



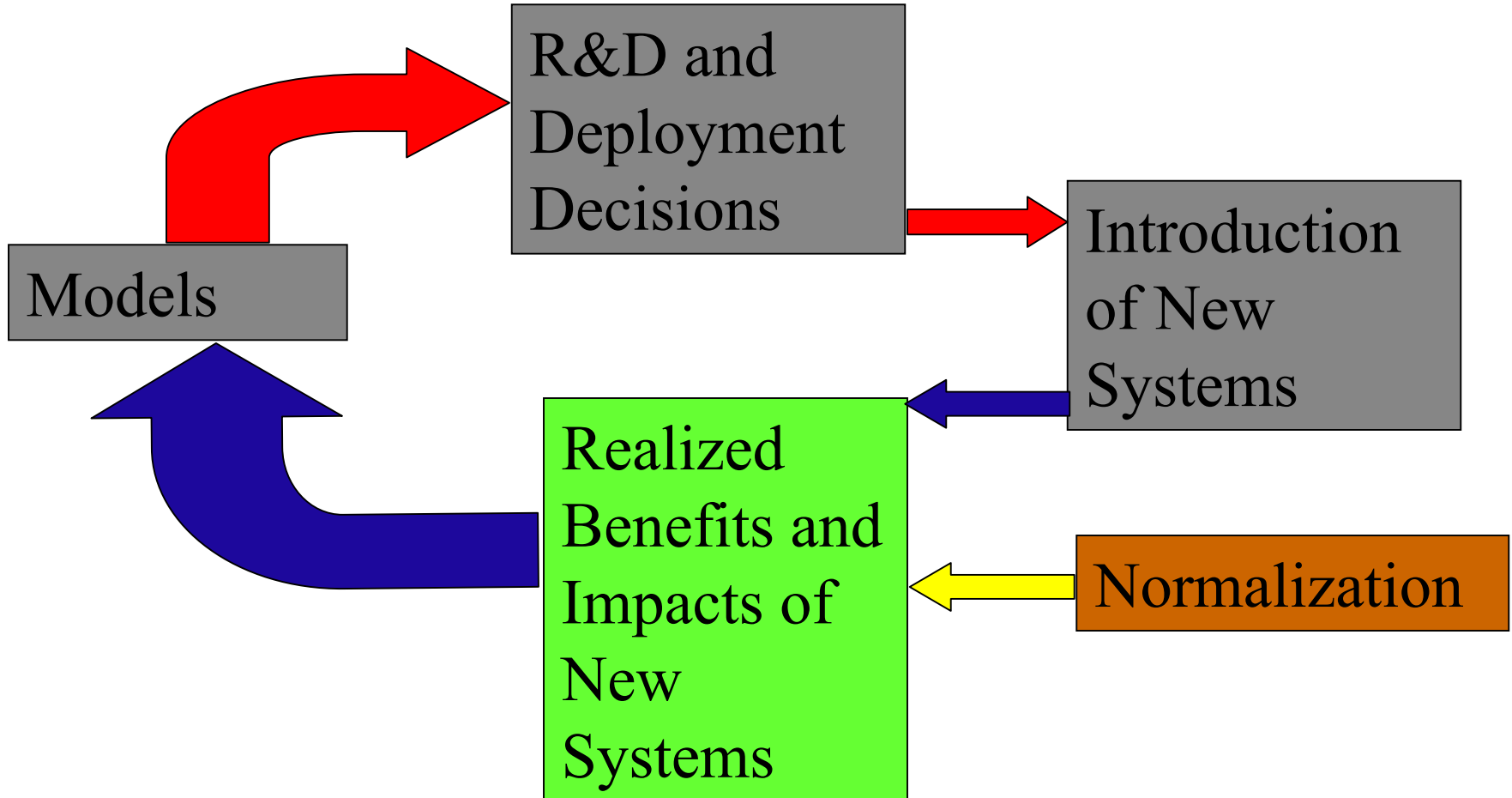
Estimating Delay and Capacity Impacts of Airport Infrastructure Investments

Mark Hansen

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R&D Modeling Cycle





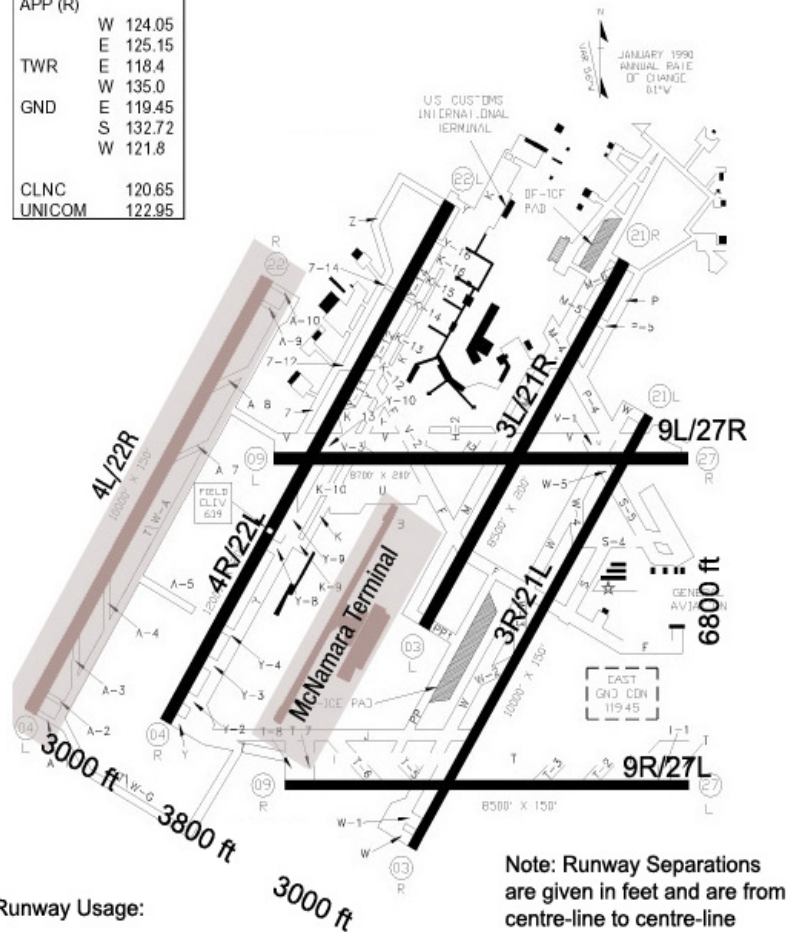
NEXTOR Metrics Research

- ❑ Effects of Investments and Technological Deployments on Terminal Area and En Route Performance
- ❑ Use Statistical Inference to Capture Impacts that may not be Directly Observable
- ❑ Consider both Throughput and Time-in-System Metrics



Fig.1: Airfield Layout Plan of DTW showing the New Runway 4L/22R and McNamara Terminal for NWA

FREQ	
ATIS*	133.675
APP (R)	
W	124.05
E	125.15
TWR	
E	118.4
W	135.0
GND	
E	119.45
S	132.72
W	121.8
CLNC	120.65
UNICOM	122.95



Runway Usage:

4L/22R & 3R/21L are normally used for arrivals
 4R/22L & 3L/21R are normally used for departures

Runways 9L/27R & 9R/27L are used only during light cross-winds

Background

- ❑ Runway 4L/22R Came On-line 12/11/01
- ❑ Simultaneous Arrival and Departure Streams Under IFR and VFR
- ❑ 4R/22L Dedicated to Departures Instead of Mixed Ops



Expected Impacts

- ❑ Benchmark Study: VFR and IFR capacity increases of 25% and 17% respectively (assuming “full use of runway”)
- ❑ Press Release
 - ❑ Overall capacity increase of 25%
 - ❑ 50% capacity increase during peak times
 - ❑ 3000 hrs of delay reduction



Motivation

- ❑ Initial Free Flight Office analysis found little impact
- ❑ Implications for ability to measure impact of more incremental changes
- ❑ Confounding effects of 9/11

