up
 - Flights with firm groups should have lower AU



4. Cost-Based Overbooking Model

- Find AU that minimizes :

[Cost of DB + Cost of SP]

- For any given AU:

$$\text{Total Cost} = \$DB * E[DB] + \$SP * E[SP]$$

$\$DB$ and $\$SP$ = cost per DB and SP, respectively

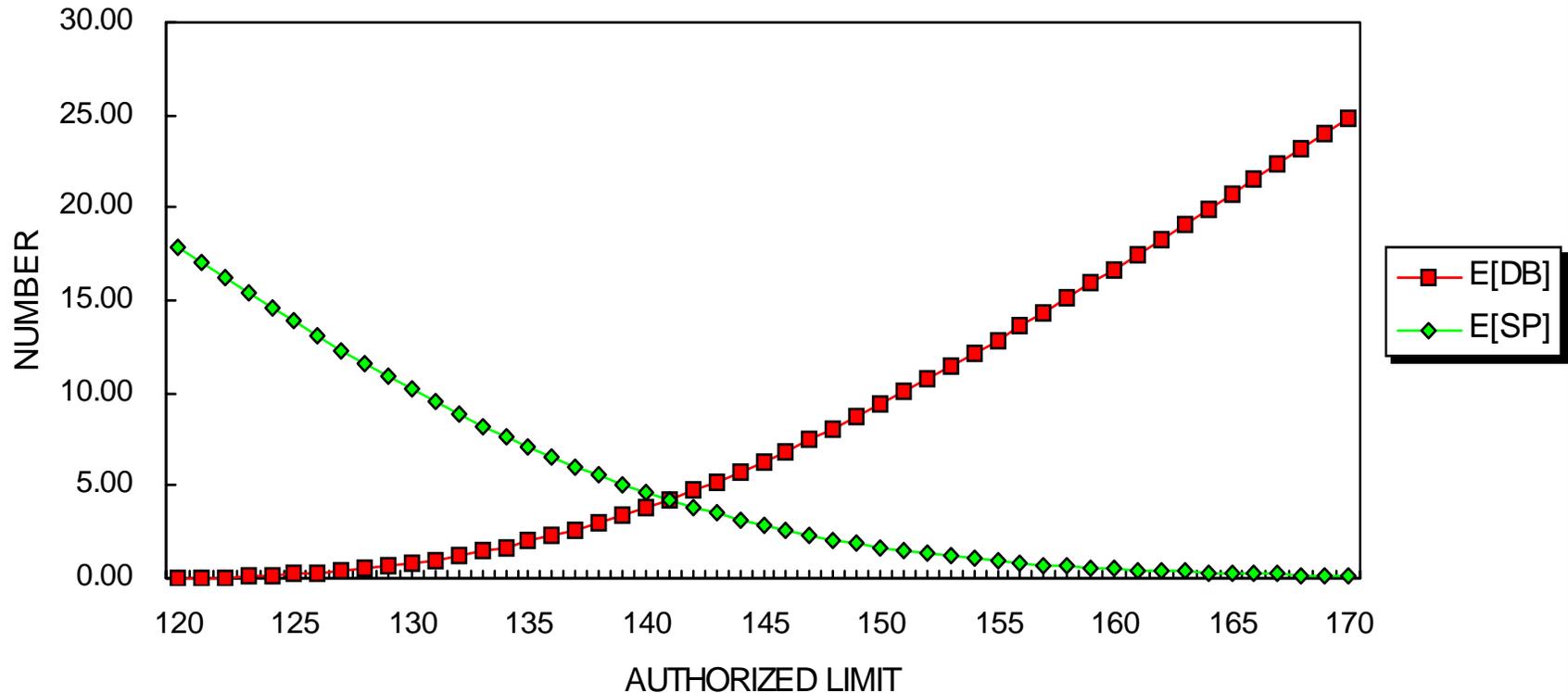
$E[DB]$ = expected number of DBs, given AU

$E[SP]$ = expected number of SP seats, given AU

- Mathematical search over range of AU values to find minimum total cost.

