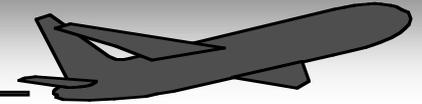


*Impact of FFP1 on NAS
Performance*

Mark Hansen, Geoff Gosling,
Chee Chou Ong, Tatjana Bolic,
Wenbin Wei

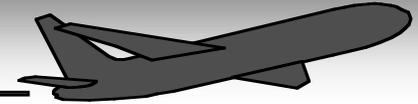
November, 2000



NEXTOR FFP1 Evaluation

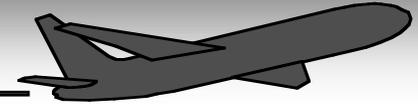
Work Overview

- q Part of much broader effort
- q Database Development (TASC)
- q Simulation (Seagull)
- q Normalization (UCB)
- q Safety Impacts (UCB)
- q Valuation (UCB)



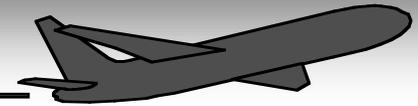
Normalization

- q Translate before/after performance comparisons to with/without comparisons
- q Focus on FFP1 terminal sites where CTAS and/or SMA will be (has been) deployed
- q NEXTOR focus to date on ATL, LAX, and DFW

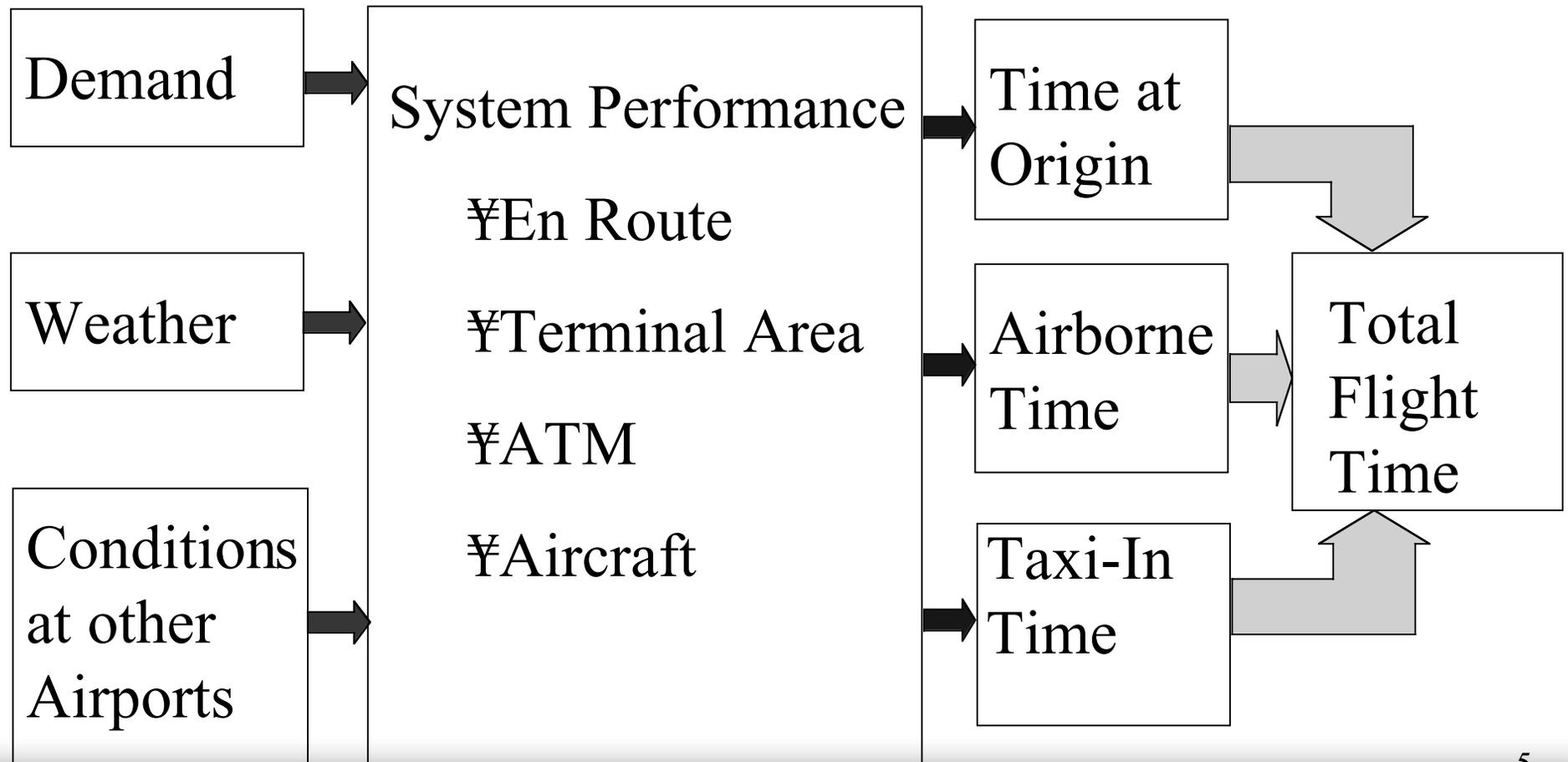


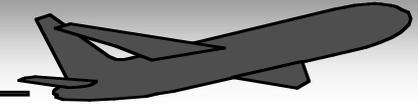
Normalization Approach

- q Macroscopic
 - q Analysis at daily level
 - q Incorporate all flight phases
- q Exploratory
- q Statistical
- q Transferable
 - q Use widely available data sources
 - q Applicable to any terminal area