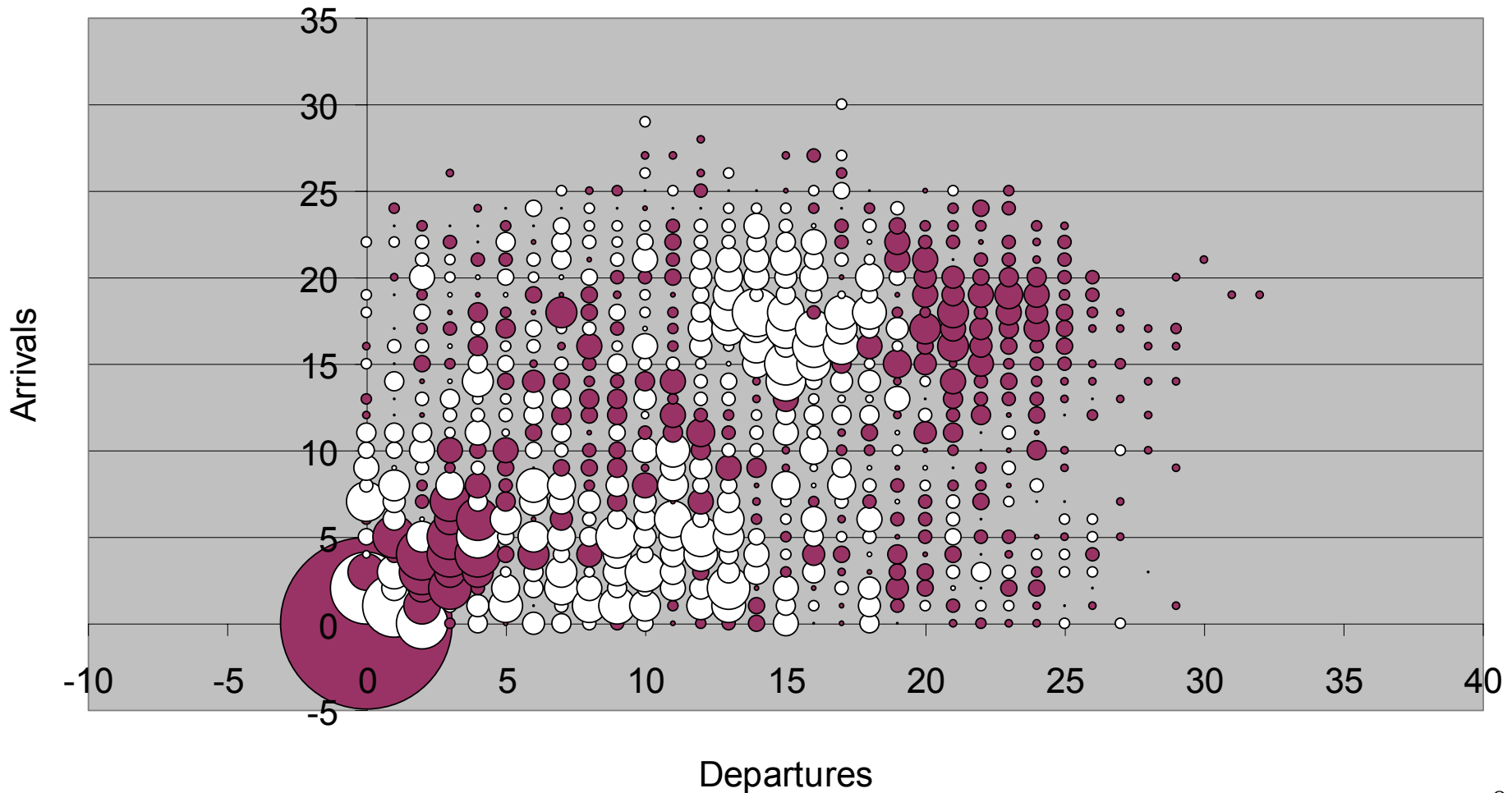


Data

- ❑ ASPM quarter-hour data for first six months of 2001 (before) and 2002 (after)
- ❑ Four metrics
 - ❑ Arrival counts and departure counts
 - ❑ Arrival demand and departure demand
 - ❑ Flight counted toward demand beginning in the quarter hour when it is expected to arrive/depart based on last filed flight plan before departure
 - ❑ If arrival/departure occurs earlier than planned then flight counted toward demand in the earlier period
 - ❑ Demand never exceeds count
 - ❑ Different between count and demand is queue length at end of period



Change in VMC Distribution of Arrival and Departure Counts, Jan-June 2001-2002
(purple is increase; light is decrease)





Change in IMC Distribution of Arrival and Departure Counts, Jan-June 2001-2002

(purple is increase; light is decrease)

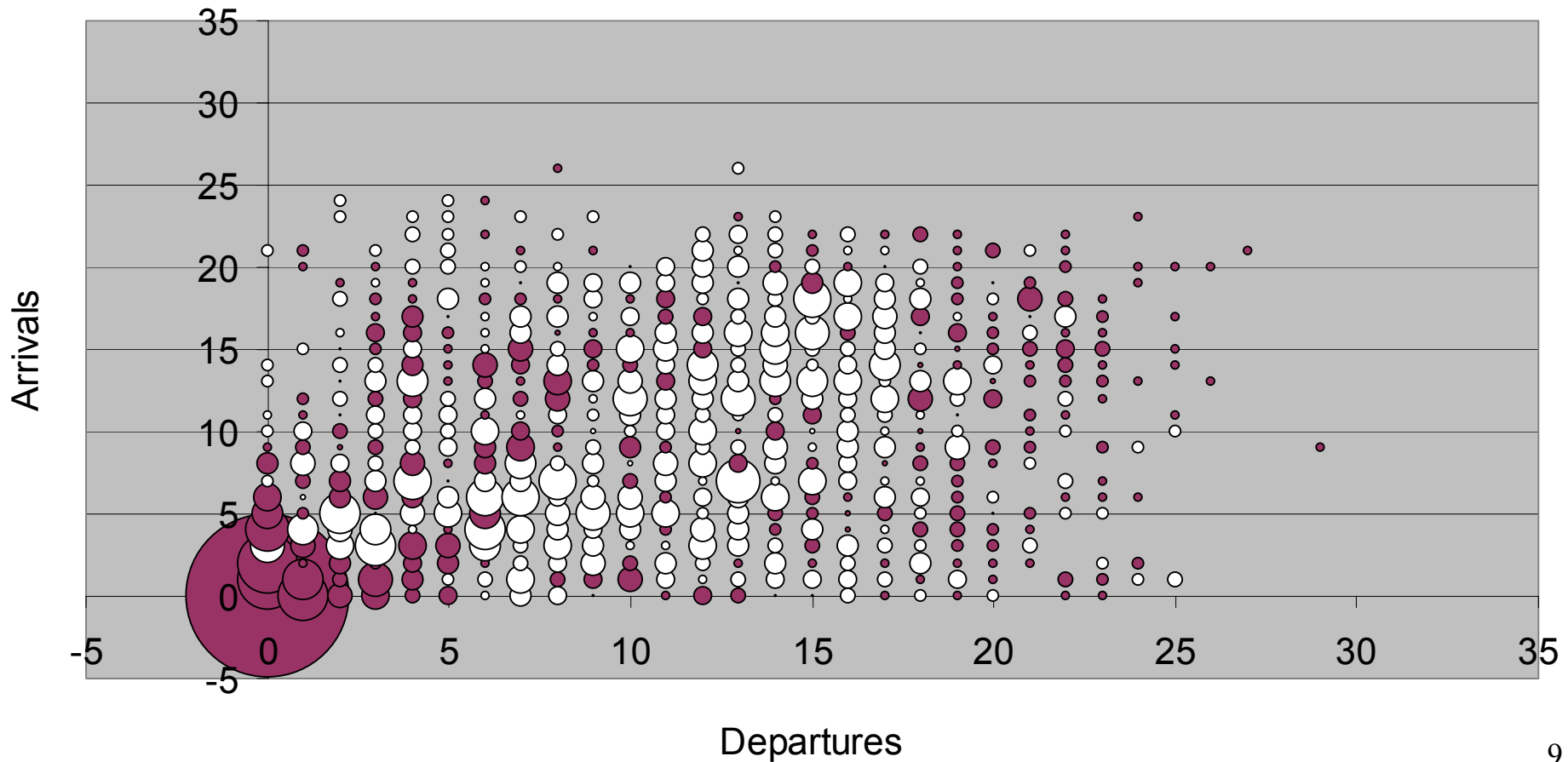




FIGURE 5
Departure Count Distribution for Jan-Jun 2001 & 2002 VFR Conditions.

