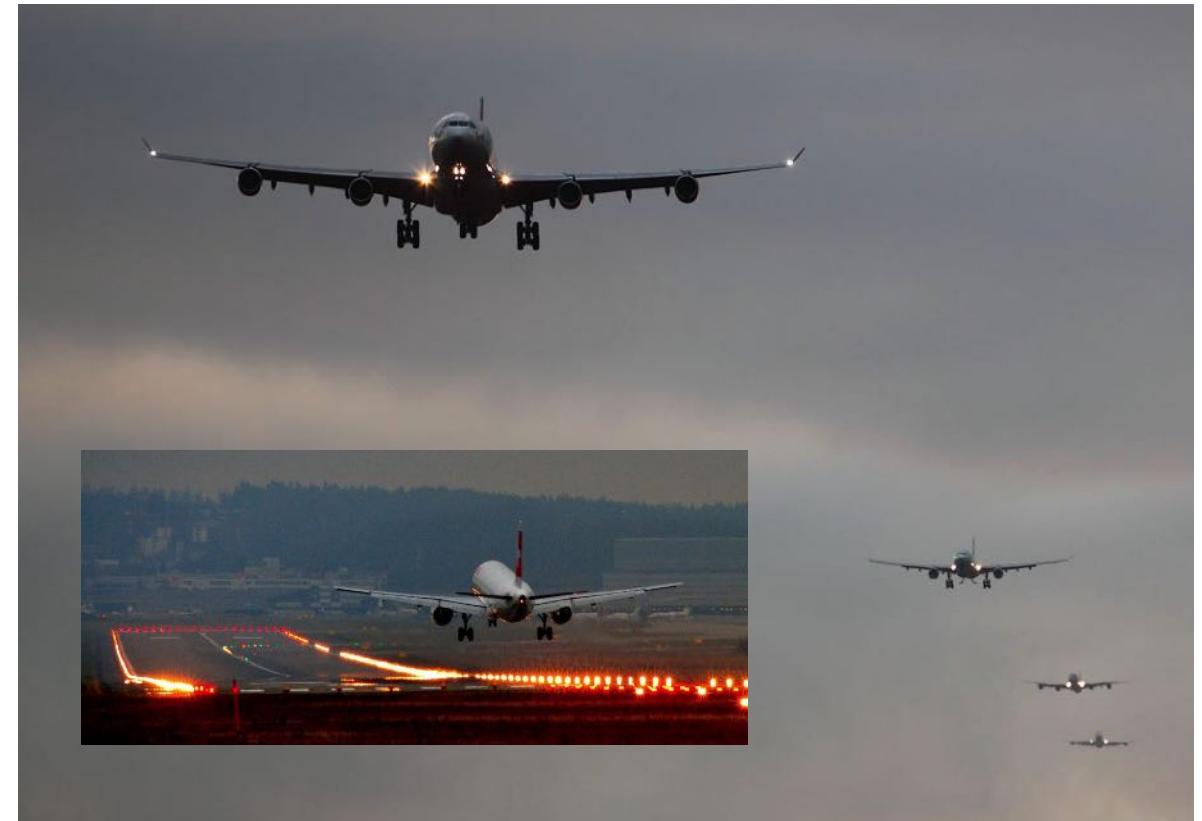


Model-Based Simulation for Design of an Airport *Autonomous* Approach and Landing System: *Stochastic Design-Space*



28th Annual **INCOSE**
international symposium

Washington, DC, USA
July 7 - 12, 2018





MBSE & Simulation

- MBSE lower costs, improve efficiency and increase flexibility in design of complex systems
- Challenge to *seamlessly* leverage simulation in the Requirements Analysis and Design



Case Study: MBSE Simulation

- Tasked with design of Airport Autonomous Approach & Landing System
- Multiple components of system developed by different teams
- Component design affects overall system performance
 - **Stochastic design space**
- Simulation assess the impacts of component performance on overall system performance

Challenge #1: Discrete vs Stochastic Design Space

- Discrete Design Space
 - Aircraft Weight Budget
 - Accumulated component weights
 - Error budget
- Stochastic Design Space
 - Performance affected by component design is stochastic
 - Confidence Interval

How to integrated Stochastic Simulation into MBSE Tool Environment?