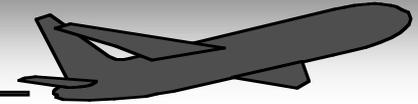
Conceptual Framework



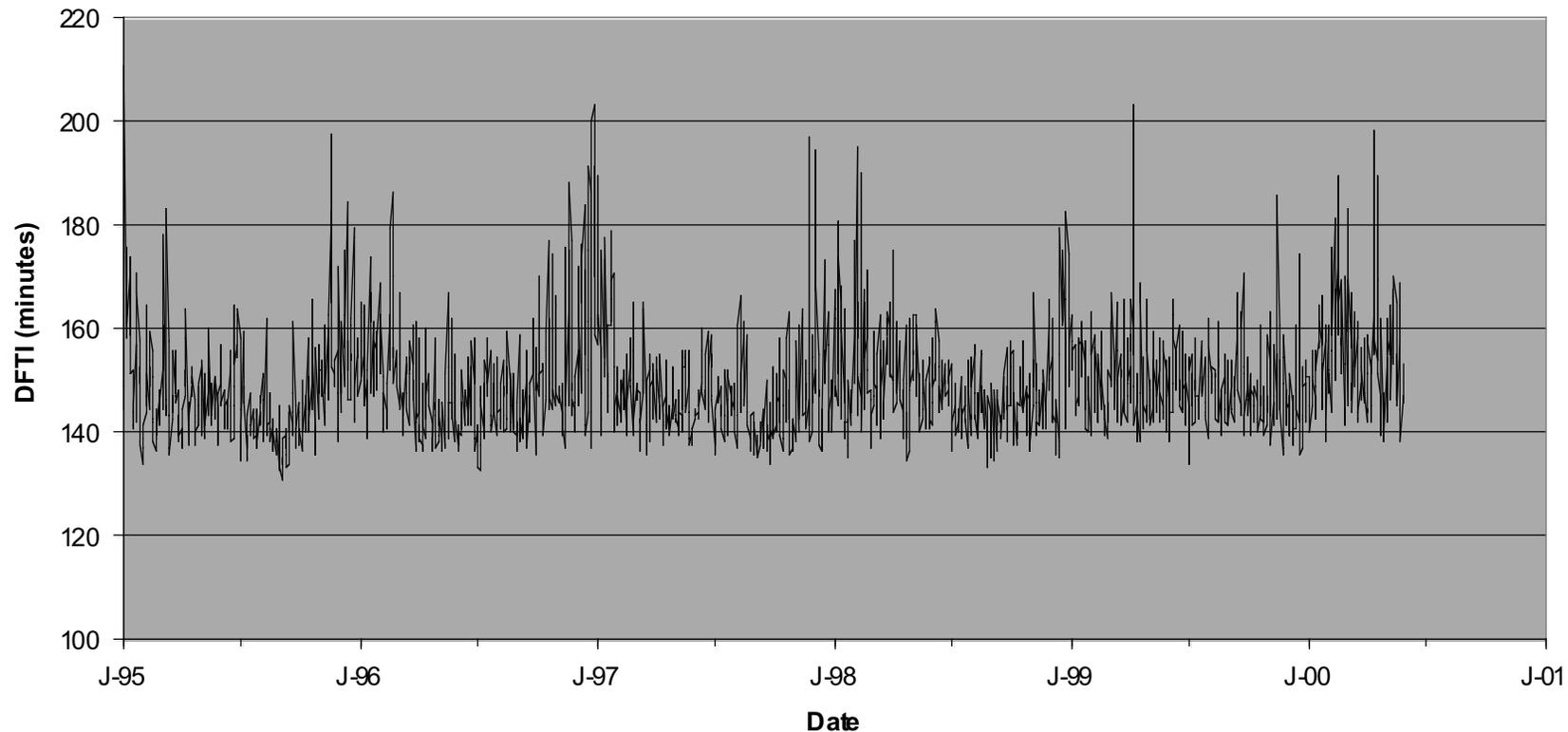


Daily Flight Time Index (DFTI)

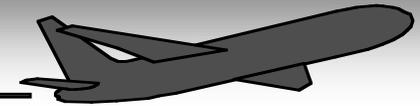
- q Daily weighted average of flight times to a given airport from a set of origins
- q Flight time=
 - q Actual Arrival Time - Scheduled Departure Time
 - q Scheduled Flight Time+Departure Delay+Flight Time Delay
 - q Time-at-Origin+Airborne Time+Taxi-In Time
- q Origins have at least one completed flight in each day of sample
- q Weights reflect origin share of flights to study airport over study period