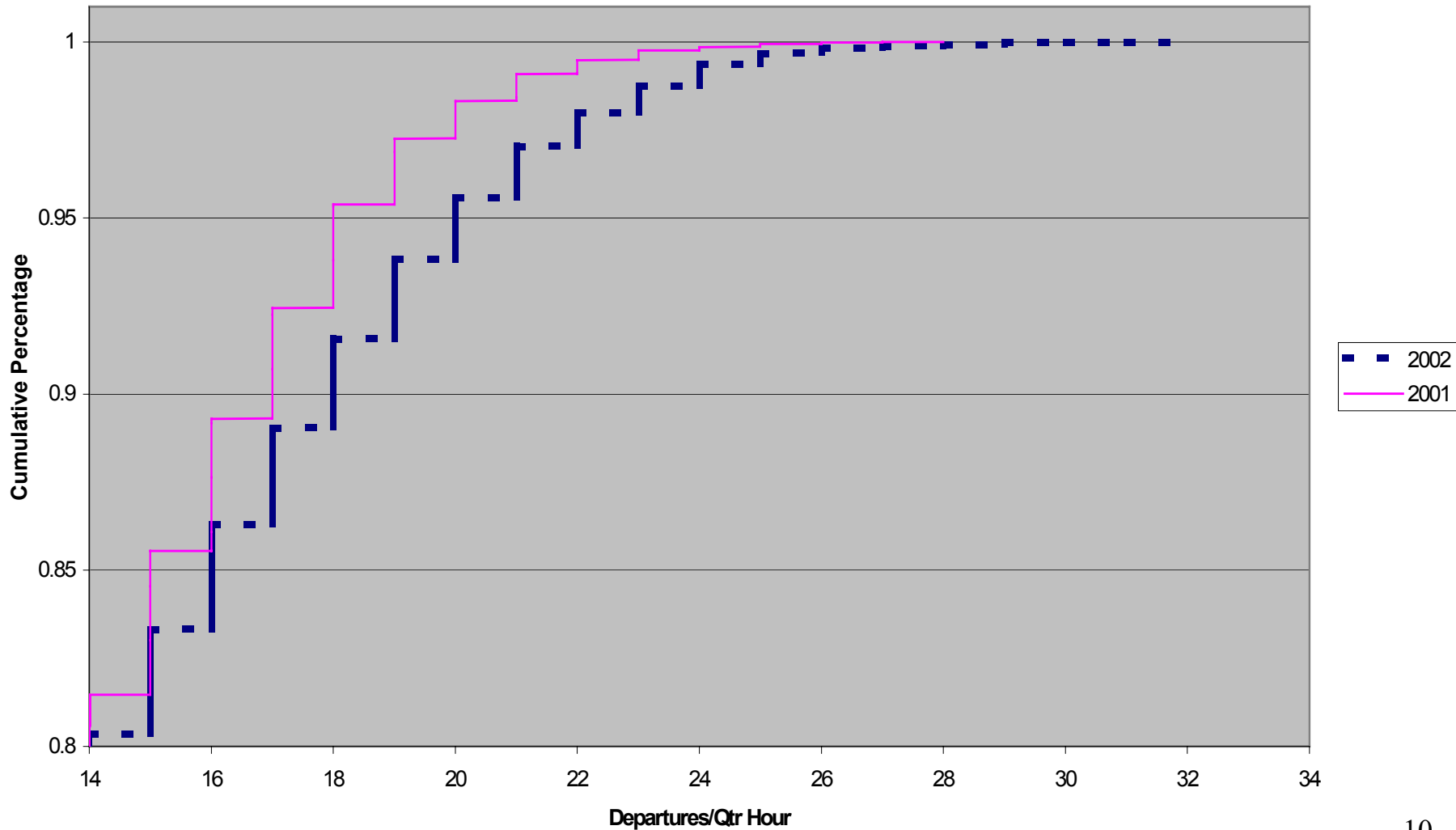




FIGURE 6
Departure Count Distribution for Jan - Jun 2001 & 2002 IFR Conditions.

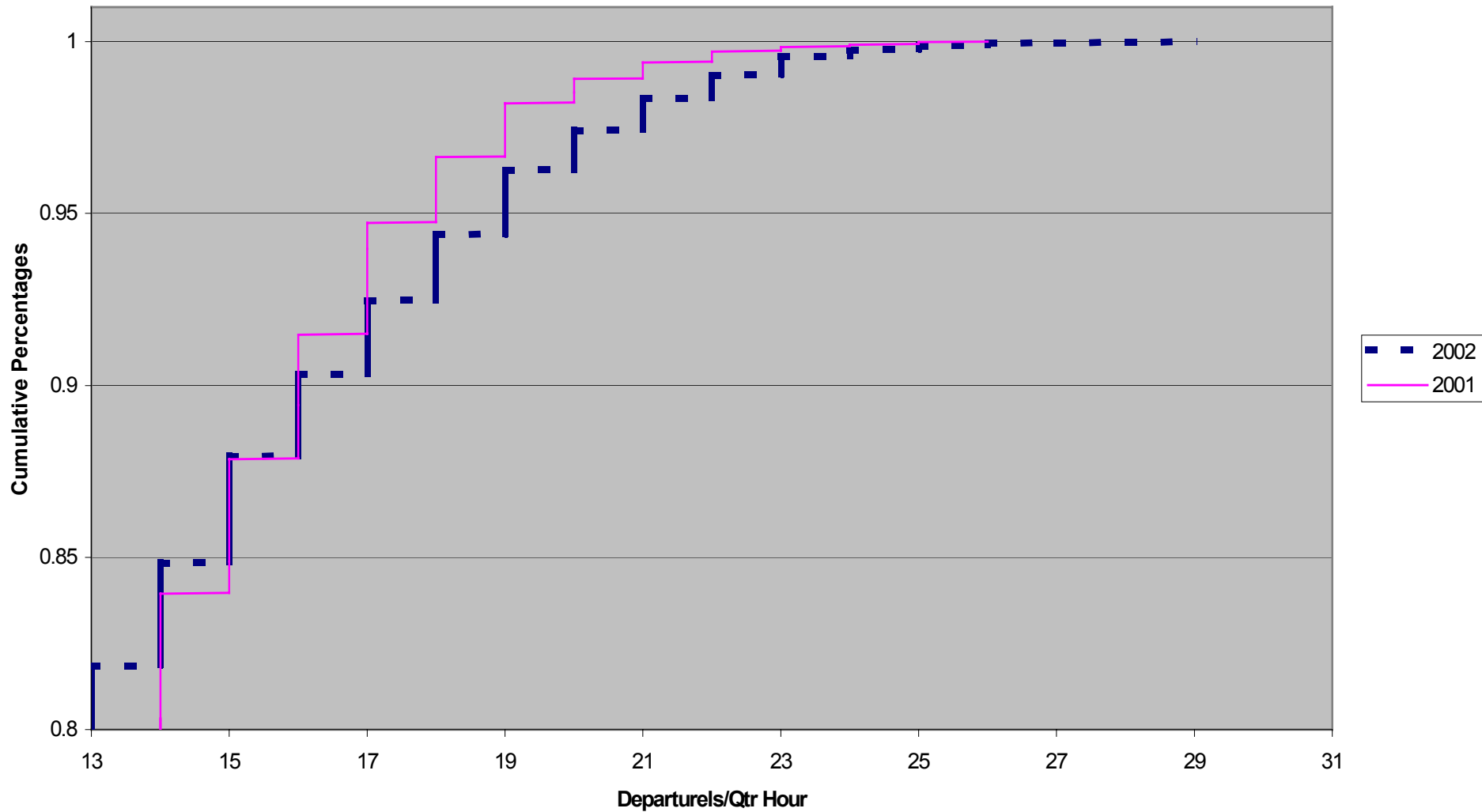




FIGURE 7
Arrival Count Distributions for Jan - Jun 2001 & 2002 VFR Conditions.