Challenge #2: Multiple Component Req's Contribute to System Performance

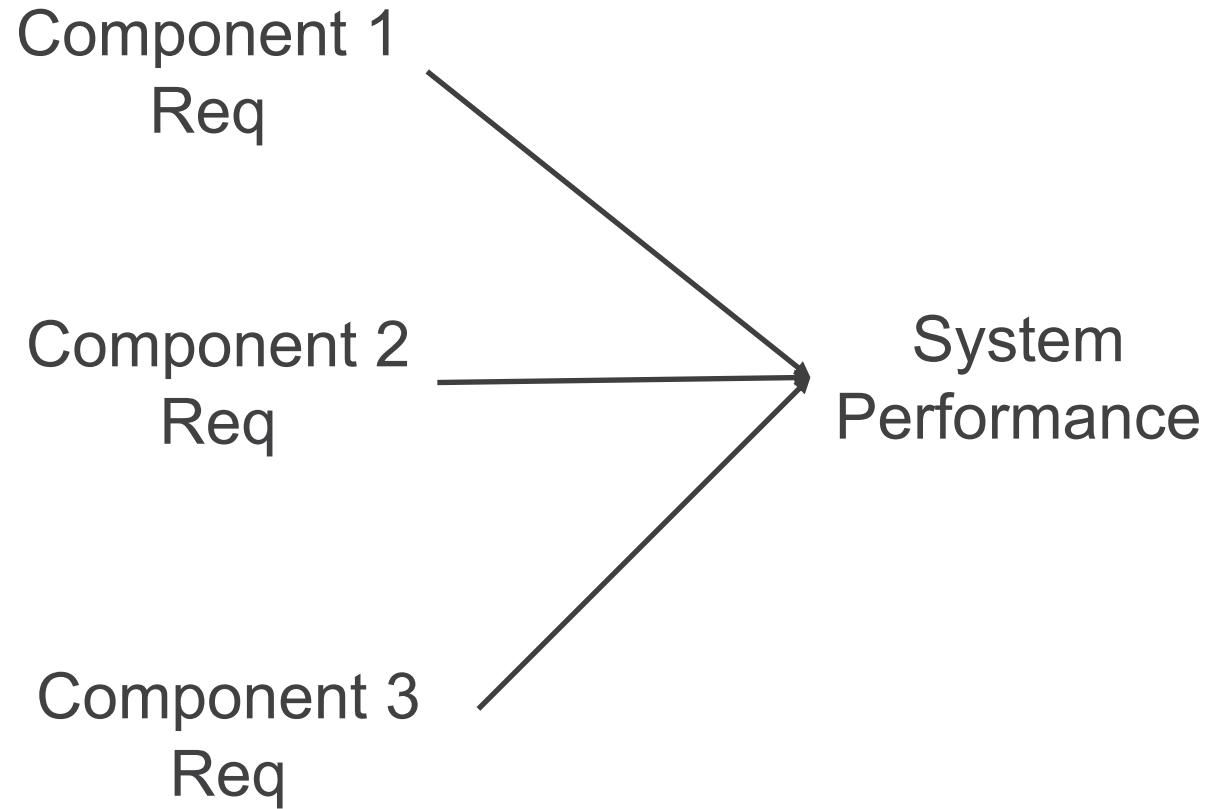




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Airport Approach and Landing - Procedure



WASHINGTON, DC

APP CRS 187°	Rwy Idg 6869
TDZE	13
Apt Elev	14

AL-443 (FAA)