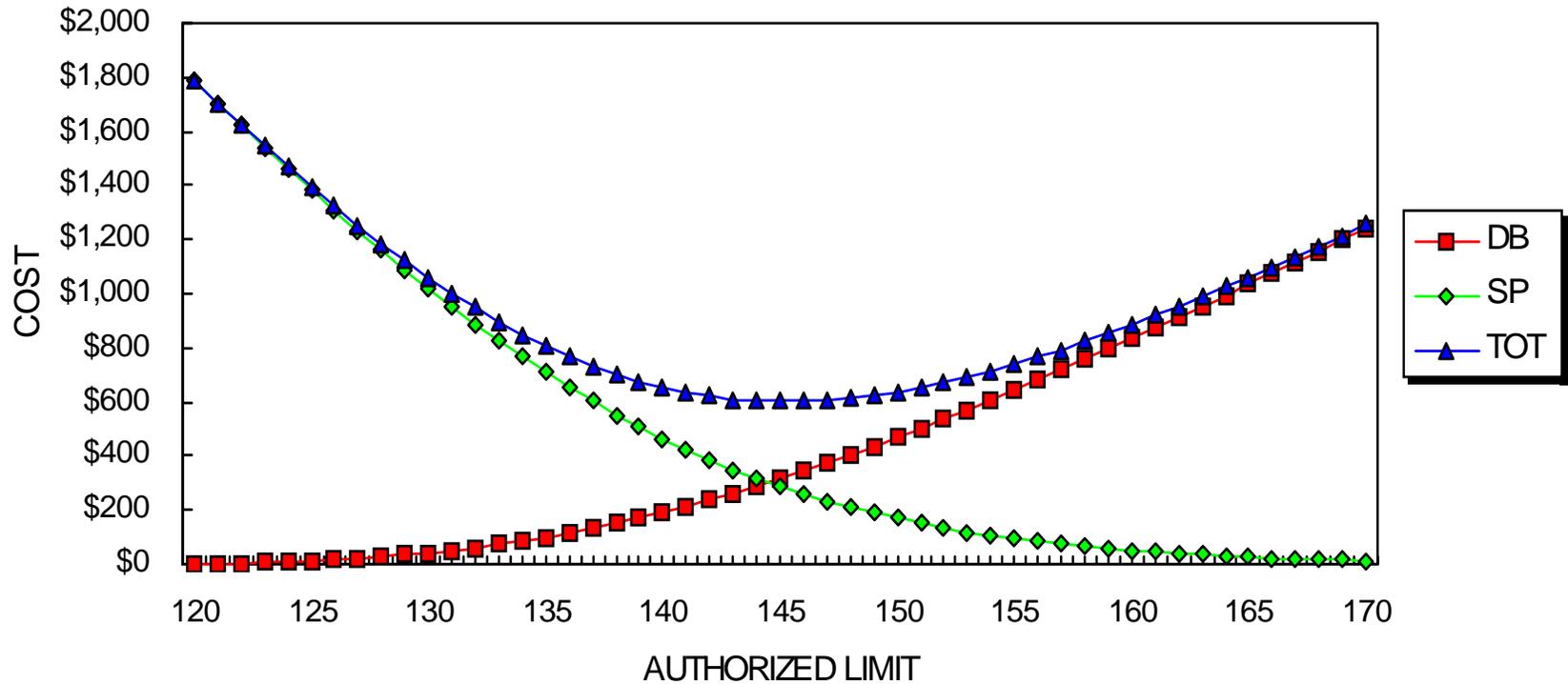
Example: Cost-Based Overbooking Model

Expected Denied Boardings and Spoilage
 $CAP=120$ $NSR = 0.15$, $\text{Sigma} = 0.08$



Example: Cost-Based Overbooking Model

Denied Boarding and Spoilage Costs
 DB Cost = \$50, SP Cost = \$100





Cost Inputs to Overbooking Model

- **Denied Boarding Costs:**
 - Cash compensation for involuntary DB
 - Free travel vouchers for voluntary DB
 - Meal and hotel costs for displaced passengers
 - Space on other airlines
 - Cost of lost passenger goodwill costs
- **Many airlines have difficulty providing accurate DB cost inputs to these models.**



Cost Inputs (cont'd)

- **Spoilage Costs:**
 - Loss of revenue from seat that departed empty
- **What is best measure of this lost revenue:**
 - Average revenue per seat for leg?
 - Highest fare class revenue on leg (since closed flights lose late-booking passengers)?
 - Lowest fare class revenue on leg (since increased AU would have allowed another discount seat)?
- **Specifying spoilage costs is just as difficult.**



Customer Service and Goodwill

- **Many airlines tend to view aggressive overbooking in negative terms:**
 - Denied boardings associated with poor customer service and loss of passenger goodwill
- **But revenue loss of spoiled seats can be greater than DB costs:**
 - Objective is to reduce both actual costs and loss of goodwill due to denied boardings
 - Comprehensive Voluntary DB program needed



Voluntary vs. Involuntary DBs

- **Comprehensive Voluntary DB Program:**
 - Requires training and cooperation of station crews
 - Identify potential volunteers at check-in
 - Offer as much “soft” compensation as needed to make the passenger happy
- **US airlines very successful in managing DBs:**
 - 2004 involuntary DB rate was 0.62 per 10,000
 - 95% of DBs in U.S. are volunteers
 - Good treatment of volunteers generates goodwill

2004 US Involuntary DBs per 10,000