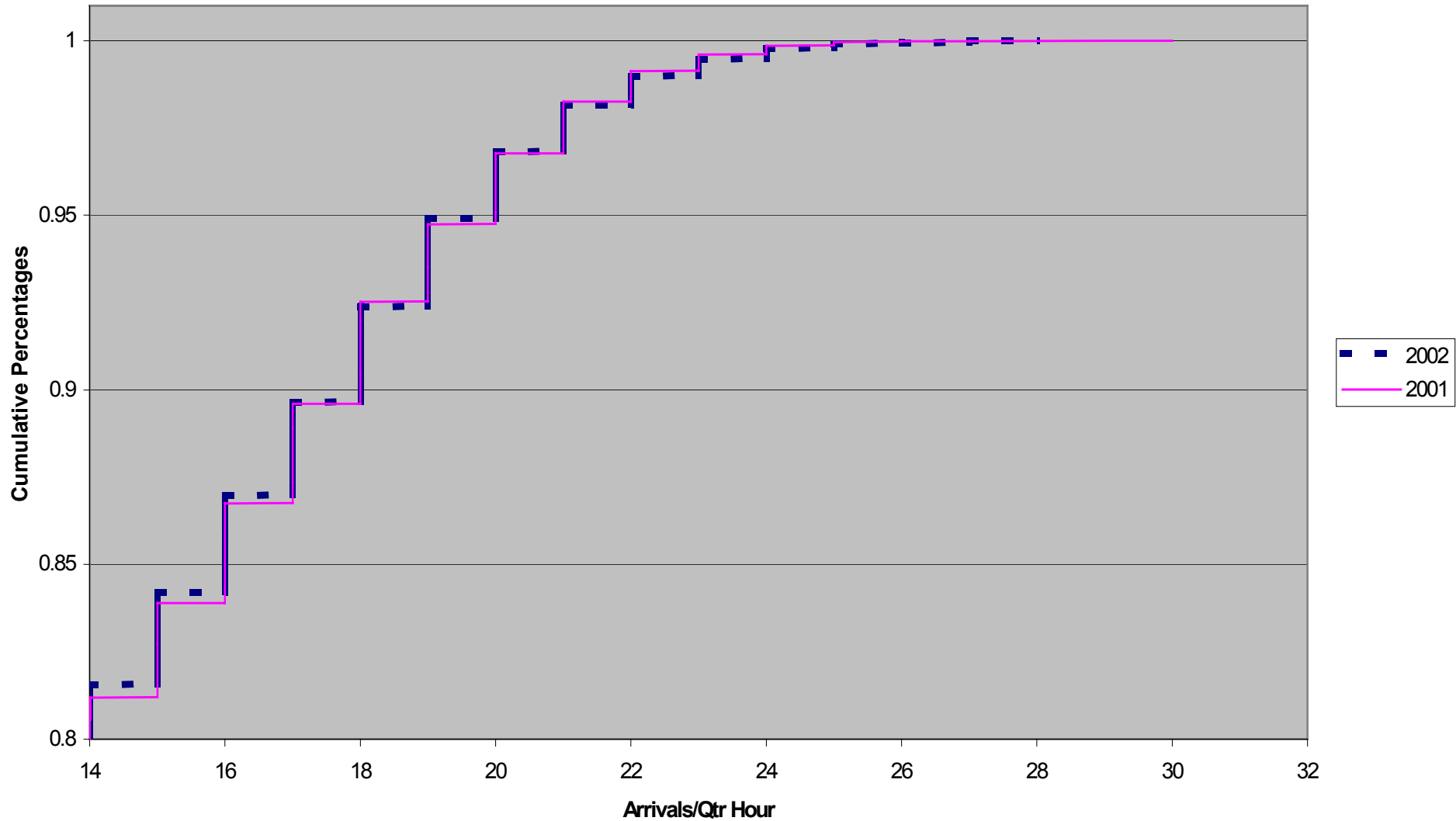




FIGURE 8
Arrival Count Distributions for Jan - Jun 2001 & 2002 IFR Conditions.

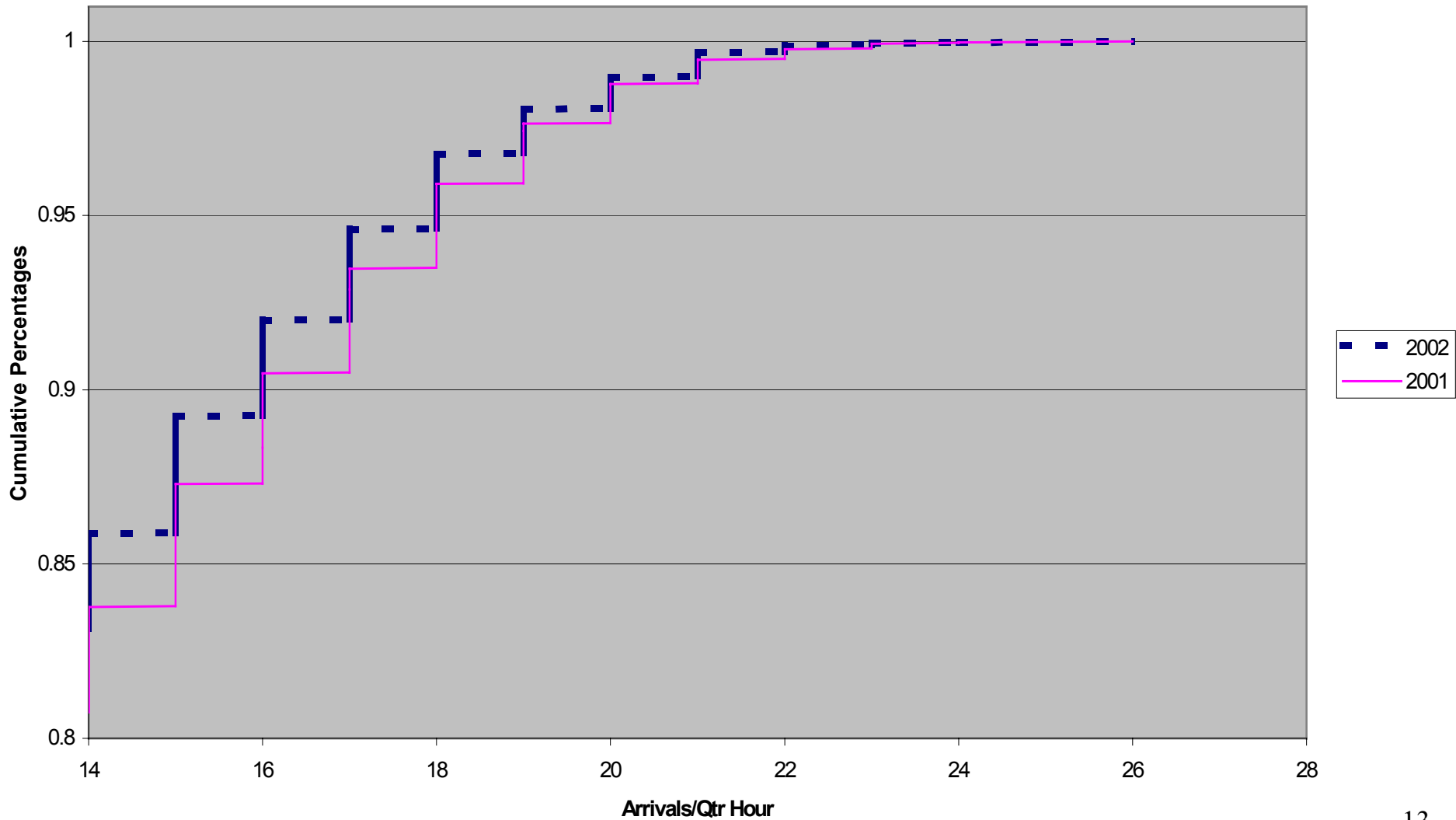




FIGURE 9

Mean Departure Count vs Departure Demand Jan-Jun 2001 & 2002 VFR Conditions.