18088

RNAV (RNP) RWY 19

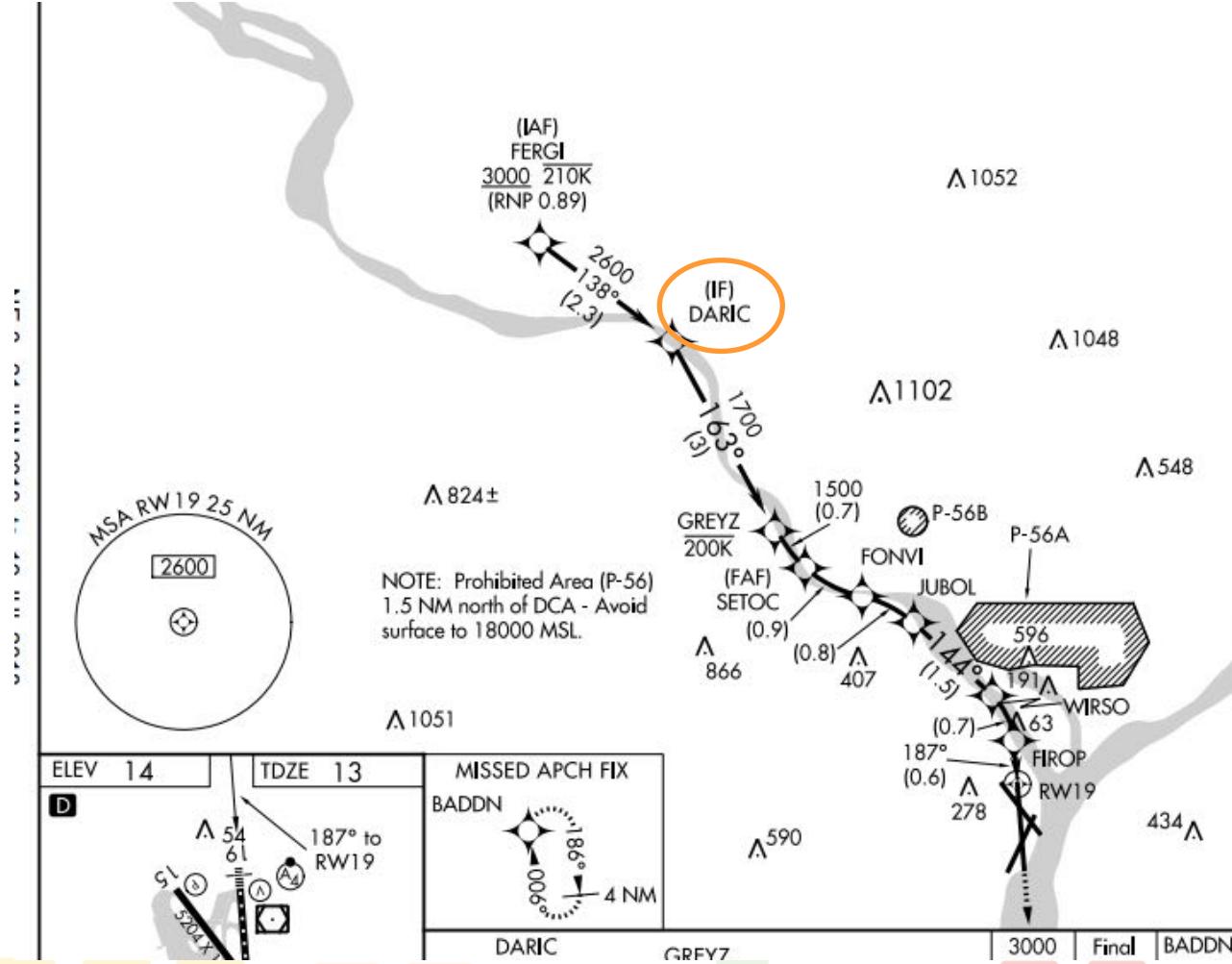
RONALD REAGAN WASHINGTON NATIONAL (DCA)

	For uncompensated Baro-VNAV systems, procedure NA below -9°C (16°F) or above 54°C (130°F). Inoperative table does not apply. RF and GPS required.	MALSF 	MISSSED APPROACH: Climb to 3000 on the final approach track to RW19 then direct BADDN and hold, continue climb-in-hold to 3000.		
D-ATIS 132.65	POTOMAC APP CON 119.85 319.1 124.2 269.0 (WEST/SOUTH) (EAST)	WASHINGTON TOWER 119.1 257.6	GND CON 121.7 257.6	CLNC DEL 128.25	CPDLC

Airport Approach and Landing - Procedure



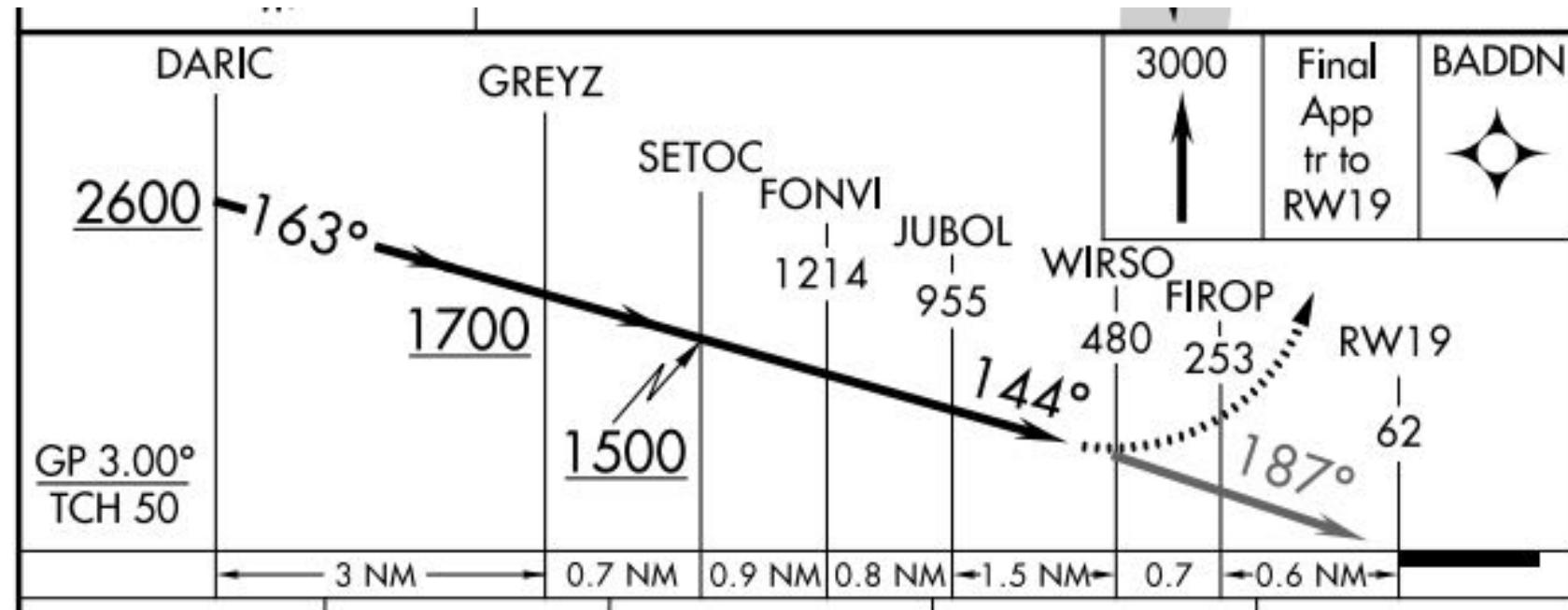
Lateral trajectory
Follows Potomac River