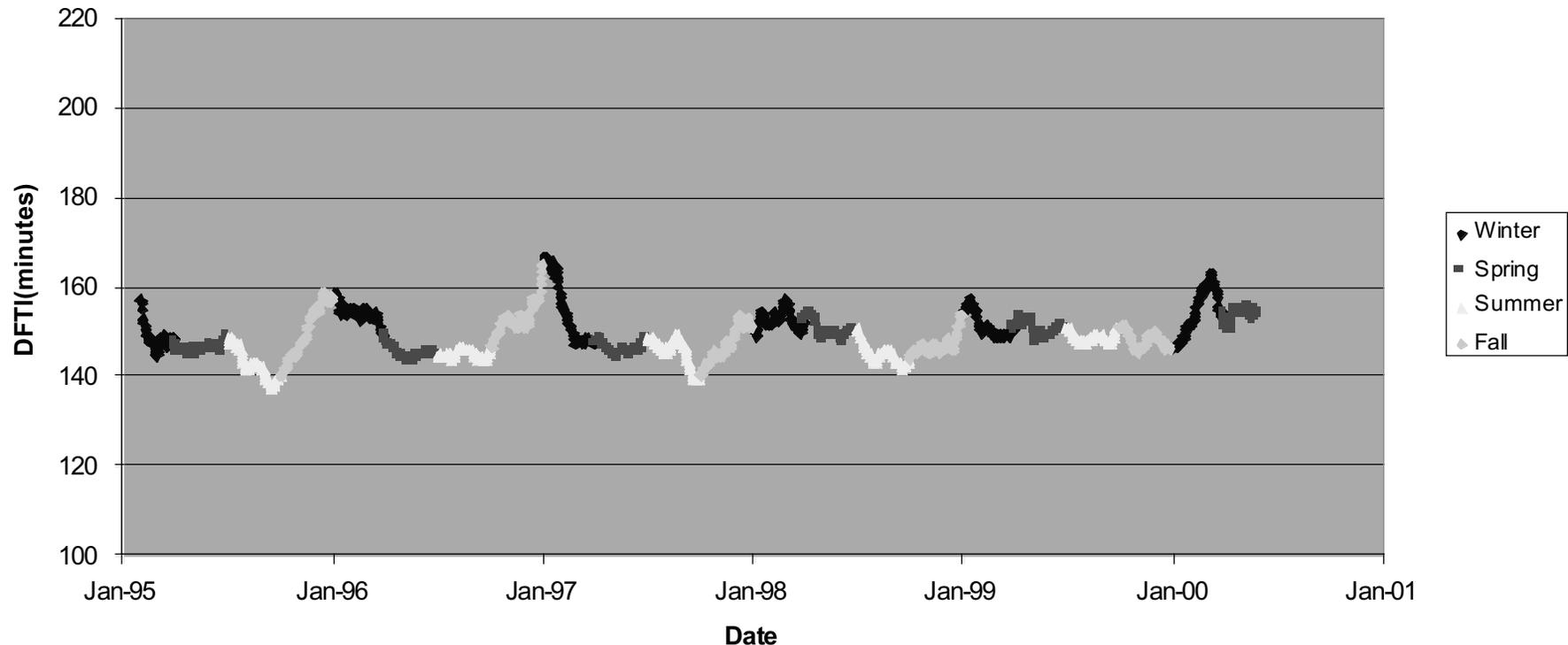
DFTI Time Series for LAX



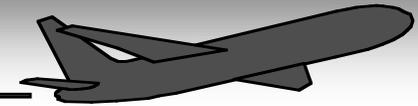
- q Generally 140-160 minutes
- q Spikes to over 180 minutes
- q Seasonal Pattern



