



*MIT International Center for Air Transportation*

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# **RESEARCH HIGHLIGHTS: PRICING, DISTRIBUTION AND REVENUE MANAGEMENT**

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**Presentation to  
Industry Advisory Board Meeting  
November 4, 2004**



# OUTLINE

- **MIT PODS Research Consortium**
  - Overview of PODS Capabilities
- **RM System Performance in Low-Fare Environment**
  - Trend Towards “Fare Simplification”
  - Assessment of Revenue and Traffic Impacts
  - Development of New Forecasting and Optimization Algorithms
- **Distribution Channels and RM Systems**
  - Website Search Engines and Cached Seat Availability
  - Impacts on Airline Revenues
  - Research Into Changing Consumer Choice Patterns



## PODS RM Research Consortium

- **Airline revenue management research at MIT funded in large part by PODS Research Consortium**
  - Focus on forecasting and optimization models for seat inventory control (seat allocation), as opposed to pricing/fare structures
  - Findings used to help guide each airline's RM system development
- **Most member airlines have renewed; new member added in 2004**

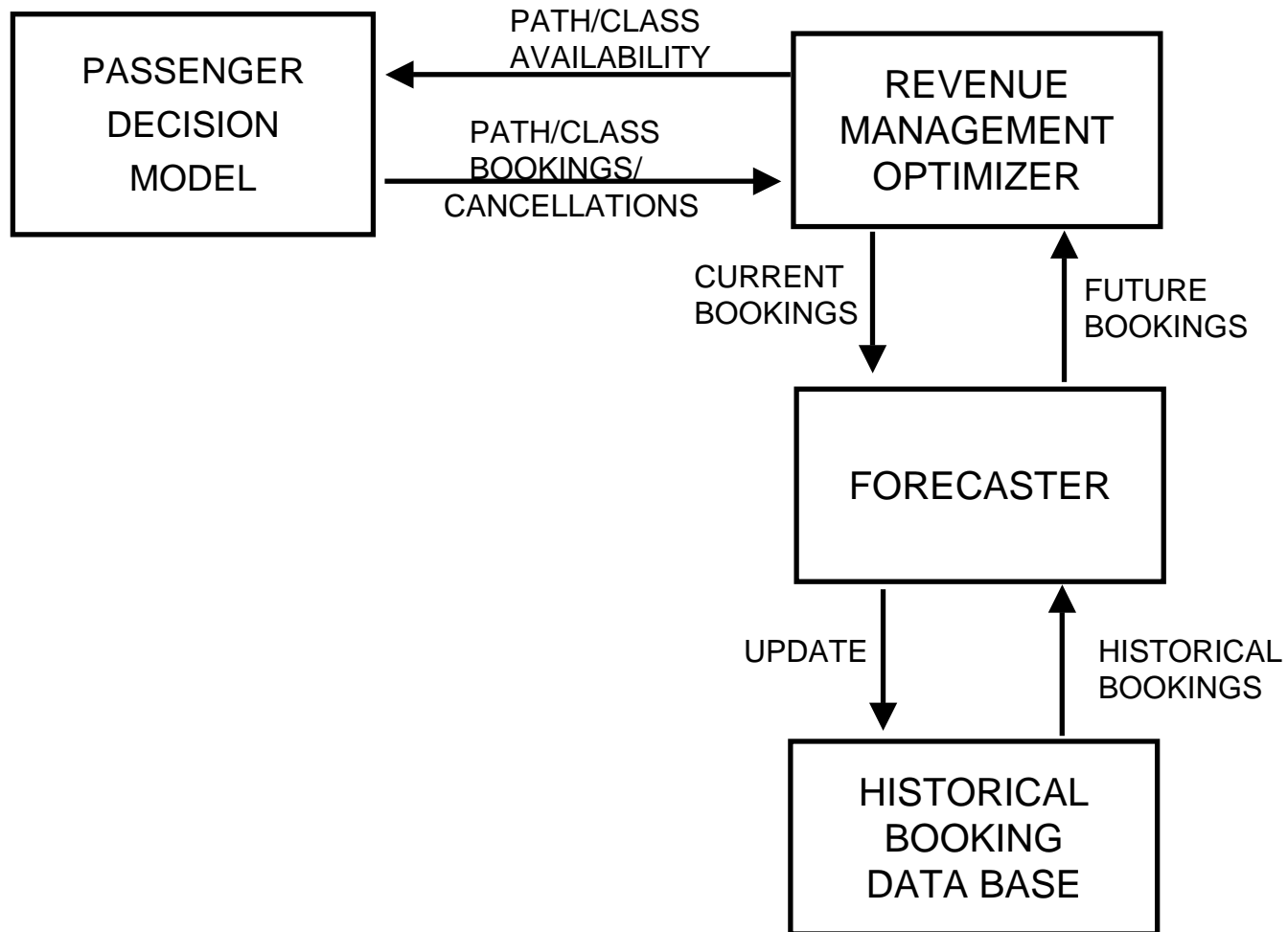
Continental Airlines	Lufthansa German Airlines
Scandinavian Airlines System	Northwest Airlines
Delta Air Lines	KLM Royal Dutch Airlines
Air New Zealand (new)	Swiss International Airlines (?)