Airport Approach and Landing - Procedure



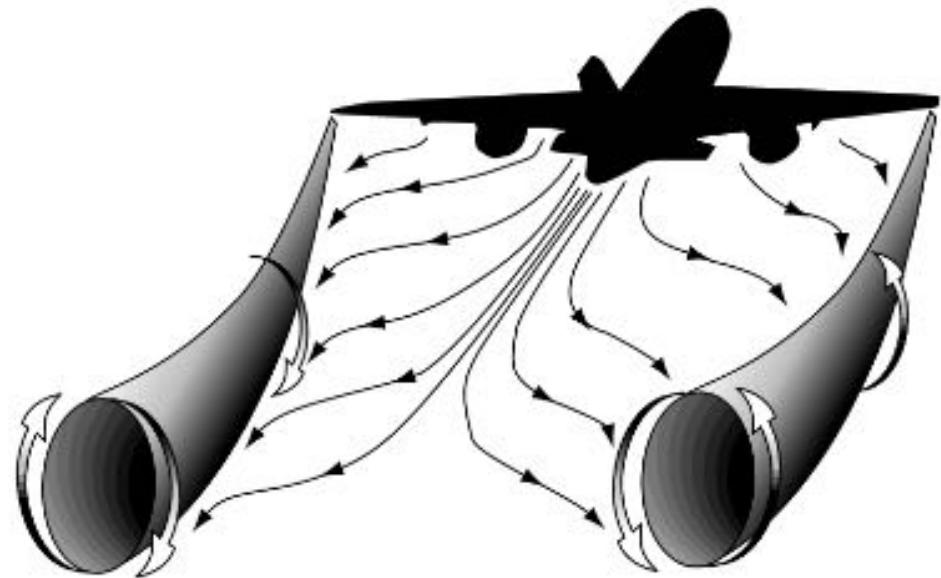
Vertical trajectory
2600' to 13'
Rate of descent





Airport Approach & Landing

- Air Traffic Control sequences flights on Final Approach Segment
- Sequential aircraft must be separated by Minimum Safe Separation Distance (MSSD)
 - Avoid wake vortex encounter





Functions Performed by Air Traffic Controller

1. Automated Weather Reporting
2. Automated Traffic Collision (e.g. Mahboubi & Kochenderfer, 2015)
3. Active Runway Surveillance (e.g. Öztürk & EminKuzucuoglu, 2016)
4. Runway Assignments and Flight Sequencing (e.g. Erzberger, Davis & Green, 1993; Kim et.al. 2014)
5. Taxiway Guidance (Xin-min, et.al., 2010)
6. ***Spacing and Landing*** (Snisarevska, Sherry, Shortle, 2017)