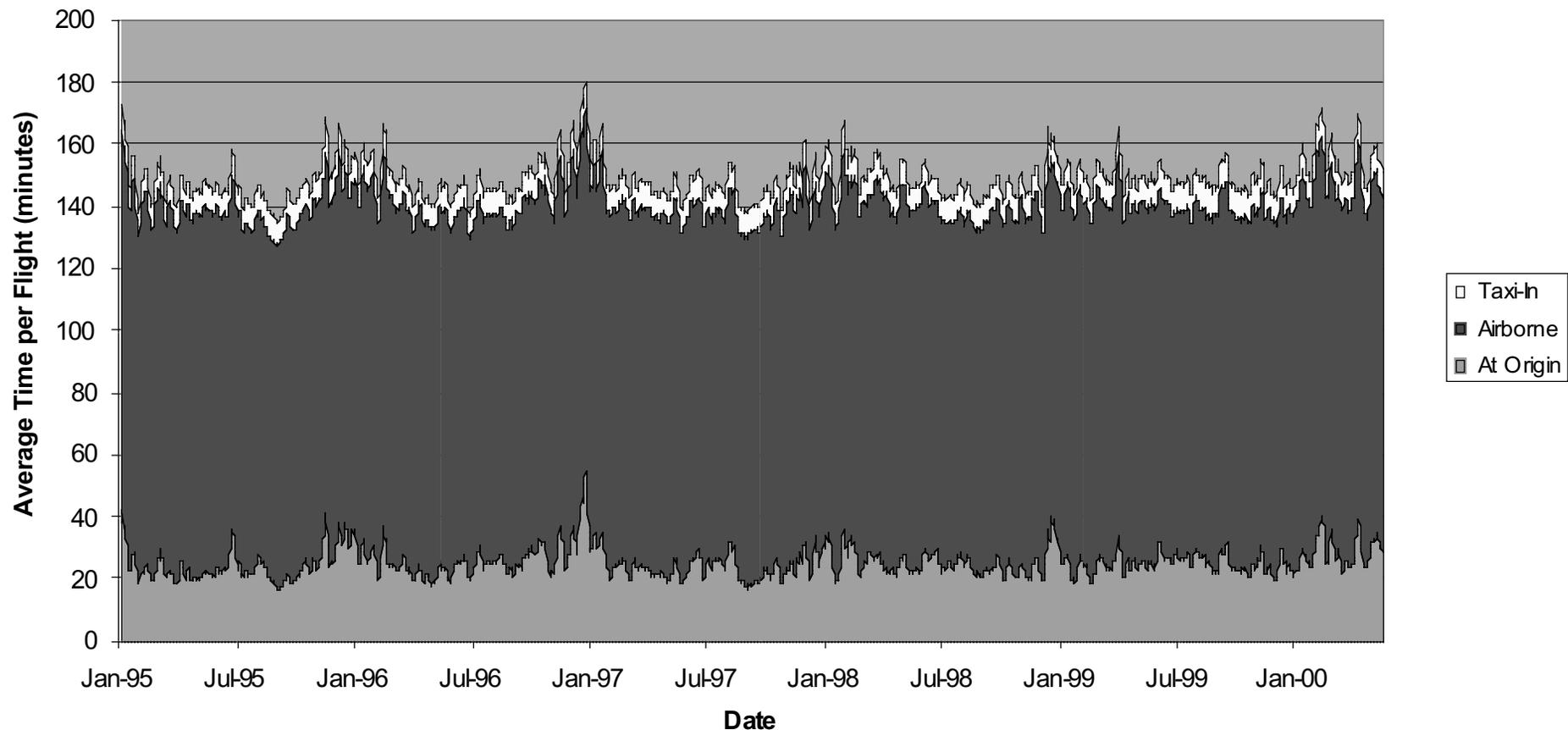
30-Day Moving Average



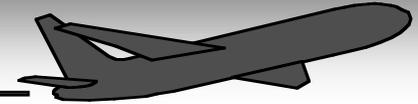
- q Later fall and winter generally worst
- q Summer 1999 worse than previous ones
- q Delayed onset of typical winter pattern in 2000



7-Day Moving Average with Components

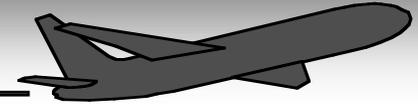


- Time-at-origin is major source of variation
- Correlation between time-at-origin and airborne time