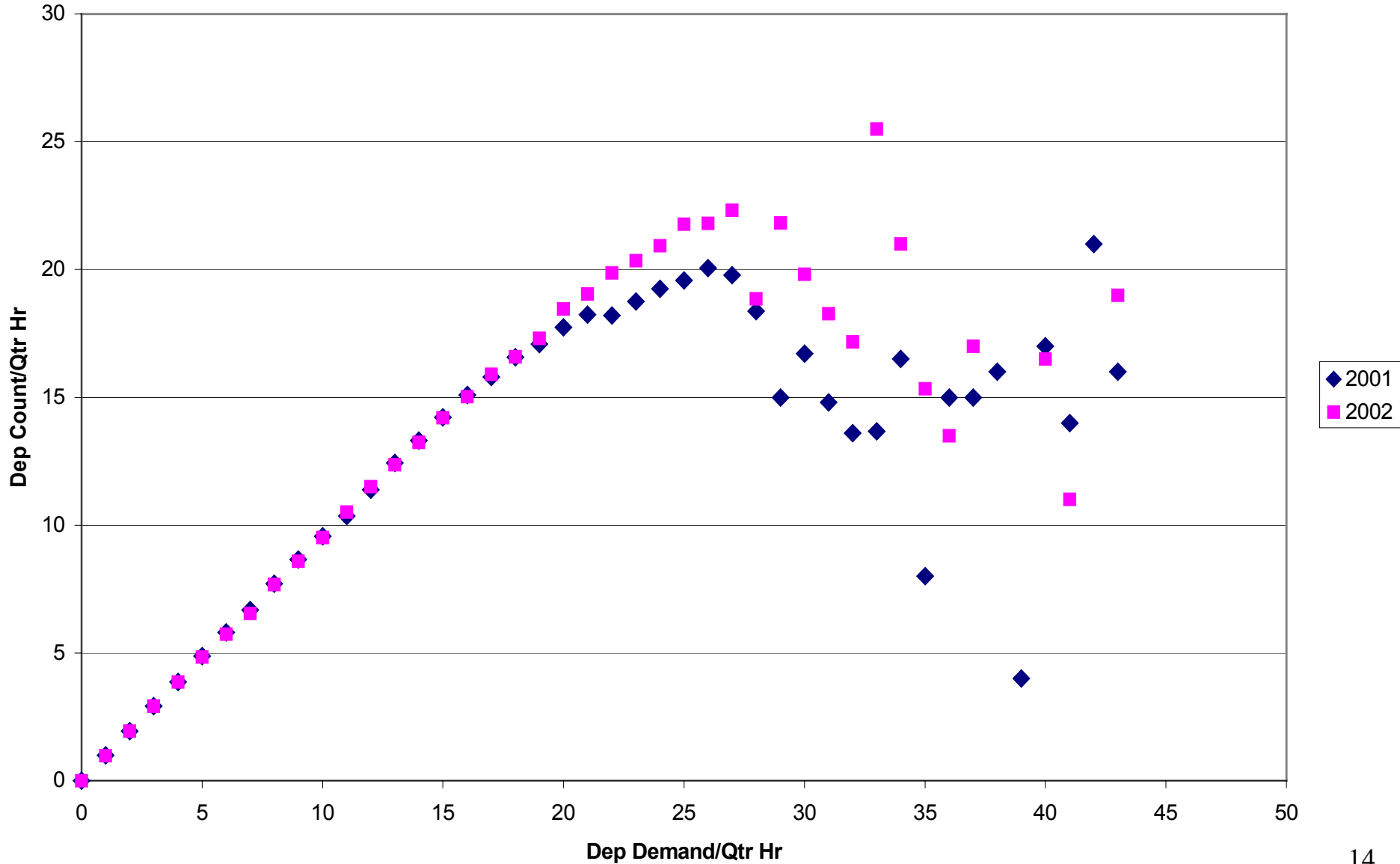




FIGURE 10

Mean Departure Count vs Departure Demand Jan-Jun 2001 & 2002 IFR Conditions.

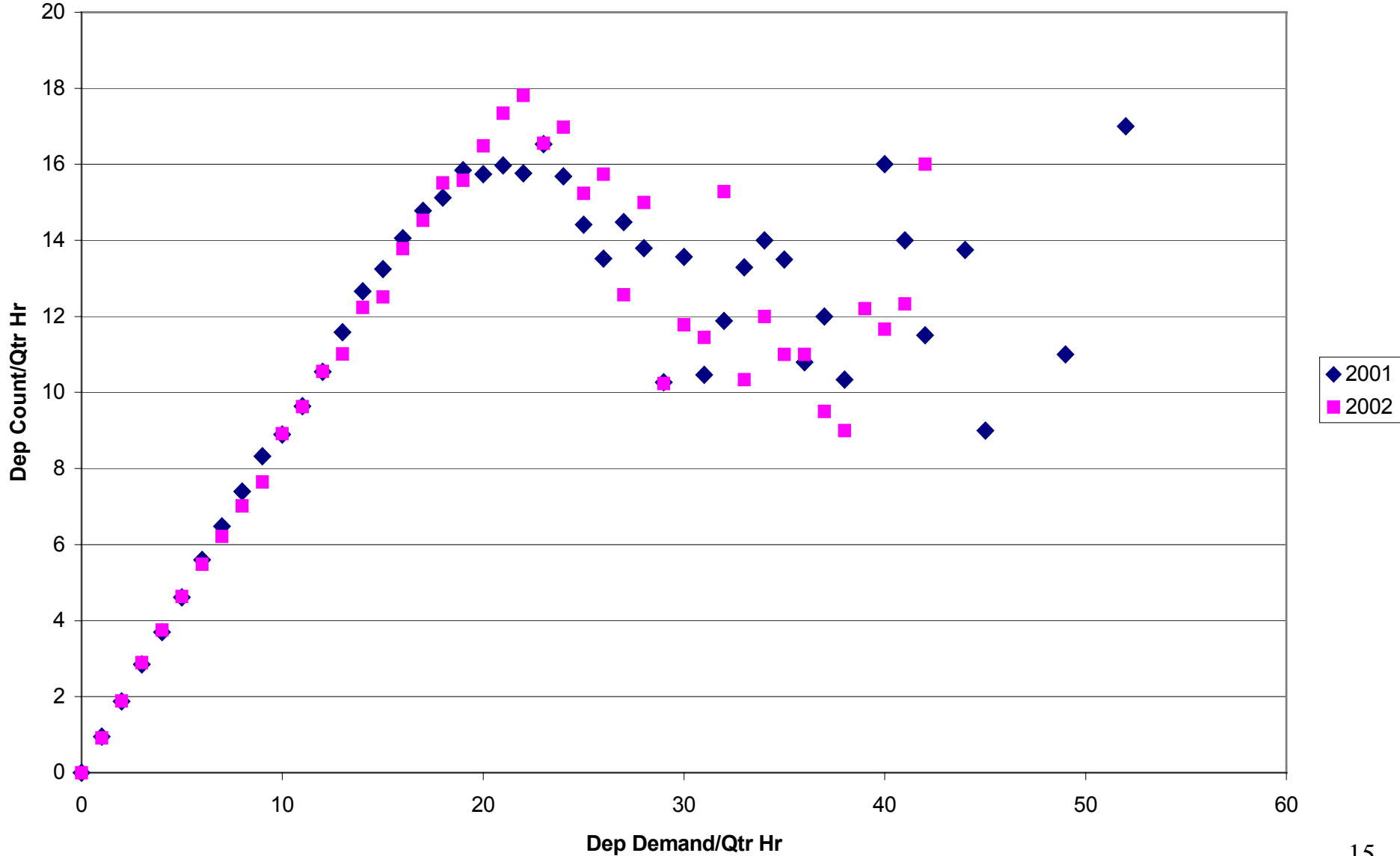




FIGURE 11
Mean Arrival Count vs Arrival Demand Jan-Jun 2001 & 2002 IFR Conditions.