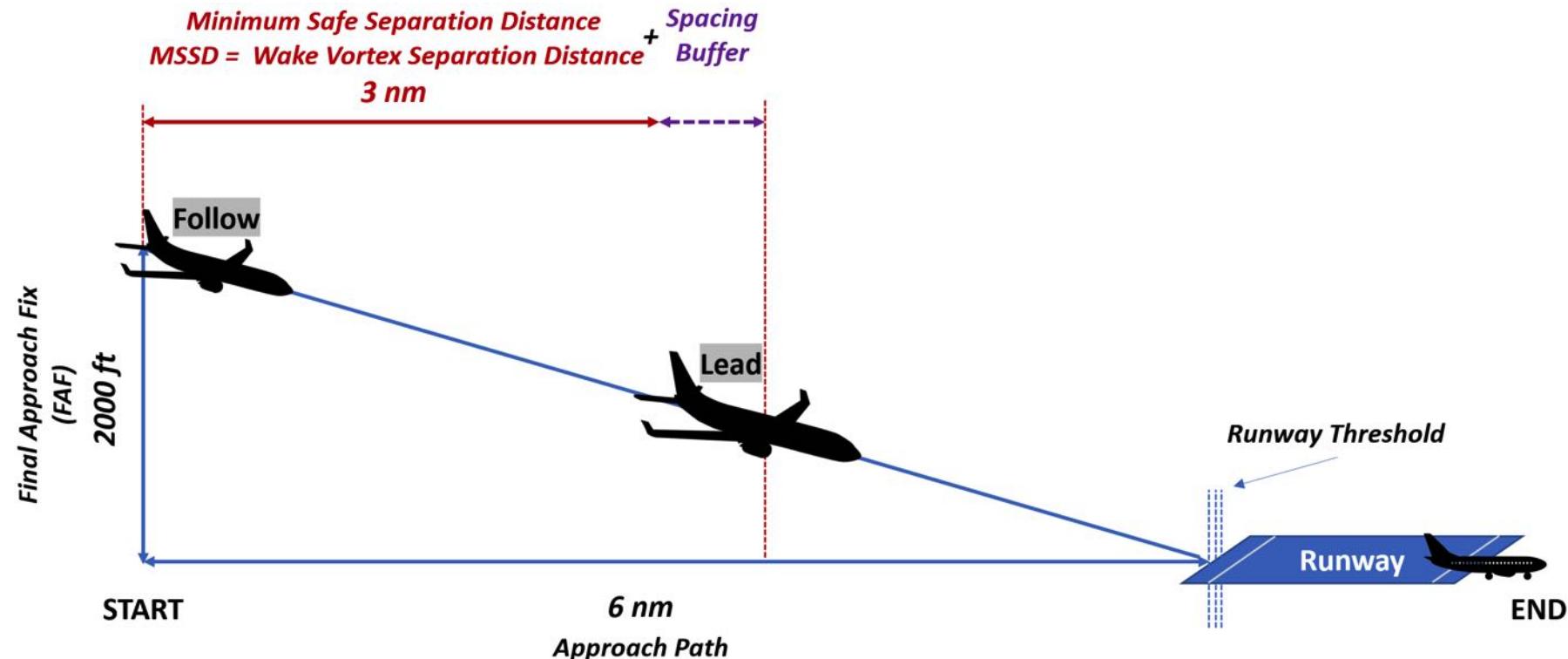
Spacing is Candidate for Autonomy

- Uni-directional flight
- Controlled airspace
- Repetitive control instructions
- ... but highly stochastic



Approach & Landing Spacing

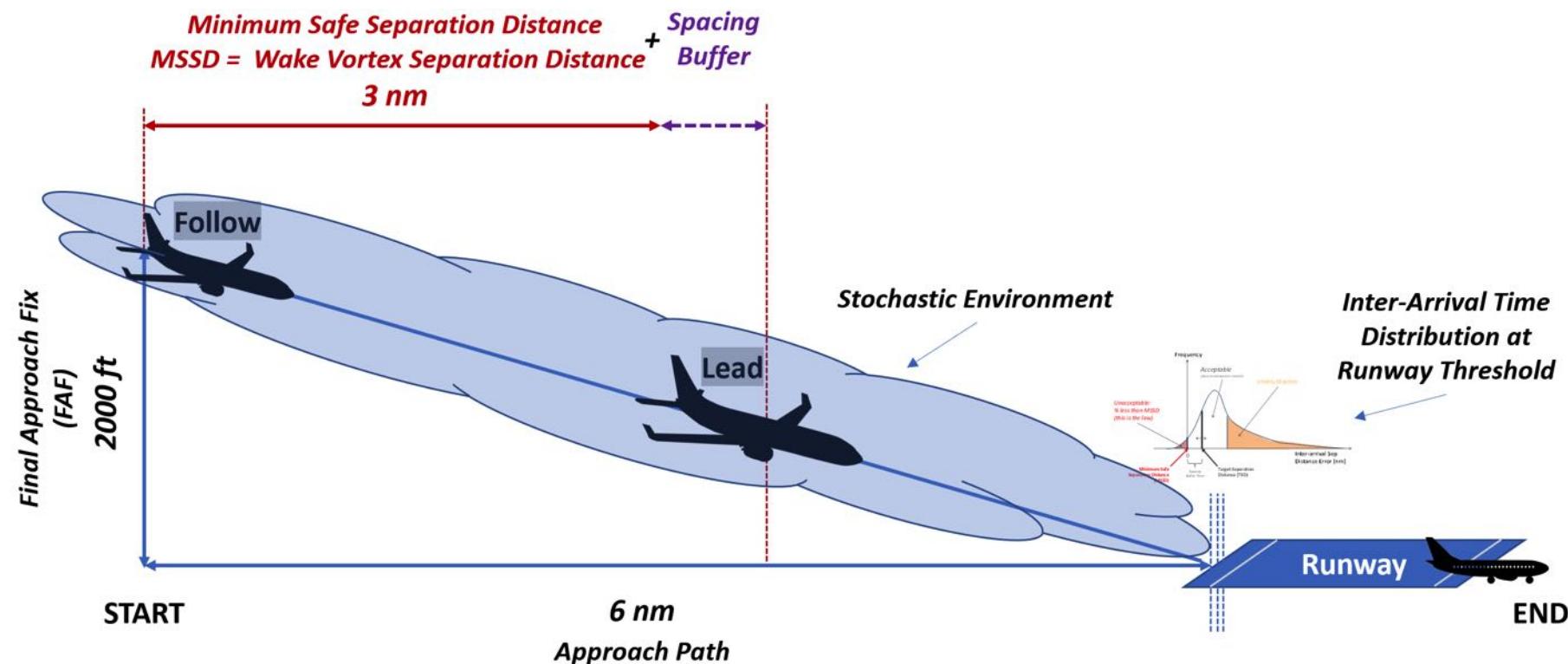
- Final approach segment and runway
- Flights must be sequenced and spaced before the Final Approach Fix (FAF)
 - 6nm from Runway Threshold, 2000' AGL
- Flights are at their lowest speed for the approach and landing phase