# Passenger Origin Destination Simulator

- **PODS simulates interaction of RM and passenger choice in *competitive* markets:**
  - Airlines must forecast booking demand from actual (previously simulated) historical data
  - RM systems set booking limits by leg/class or path/class (O+D) given demand forecasts and optimization/control scheme
  - Passengers choose among O-D paths/fare types and airlines based on prices, restrictions and RM availability
- **Realistic environment for testing RM methods, and their impacts on traffic and revenues**
  - Recognized as “state of the art” in RM simulation

# PODS Simulation Flow





## Impacts of LFA Entry with Less Restricted and Lower Fares

- **Recent trend toward “simplified” fares – compressed fare structures with fewer restrictions**
  - Initiated by some LFAs and America West, followed by Alaska as well as legacy carriers in many US domestic competitive markets
  - Also common in Canada, Europe and Asia in markets where LFAs are growing
- **PODS simulations of impacts given changing fare structures and LFA competition:**
  - Revenue impacts of “simplified” fare structures
  - Effectiveness of RM systems for both network and low-fare airlines under lower and less restricted fares?
  - Revenue gains of Network RM (O+D Control) in networks with both standard and LFA markets?



## BOS-SEA Fare Structure

American Airlines, October 1, 2001

Roundtrip Fare (\$)	Cls	Advance Purchase	Minimum Stay	Change Fee?	Comment
458	N	21 days	Sat. Night	Yes	Tue/Wed/Sat
707	M	21 days	Sat. Night	Yes	Tue/Wed
760	M	21 days	Sat. Night	Yes	Thu-Mon
927	H	14 days	Sat. Night	Yes	Tue/Wed
1001	H	14 days	Sat. Night	Yes	Thu-Mon
2083	B	3 days	none	No	2 X OW Fare
2262	Y	none	none	No	2 X OW Fare
2783	F	none	none	No	First Class



## BOS-SEA Simplified Fare Structure

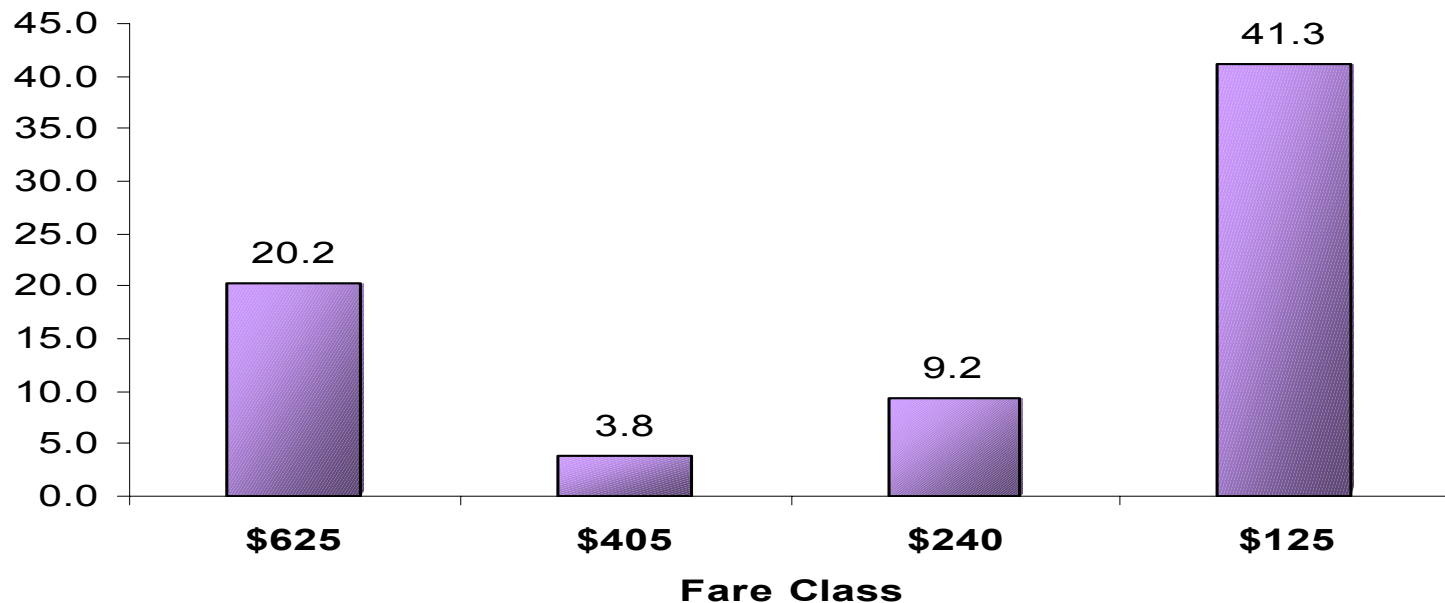
### Alaska Airlines and American, May 1, 2004