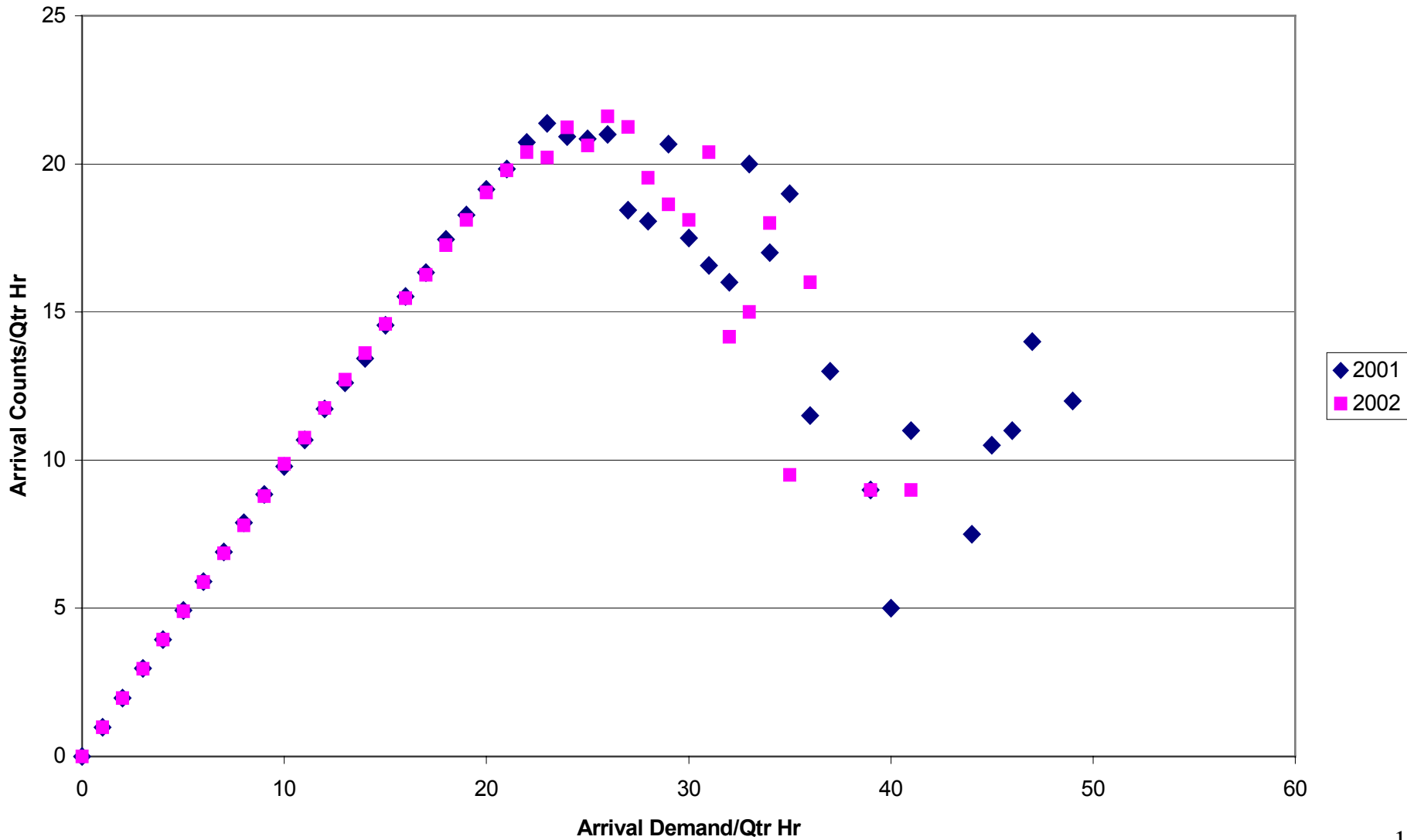
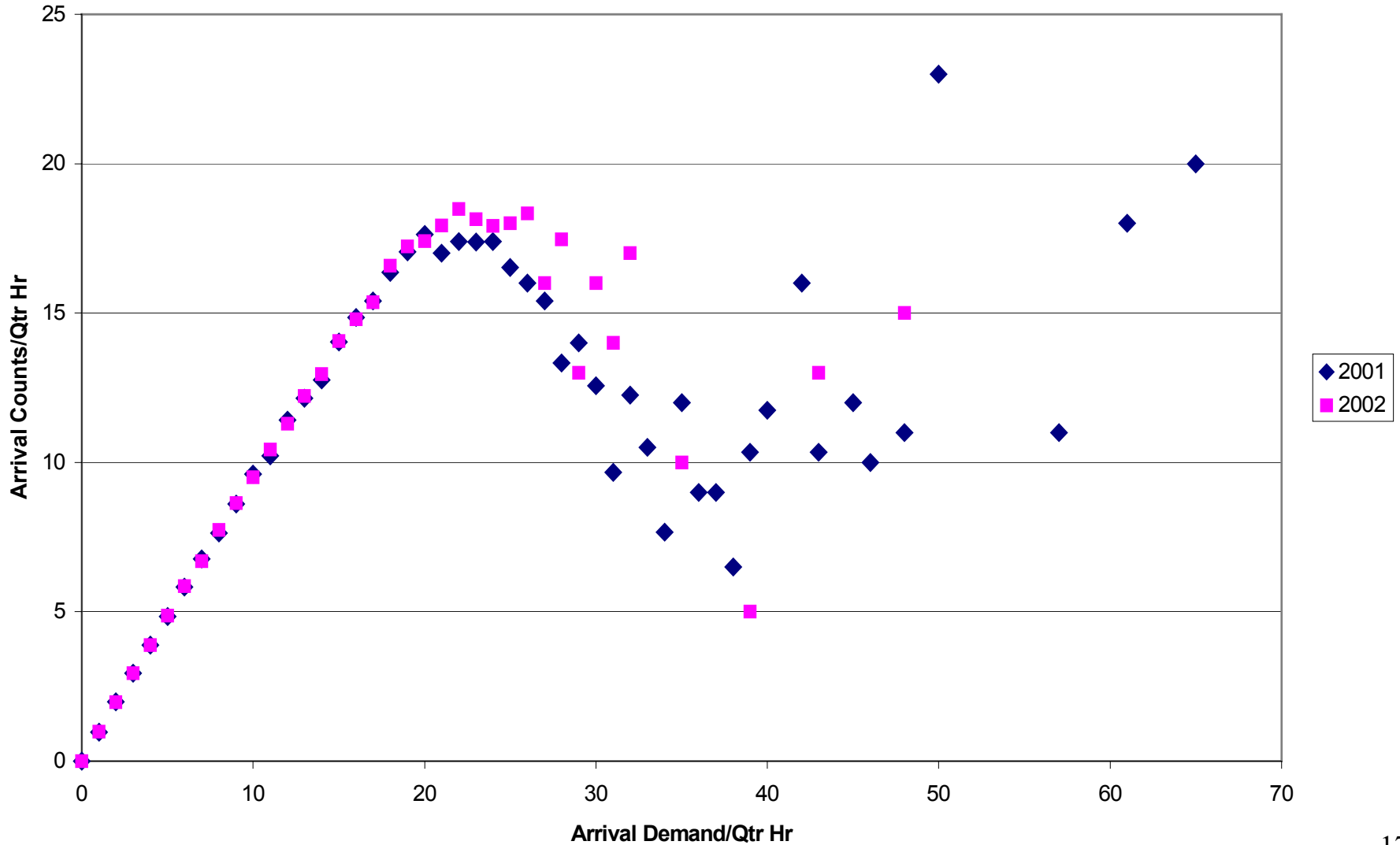




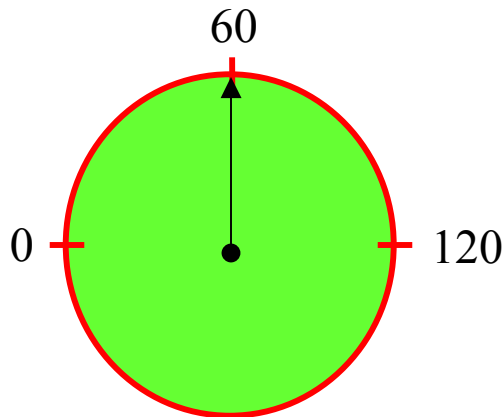
FIGURE 12
Mean Arrival Count vs Arrival Demand Jan-Jun 2001 & 2002 IFR Conditions.