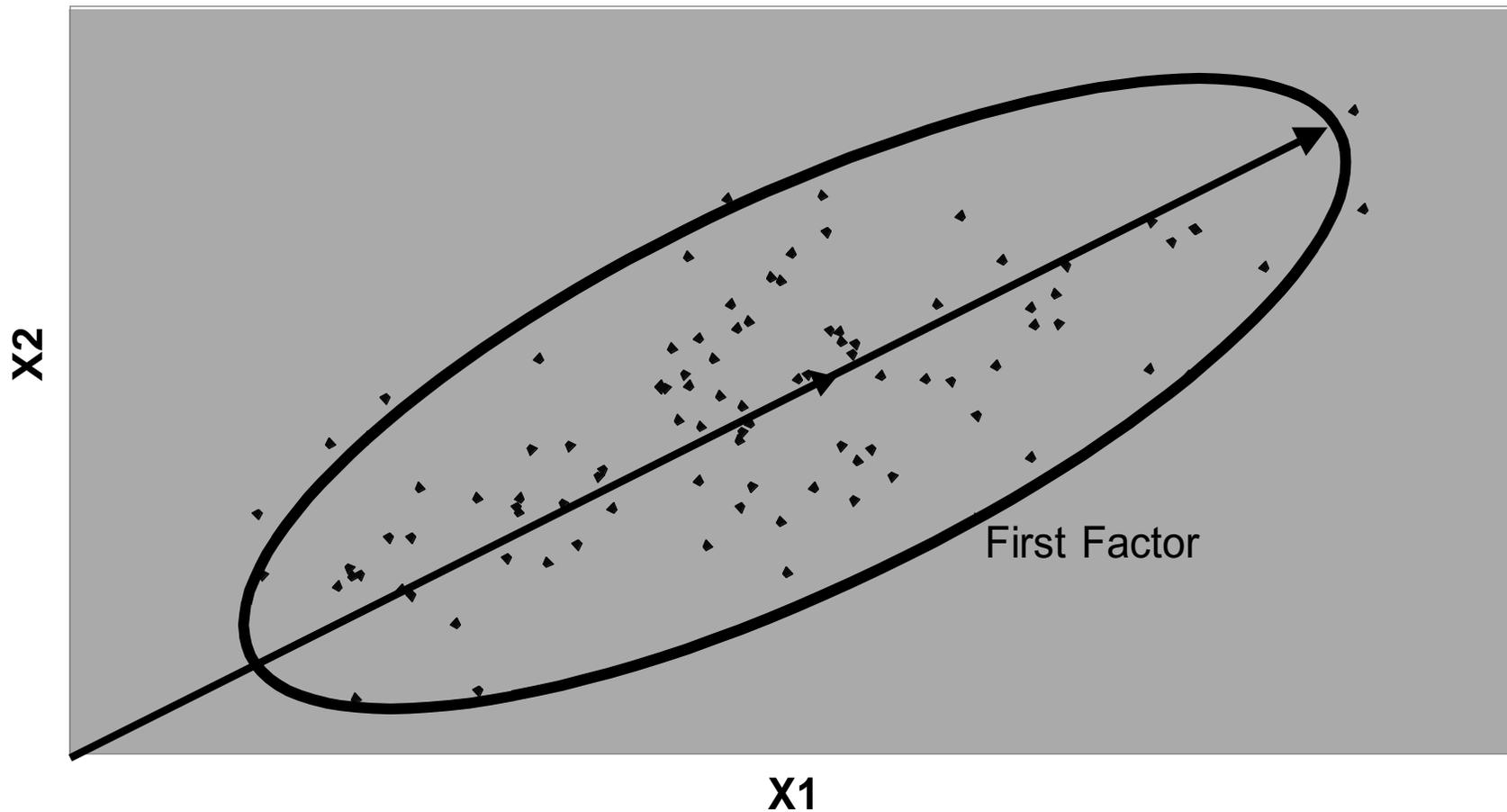


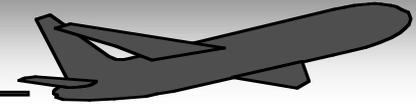
Weather Normalization

- q Based on CODAS hourly weather observations for LAX
- q Factor analysis of weather data
 - q Create small number of factors that capture variation in large number of variables
 - q Factors are linear combinations of original variables
 - q Factors correspond to principal axes of N-dimensional data ellipse



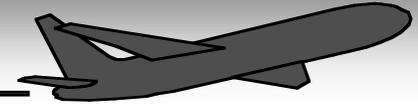
Factor Analysis with Two Variables





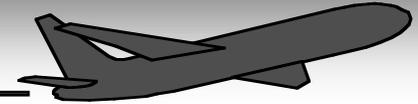
9-Factor Representation of LAX Daily Weather

Factor	Interpretation
1	Warm temperatures throughout day.
2	VFR operations and absence of low cloud ceiling in the morning.
3	VFR operations and absence of low cloud ceiling in the afternoon.
4	High visibility throughout day.
5	Medium cloud ceiling throughout day.
6	High winds throughout day.
7	High ceiling cloud ceiling throughout day; evening precipitation.
8	Precipitation in late morning and afternoon.
9	Precipitation in early morning.