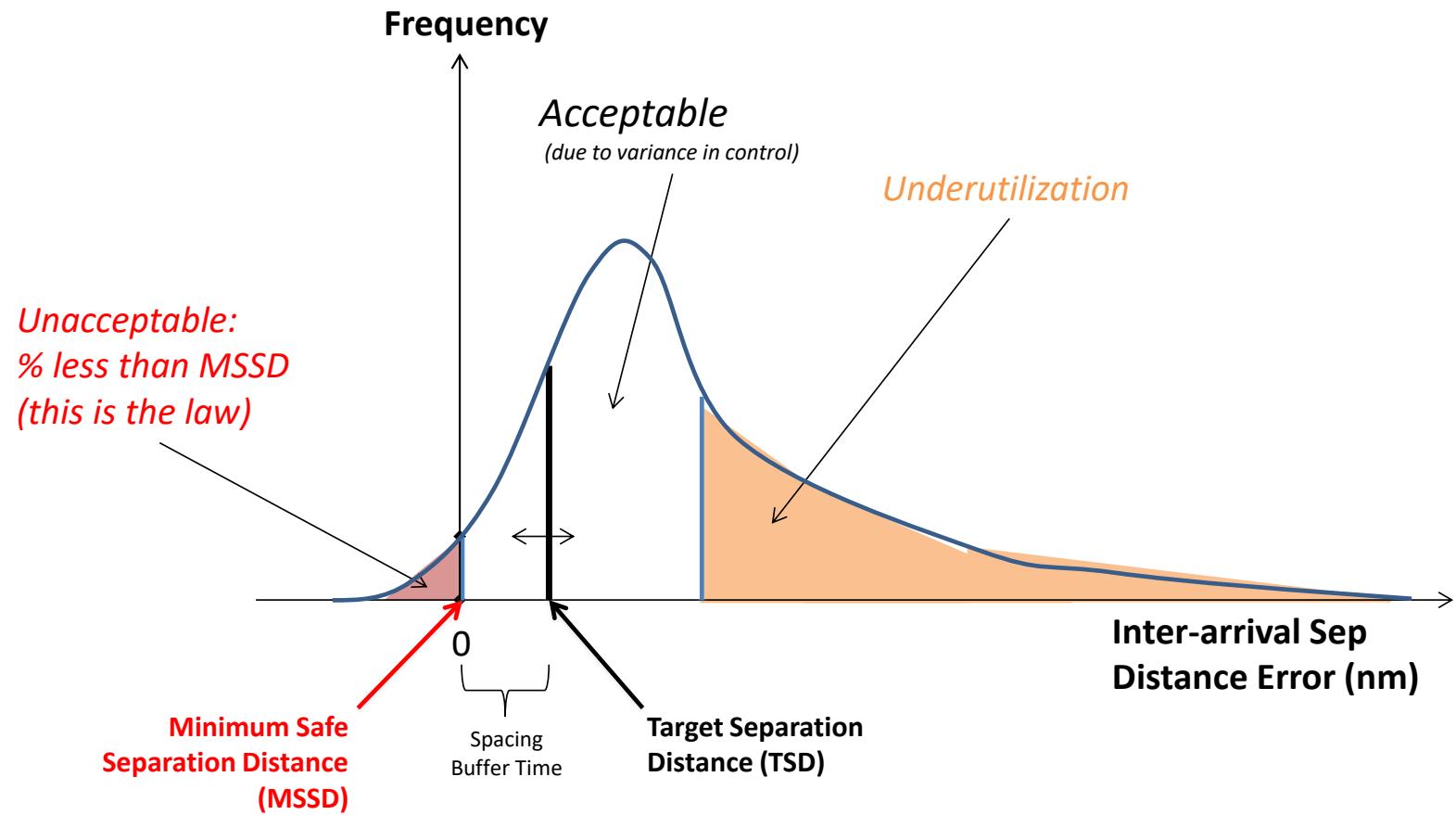
Approach & Landing Spacing

- Highly **stochastic** environment impacts time at Runway Threshold
- Air Traffic Controllers **manually** insert “*Buffer Time*” between the wake vortex separation distance of the lead and the follow aircraft
 - Too short Buffer Time → reduced safety margins
 - Too long Buffer Time → reduced runway throughput