Roundtrip Fare (\$)	Cls	Advance Purchase	Minimum Stay	Change Fee?	Comment
374	V	21 days	1 day	Yes	Non-refundable
456	L	14 days	1 day	Yes	Non-refundable
559	Q	14 days	1 day	Yes	Non-refundable
683	H	7 days	1 day	Yes	Non-refundable
827	B	3 days	none	No	2 X OW Fare
929	Y	none	none	No	2 X OW Fare
1135	F	none	none	No	First Class

## PODS Simulation Results: Traditional “Restricted” Fare Structure

- **5:1 fare ratio; all fare classes below “full fare” have Sat. night stay and 7/14/21 day AP restrictions**
  - 74.6% load factor; total flight revenue \$64,716
  - 5% revenue gains from use of RM booking limit controls

**Loads by Fare Class**



- **Fare ratio compressed to 3.5:1; Sat. night stay restriction removed from all but lowest fare class; advance purchase restrictions retained**
  - Load factor increases to 77.8%; but total revenues drop by 15% to \$55,221
  - % Revenue impact of RM controls increases to over 8%

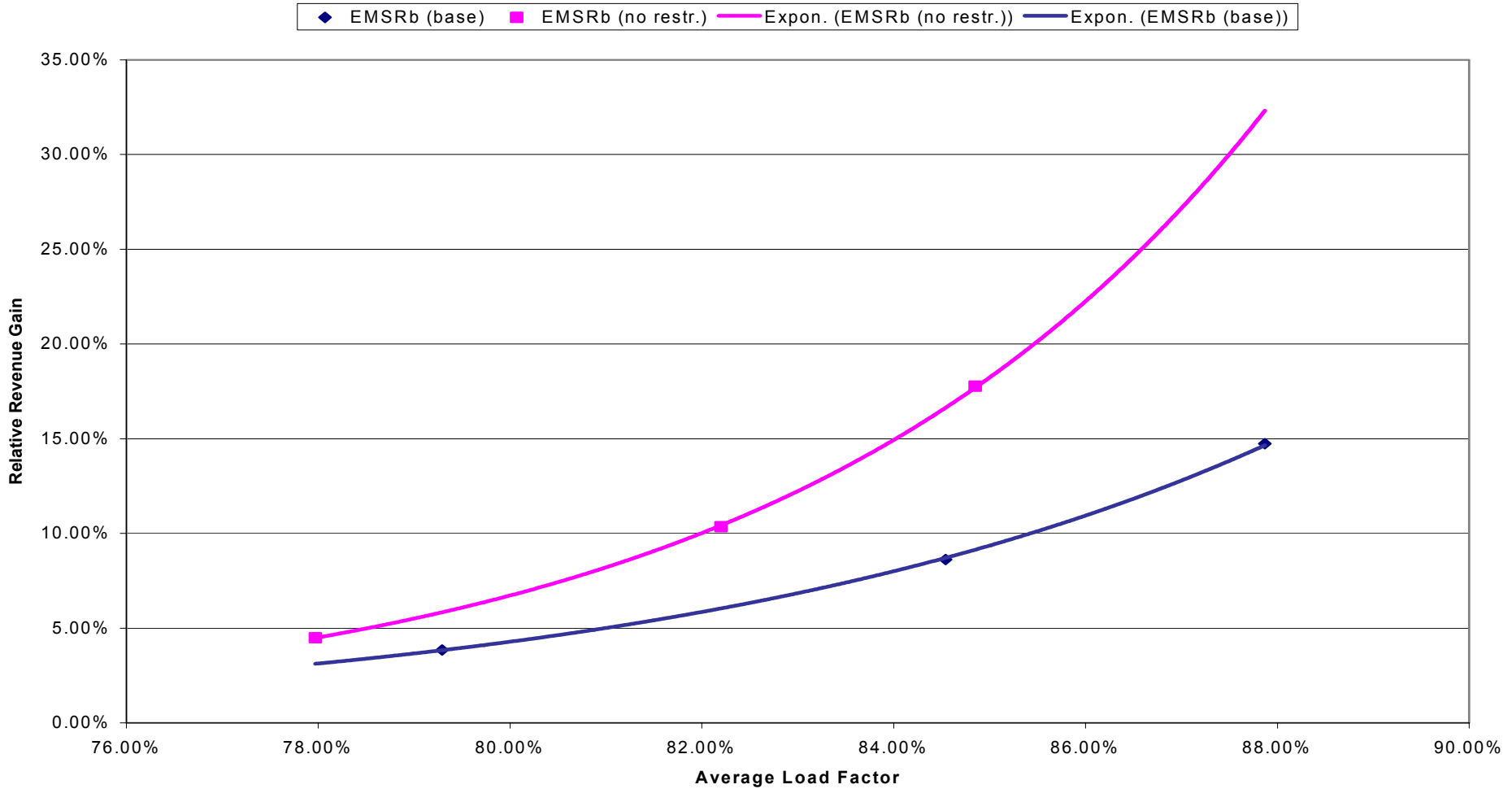
**Loads by Fare Class**





# RM Revenue Gains: Less Restricted Fare Structure with Advance Purchase

EMSRb RM Performance





## Findings: RM in Low-Fare and Less Restricted Competitive Markets

- **% revenue gains of effective RM are greater in less restricted fare structures**
  - RM inventory control becomes more important as fare structures are simplified and restrictions disappear
- **RM is also critical to LFA revenues when they compete against network carriers that use RM**
- **Network RM becomes more critical for network airlines when some markets have LFA competition**
  - Improved ability to provide greater seat availability to connecting passengers with higher revenue contribution to total network



## Existing Airline RM Systems Need to be Modified for This New Environment

- **RM systems were developed for restricted fares**
  - Assumed independent fare class demands, because restrictions kept full-fare passengers from buying lower fares
  - With unrestricted fares, passengers buy lowest available fare
- **Without modification, these RM systems do not perform well in less restricted fare structures**
  - Unless demand forecasts are adjusted to reflect potential sell-up, high-fare demand will be consistently under-forecast
  - Optimizer then under-protects, allowing more “spiral down”
- **RM system limitations are affecting airline revenues**
  - Existing systems, left unadjusted, generate high load factors but do not maximize revenues
  - Many airlines are currently using manual overrides