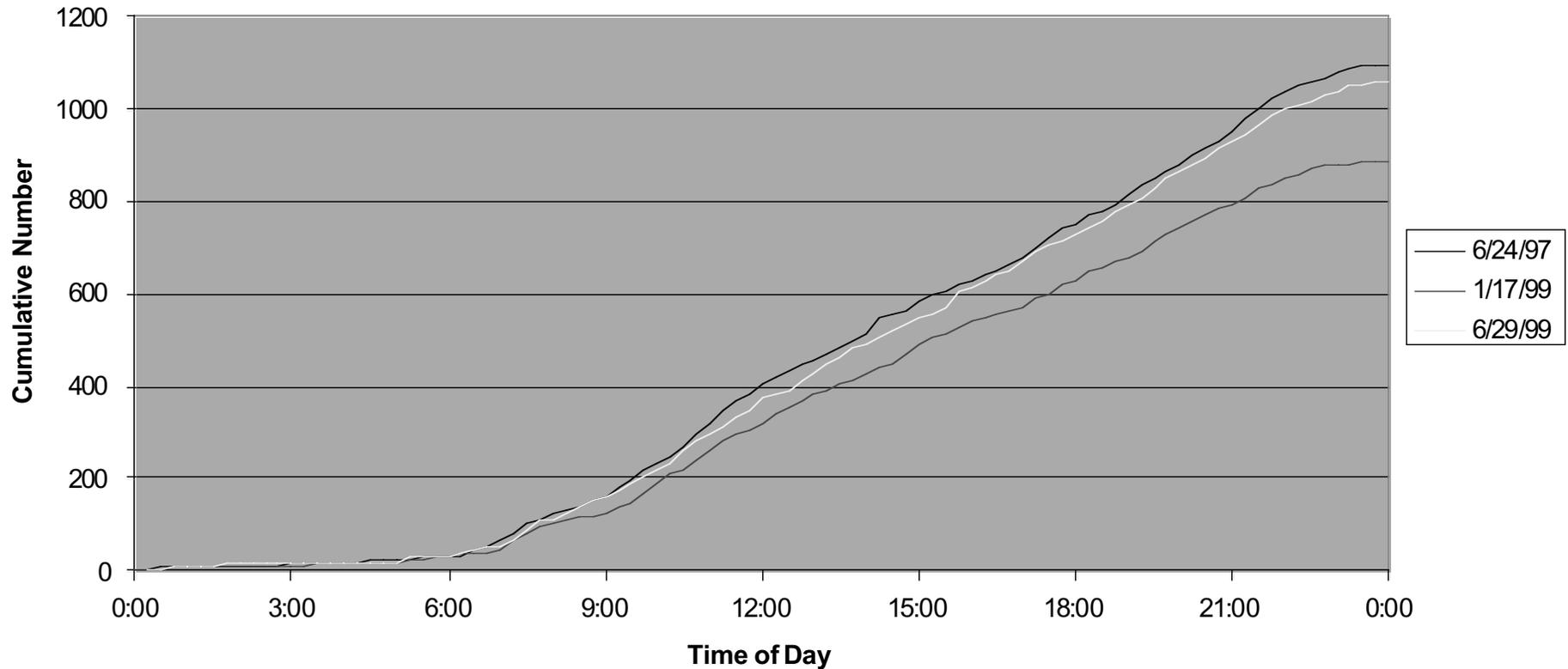


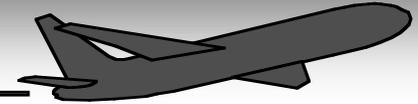
Demand Normalization

- q Based on CODAS OAG data
- q Capture number, strength, and duration of demand surges above a given baseline rate
- q Set of 12 metrics using baseline rates from 10 to 120 arrivals per hour
- q Summarized by two demand factors: one for higher baseline rates and one for higher rates