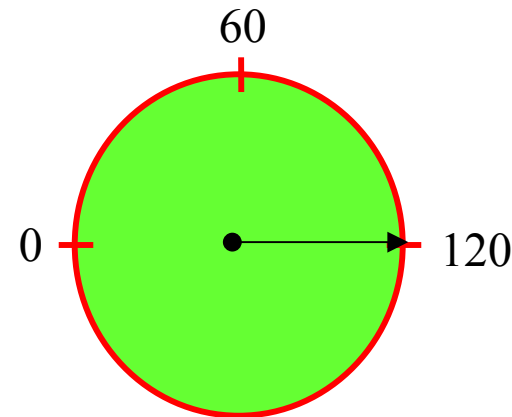


Censored Regression Analysis

- ❑ Data “saturates” measurement device
- ❑ Example: speedometer



Speed=60 mph

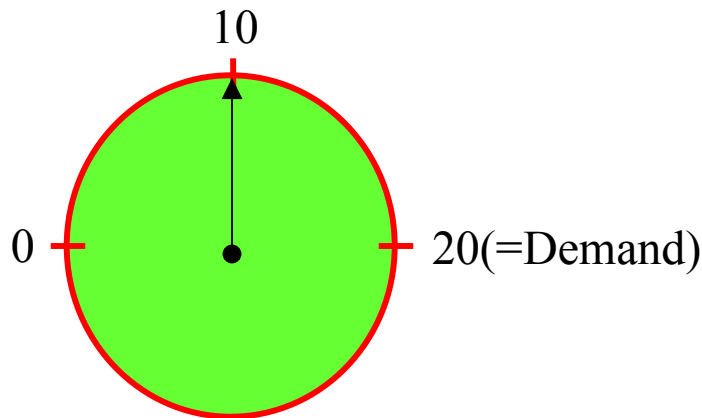


Speed \geq 120 mph

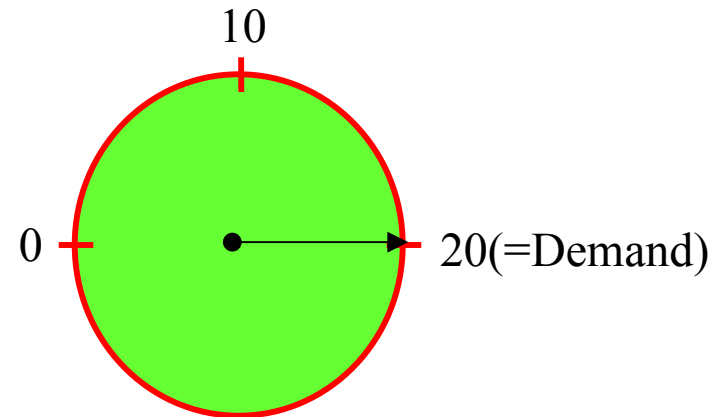


Application to Airport Capacity

- ❑ Actual Speed \Leftrightarrow Capacity
- ❑ Maximum Speed Measurement \Leftrightarrow Demand



Capacity=10 FPQH



Capacity \geq 20 FPQH



Censored Regression Model 1

$$COUNT_{op,t} = \min(CAP_{op,t}, DMD_{op,t})$$

$$CAP_{op,t} \sim NORM(\mu_{op,m(t),a(t)}, \sigma_{op,m(t)}^2)$$

$COUNT_{op,t}$	ASPM count of operation op (arrs/deps) and 15-min time period t
$CAP_{op,t}$	Capacity for op in time period t
$DMD_{op,t}$	ASPM demand for op in time period t
$\mu_{op,m(t),a(t)}$	Mean capacity for op , meteorological condition m (VMC/IMC), before ($a=0$) and after ($a=1$) new runway
$\sigma_{op,m(t)}^2$	Capacity variance for op , meteorological condition m (VMC/IMC)



Problems with Model 1

- ❑ Flights counted toward demand may be unable to land/depart for reasons other than capacity constraint (“anomalously delayed” (AD) flights)
- ❑ These can greatly distort capacity inferences
- ❑ Example
 - ❑ Demand=5
 - ❑ Capacity=20
 - ❑ No AD Flights \Rightarrow Capacity \geq 5
 - ❑ 1 AD Flight \Rightarrow Capacity=4



Censored Regression Model 2

$$COUNT_{op,t} = \min(CAP_{op,t}, DMD_{op,t}^*)$$

$$CAP_{op,t} \sim NORM(\mu_{op,m(t),a(t)}, \sigma_{op,m(t)}^2)$$

$$DMD_{op,t}^* \sim BINOM(DMD_{op,t}, PNAD_{op,m(t)})$$

Where $PNAD_{op,m(t)}$ is the probability that a flight counted toward the demand for op is not anomalously delayed under meteorological condition m . It is calculated using count/demand ratios for under low demand conditions.



Rates of Anomalous Delays based on Count/Demand Ratios for Demand < 5 FPQH

Meteorological Condition	Operation Type	Pre-deployment	Post-deployment	Overall
VMC	Arrivals	0.0132	0.0153	0.0142
	Departures	0.0285	0.0300	0.0293
IMC	Arrivals	0.0245	0.0214	0.0230
	Departures	0.0662	0.0603	0.0634

Table 2—Observed Rates of Anomalous Delays



Likelihood Function

$$\begin{aligned}
 LL(\alpha_{o,V}, \beta_{o,V}, \sigma_{o,V}, \alpha_{o,I}, \beta_{o,I}, \sigma_{o,I} \mid Q_o(1) \dots Q_o(T), P_{o,V}, P_{o,I}) = \\
 \sum_{\substack{Q_o(t) < D_o(t) \\ Q_o(t) > 0}} \log \left\{ \left(\frac{D_o(t)! P_{o,m(t)}^{D_o(t)-Q_o(t)} (1-P_{o,m(t)})^{Q_o(t)}}{Q_o(t)! (D_o(t)-Q_o(t))!} \right) \cdot \Phi \left(\frac{\alpha_{o,m(t)} + \beta_{o,m(t)} A(t) - Q_o(t)}{\sigma_{o,m}} \right) + \right. \\
 \left. \sum_{n=1}^{D_o(t)-Q_o(t)-1} \left(\frac{D_o(t)! P_{o,m(t)}^n (1-P_{o,m(t)})^{D_o(t)-n}}{n! (D_o(t)-n)!} \cdot \frac{\phi \left((Q_o(t) - \alpha_{o,m(t)} - \beta_{o,m(t)} A(t)) / \sigma_{o,m} \right)}{\sigma_{o,m}} \right) \right\} \\
 + \sum_{\substack{D_o(t) > 0 \\ Q_o(t) = 0}} \log \left\{ P_{o,m(t)}^{D_o(t)} + \sum_{n=1}^{D_o(t)-1} \left(\frac{D_o(t)! P_{o,m(t)}^n (1-P_{o,m(t)})^{D_o(t)-n}}{n! (D_o(t)-n)!} \cdot \Phi \left(\frac{-\left(\alpha_{o,m(t)} + \beta_{o,m(t)} A(t) \right)}{\sigma_{o,m}} \right) \right) \right\} \\
 + \sum_{Q_o(t) = D_o(t)} \log \left((1-P_{o,m(t)})^{D_o(t)} \cdot \Phi \left(\frac{\alpha_{o,m(t)} + \beta_{o,m(t)} A(t) - Q_o(t)}{\sigma_{o,m}} \right) \right)
 \end{aligned}$$



Estimation Results

- ❑ VMC departure capacity increased from 83 to 88 per hour
- ❑ No significant capacity increases for arrivals or IMC departures
- ❑ Interpretation
 - ❑ New runway replaced share-use runway with dedicated departure and arrival runways
 - ❑ Greatest impact on departures because arrivals given priority on shared-use runway
 - ❑ Greatest impact in VMC because IMC creates natural gaps in arrival stream that can be used for departures
 - ❑ Further changes expected when triple arrival stream procedure is implemented