## Current RM Challenge is To Find New Forecasting and Optimization Models

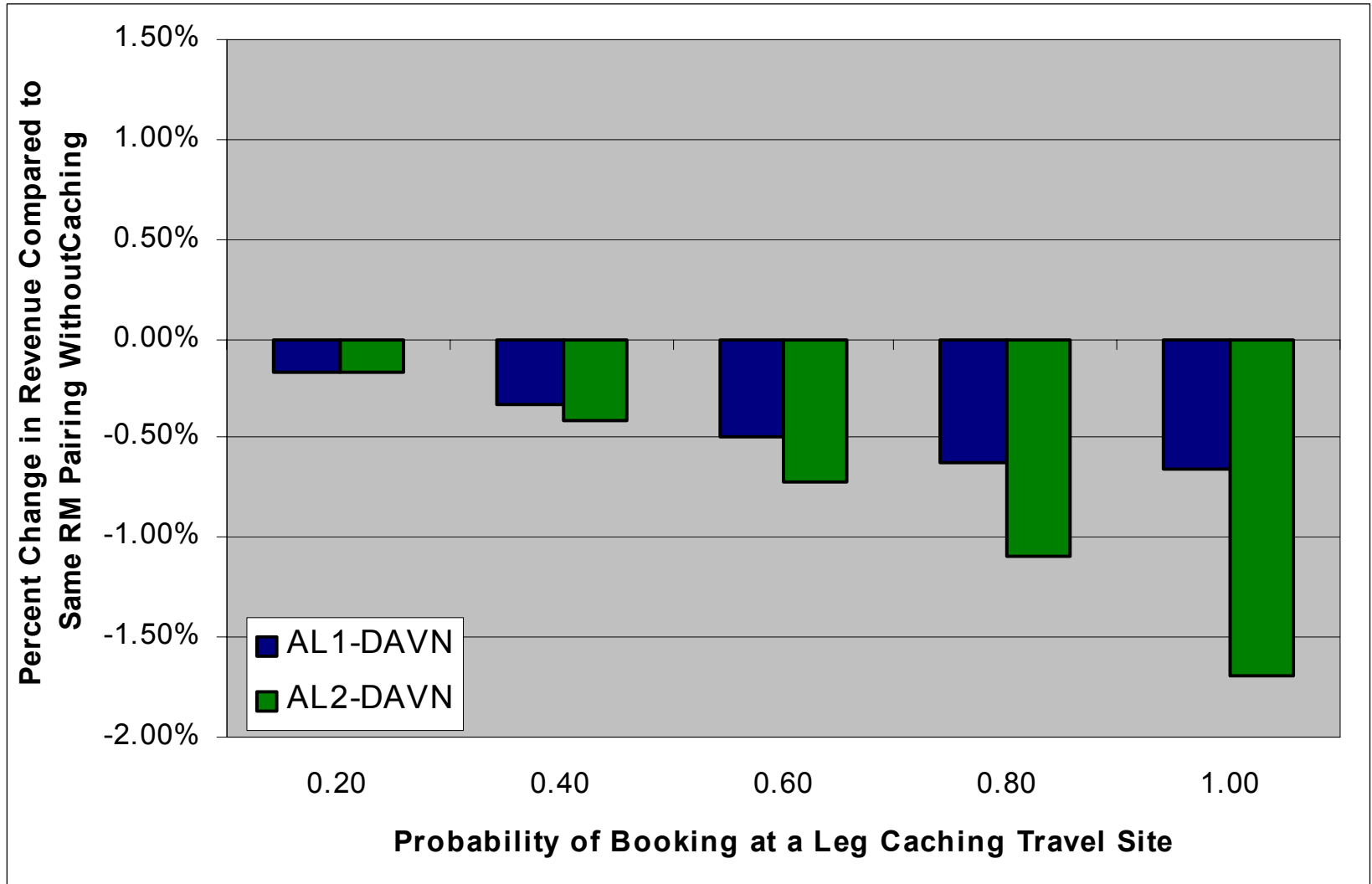
- **Less restricted fare structures require forecasting of passenger choice and “willingness to pay”**
  - Instead of forecasts by product/restriction
- **The new RM problem is much more complicated than independent class demand RM environment:**
  - Affected by passengers’ actual willingness to pay, and ability of airline to estimate this willingness to pay
- **Existing Network RM systems also need to be modified for multiple fare structures**
  - How to control seat availability in unrestricted fare domestic markets while managing seats in more traditional fare markets
  - Seats shared by passengers in both types of markets