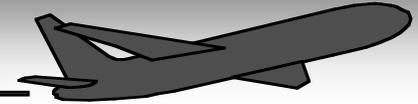
Flight Schedule Comparison



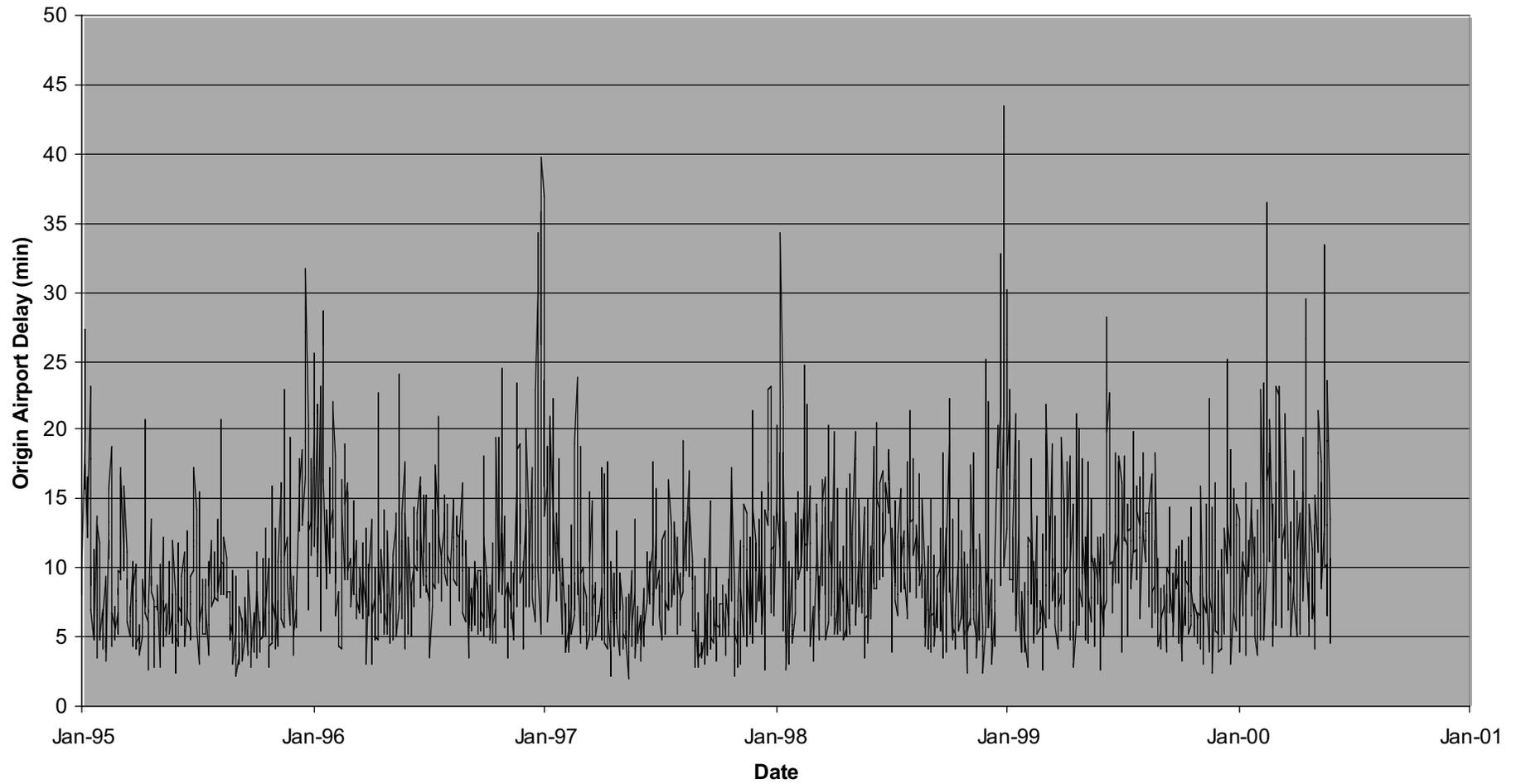


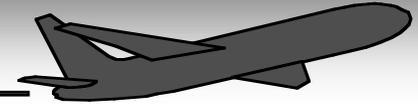
Normalization for Conditions at other Airports

- q Consider airports included in DFTI average
- q For each compute daily average departure delay for flights not bound to LAX region
- q Average airport departure delays using DFTI weights



Origin Airport Delay Time Series





Performance Models

$$Y_t = f(WX_t, DMD_t, ODEL_t) + \varepsilon_t$$

Where:

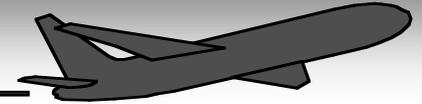
Y_t is DFTI or DFTI component for day t;

WX_t is vector of weather factors for day t;

DMD_t is vector of demand factors for day t;

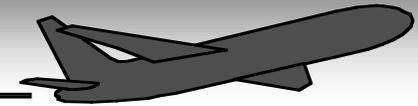
$ODEL_t$ is average origin departure delay for day t;

ε_t is stochastic error term.



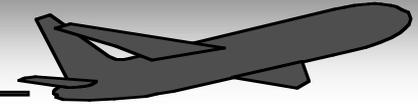
Functional Forms Considered

- q Parametric
 - q Linear (with 3, 6, 9, and 12 weather factors)
 - q Quadratic response surface
 - q Non-linear
- q Non-parametric
 - q 9 clusters based on 3 weather factors
 - q 12 clusters based on 9 weather factors