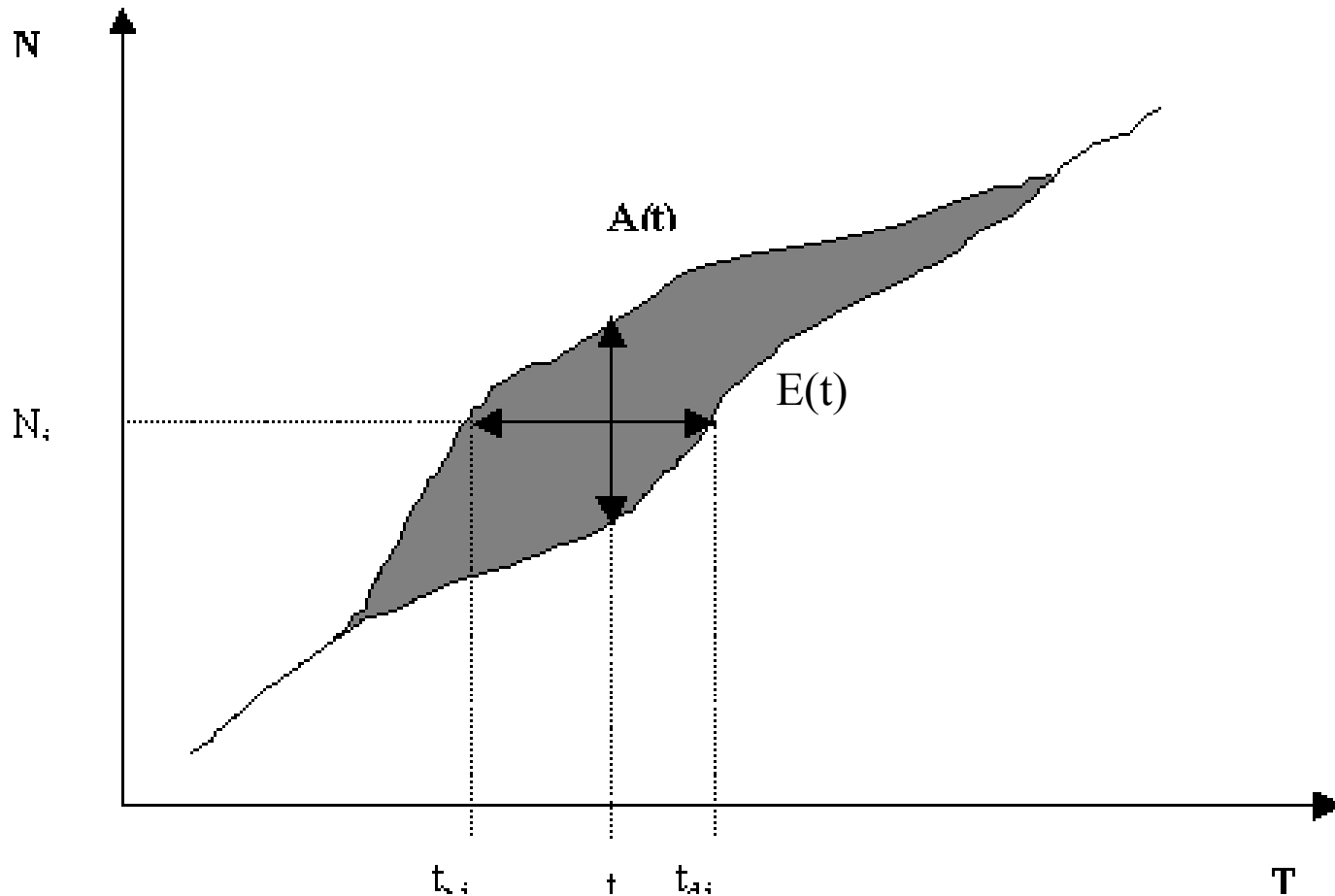


Delay Impact of Capacity Increase

- How much more delay would there have been if 2002 demand had been served by DTW without the new runway?
- Estimate using deterministic queuing diagram
- Consider departure delays only

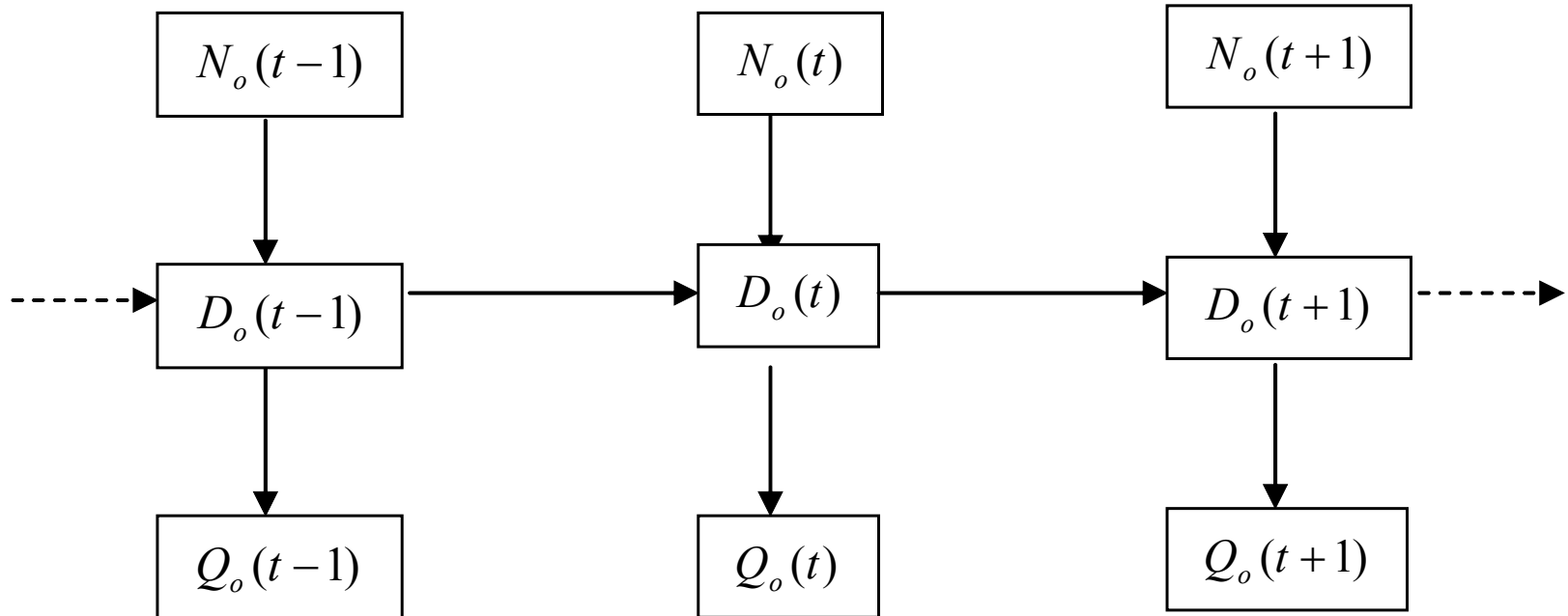


Delay Impact Calculations





Relationship between New Demand, Total Demand, and Throughput





Delay Impact Estimates

		Jan.-June 2001		Jan.-June 2002	
		Mean	Std. Dev	Mean	Std. Dev
Departures	Observed	1.92		1.93	
	Simulated Baseline	2.00	0.060	1.92	0.032
	Simulated Counterfactual	1.77	0.052	2.26	0.070
	Difference	0.23		-0.34	
Arrivals	Observed	1.01		0.95	
	Simulated Baseline	0.89	0.026	0.93	0.029
	Simulated Counterfactual	0.92	0.027	0.90	0.041
	Difference	-0.03		0.03	

Table 5—Delay Comparisons, Simulated vs Observed, and Baseline vs Counterfactual



Conclusions

- ❑ Runway 4L/22R increased departure capacity but not departure capacity in post deployment period
- ❑ 7% capacity increase resulted in 15% departure delay decreased
- ❑ Impacts may change when additional procedures implemented
- ❑ Methodology shows promise for assessing capacity impacts of a large variety of events