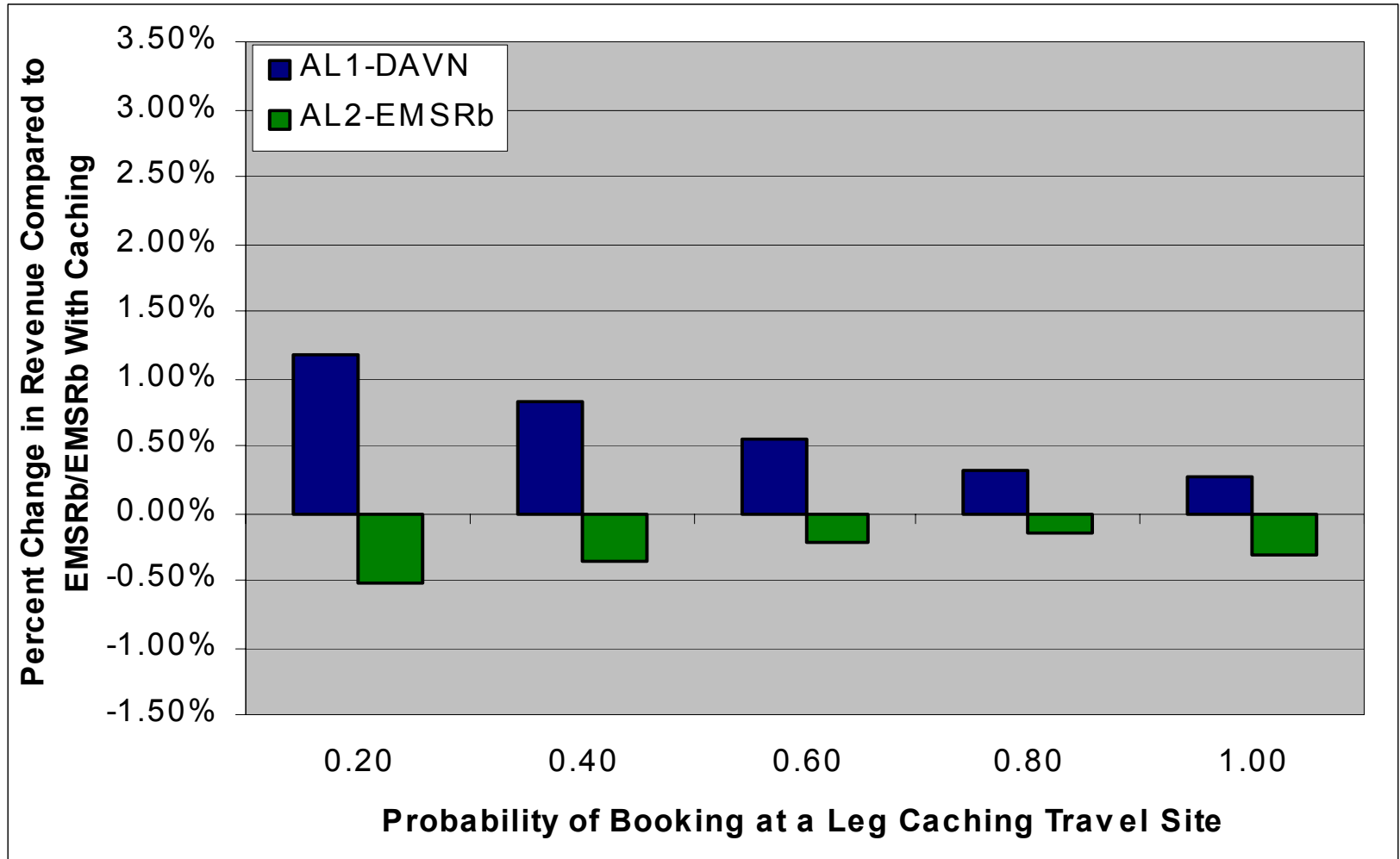
## Distribution Channels – Impacts on RM System Performance

- **Example: Website “Caching” of Seat Availability**
  - Under Network RM controls, accept/reject decision for booking requests is made by each airline, based on O-D path requested
  - Airline reservations systems cannot handle volume of “shopping” requests from travel websites, so websites store (cache) availability from history or estimate it by flight leg
  - Potential inconsistency between initial website display of available fare classes and airline’s current RM controls
- **Airline must either accept an undesirable booking, or reject it (and risk losing the sale)**
  - PODS simulations have shown that impacts of either option can both reduce total airline revenues and revenue benefits of Network RM