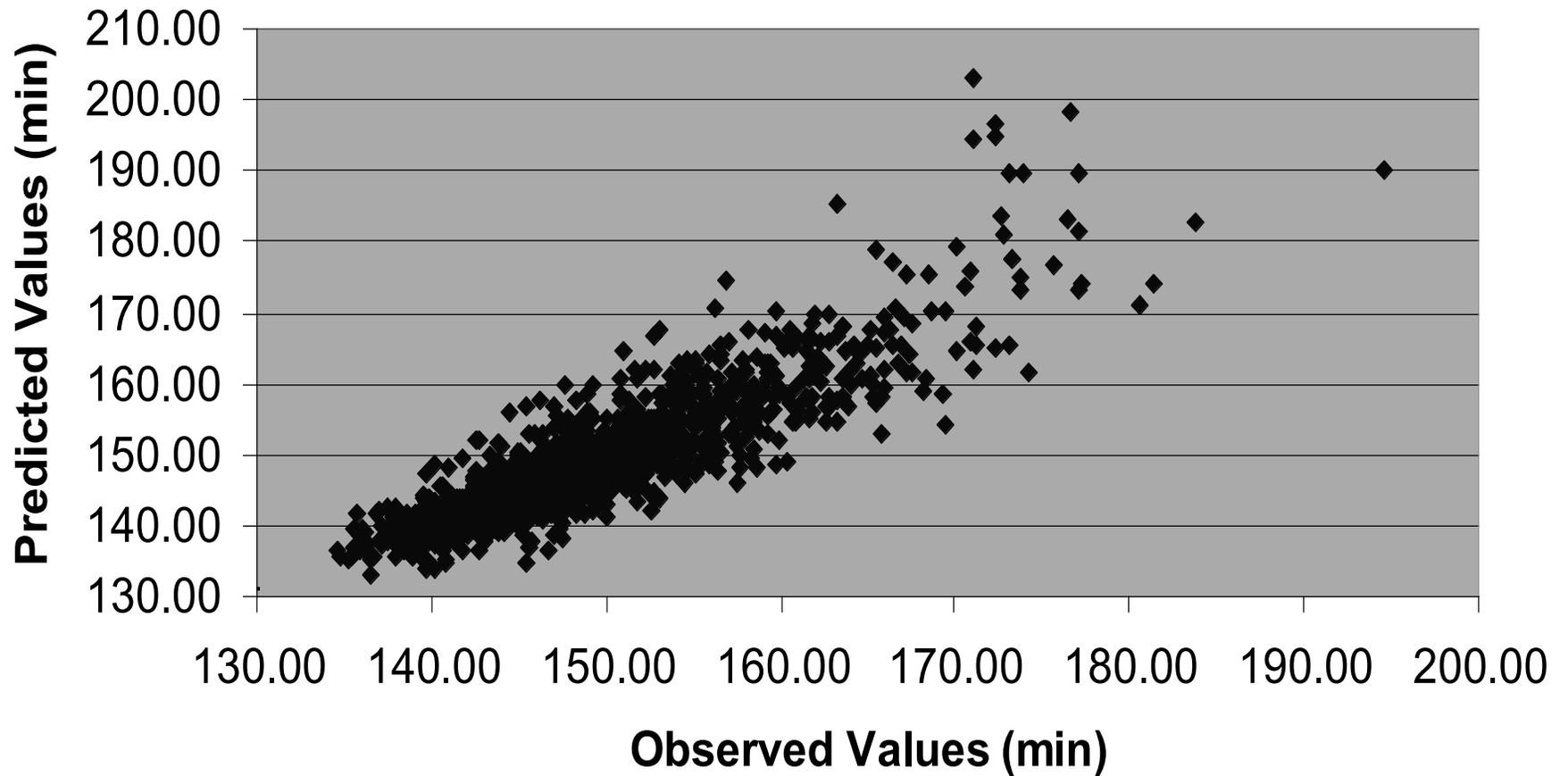


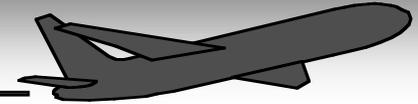
Linear Model Estimation Results

Variable	Description	Estimate	T - statistic	P - value
INTERCEPT	Intercept	138.055	567.065	0.0001
ODEL	Origin airport departure delay	1.128	44.351	0.0001
WX ₁	Warm daily temperatures	-1.357	-12.101	0.0001
WX ₂	VFR ops, no low cloud ceiling in the morning	-0.988	-7.116	0.0001
WX ₃	VFR ops, no low cloud ceiling in the afternoon	-1.123	-7.583	0.0001
WX ₄	High visibility throughout day	-0.449	-3.575	0.0004
WX ₅	Medium cloud ceiling throughout day	1.440	10.555	0.0001
WX ₆	High winds throughout the day	0.512	4.531	0.0001
WX ₇	High cloud ceiling throughout day	0.911	4.172	0.0001
WX ₈	Precipitation in late morning and afternoon	1.871	8.324	0.0001
WX ₉	Precipitation in early morning	-0.379	-2.614	0.0091
DMD ₁	Peak demand	0.075	0.725	0.4685
DMD ₂	Base demand	0.440	4.574	0.0001
ADJUSTED R ²			0.743	



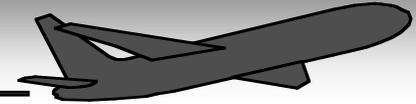
Predicted vs Actual Values





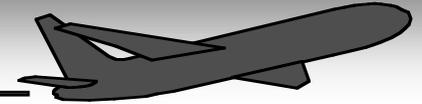
Outliers

- q Used TMU logs to investigate days for which predictions have large errors
- q Reasons for higher than predicted DFTI
 - q East flow
 - q Radar outages
 - q Air Force One
 - q Over-stringent ground delay program
- q No clear explanations for lower-than-average DFTI: No news is good news



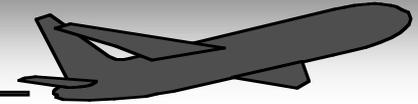
FFP1 Safety Impact

- q Need to Address Safety Impact of FFP1 Tools
- q Operational Error Rate Selected as Safety Metric
- q Significant Variation in Operational Error Rate
 - q Over time at a given facility
 - q Across facilities
- q Need to Better Understand Causes of Variation
 - q Account for factors other than FFP1 tools
 - q Measure contribution of FFP1 tools



NEXTOR Research on Safety Impact

- q Identify Potential Safety-Related Effects of FFP1 Tools
 - q Better information for controllers
 - q Changes in controller activities
 - q Changes in traffic patterns
 - q Increase in traffic handled
- q Review Previous Research on Factors Associated with High Rates of Operational Errors
- q Statistical Analysis of Operational Error Data



Valuation Research

- q Translate operational impact to economic value
- q Avoid traditional delay-centric approach
- q NEXTOR work on two areas
 - q Buffered vs non-buffered delay
 - q Inferring value from increases in observed throughput rates