# Caching and Acceptance of “Unwanted” Bookings Reduce Network Revenues



# It Also Affects the Ability of Network RM to Generate Incremental Gains



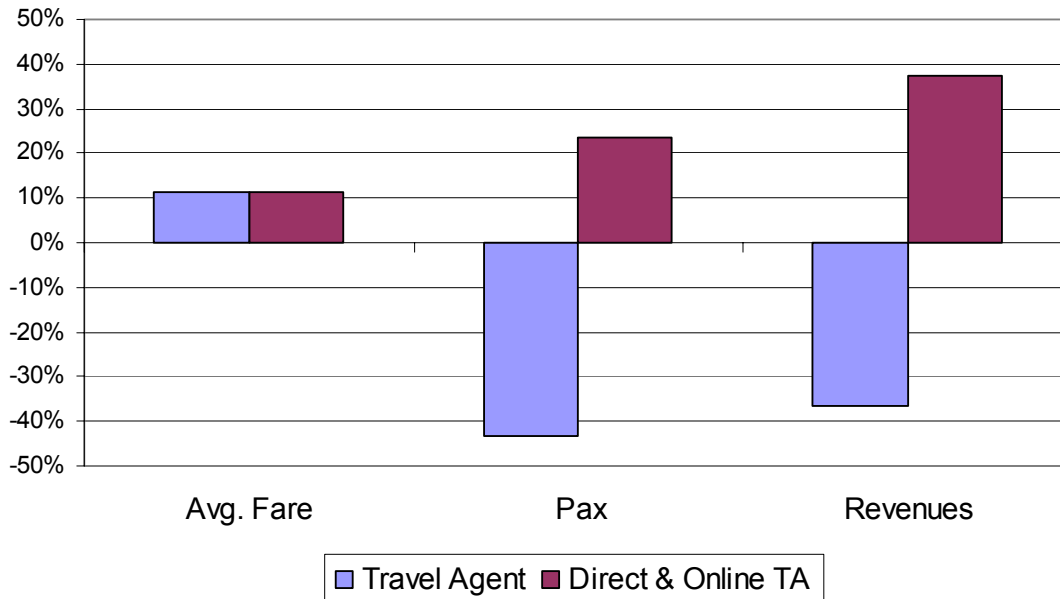


# Consumer Choice Modeling Research

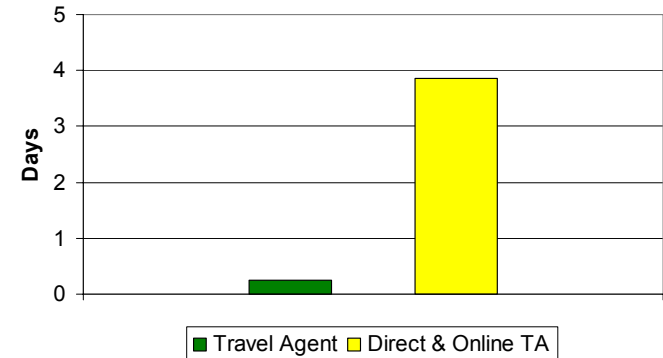
- **Use advanced discrete choice models to gain insight into changing air travel choice patterns**
  - Given less restricted fare structures and shift toward on-line booking and distribution channels
- **How have changes in pricing practices changed consumer choice?**
  - Removal of the Saturday night stay restriction on most fares
  - Compression of highest to lowest fare ratios
- **How have new distribution channels affected segmentation of air travel demand?**
  - Traditional segmentation by business vs. leisure travel

# US Major Airline's Booking Data: Differences by Distribution Channel

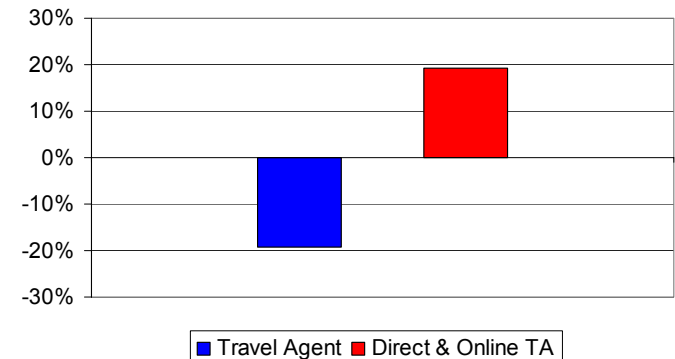
% Change (2004 vs. 2000)



Change in Advance Purchase



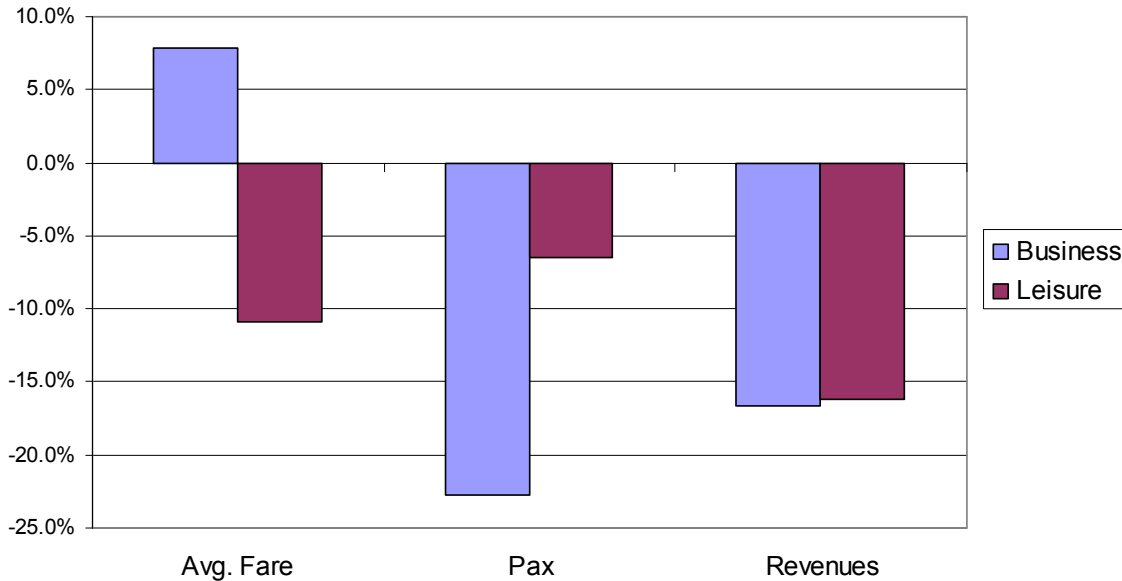
Change in Distribution Channel Market Share



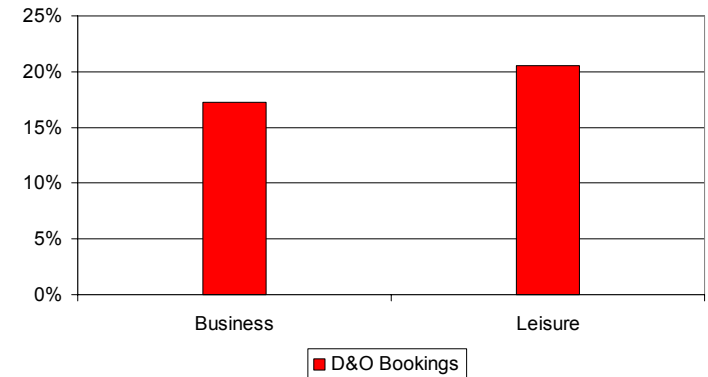
- Shift in bookings from traditional travel agents to direct/online channels
- Increased advance purchase, most notably for direct/on-line channels

# Analysis of Booking Data: Business vs. Leisure Markets

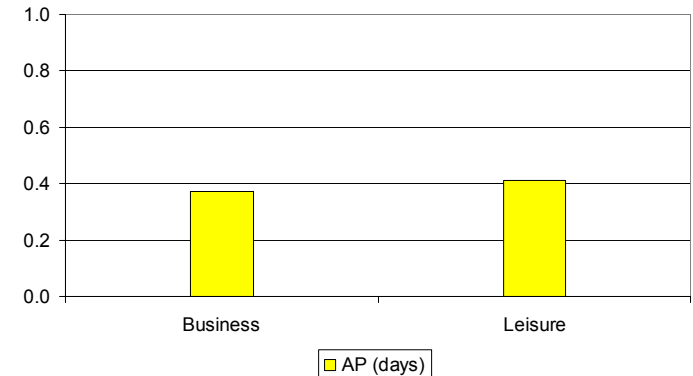
% Change (2004 vs. 2000)



Change in Distribution Channel Market Share



Change in Advance Purchase



- Shift to direct/on-line channels for both business and leisure markets
- Average fares decreased in leisure markets, increased in business markets



## Summary: Pricing and RM Research

- **RM inventory controls become more critical under less-restricted fare structures**
  - Seat availability controls have increased revenue leverage in absence of product differentiation
- **Existing RM systems have not kept pace with recent pricing developments**
  - Major changes to forecasters and optimizers required
- **Inconsistencies between RM controls and distribution channels need to be addressed**
  - Solutions include technological and computational changes as well as modifications to industry practices developed decades ago



## Thesis Titles

- **Diana Dorinson, “The Evolution of Airline Distribution Channels and Their Effects on Revenue Management Performance”, MST Thesis, submitted May 2004.**
- **Thomas Gorin, “Assessing Low-Fare Entry in Airline Markets: Impacts of Revenue Management and Network Flows, PhD Thesis, submitted September 2004.**
- **Richard Cleaz-Savoyen, “Alternative RM Algorithms for Unrestricted Fare Structures”, SM Thesis, expected June 2005.**
- **Emmanuel Carrier, “Evolving Consumer Choice and Booking Patterns in the Airline Industry”, PhD Thesis, expected June 2006.**