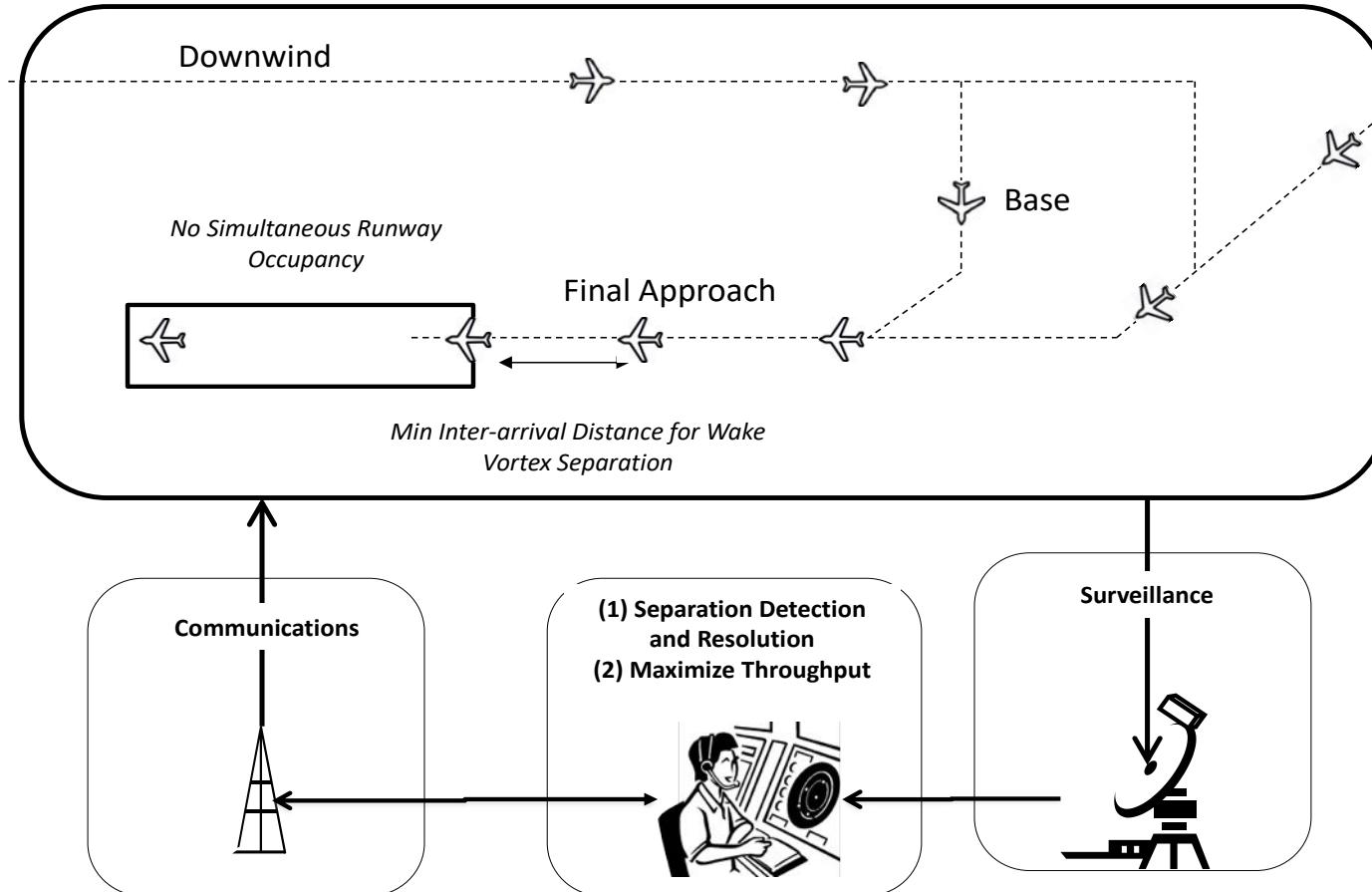
Approach & Landing Spacing



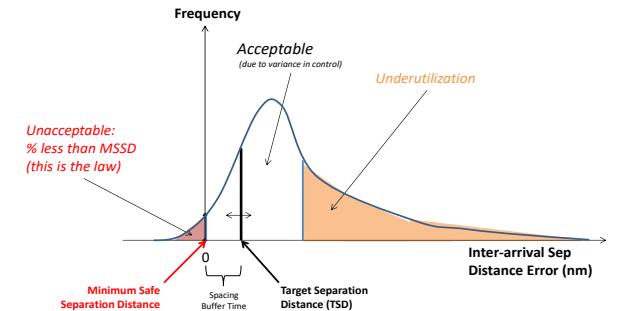
- The magnitude of the **left-tail** of the distribution determines **safety margins** of the approach process.
- The magnitude of the **right tail** of the distribution represents **gaps in the flow** and **reduced runway throughput**.



As-Is Spacing for Approach and Landing

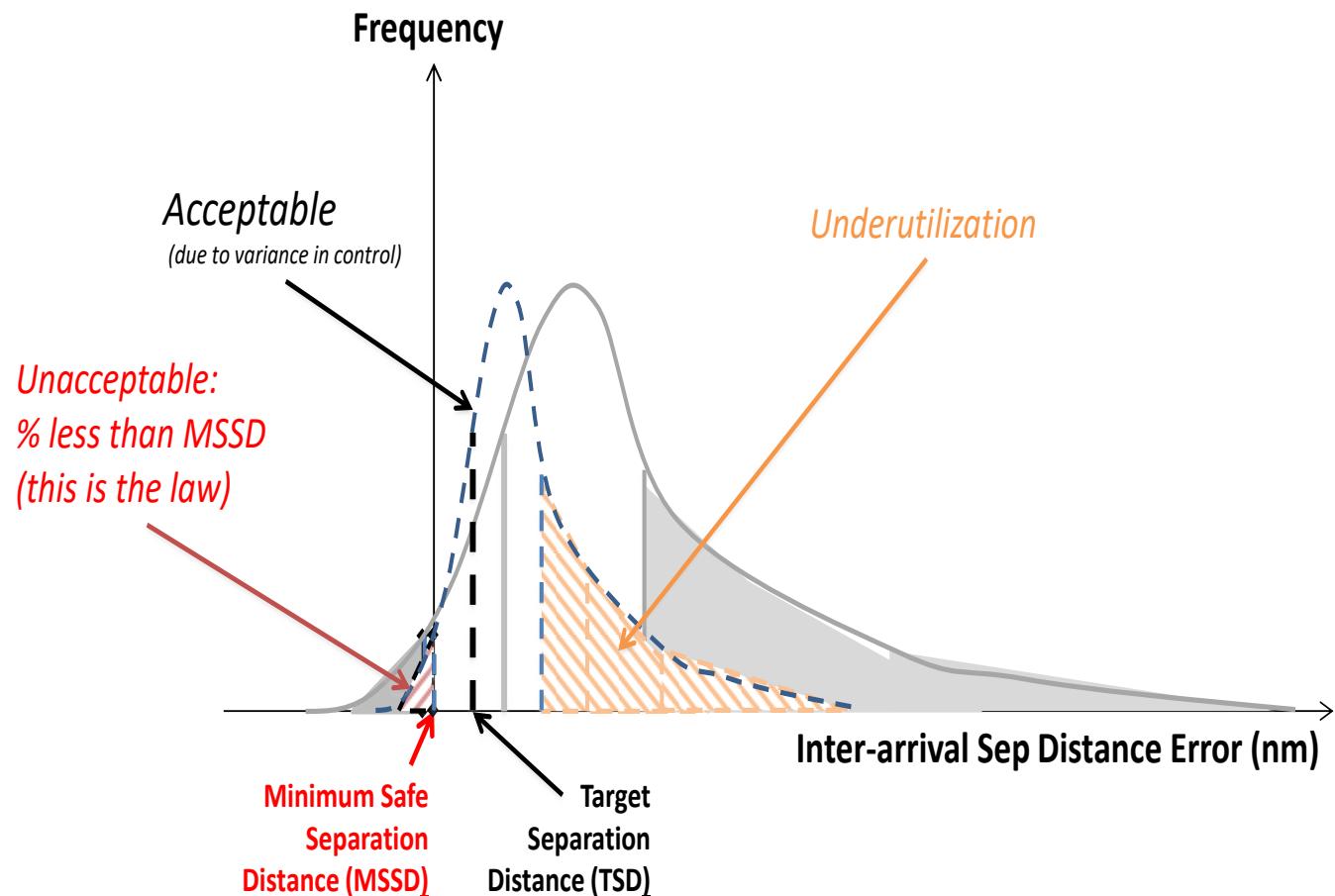


- Air Traffic Controller introduces Spacing Buffer (SB) by controlling the Target Separation Distance (TSD)
- Not supported by distribution





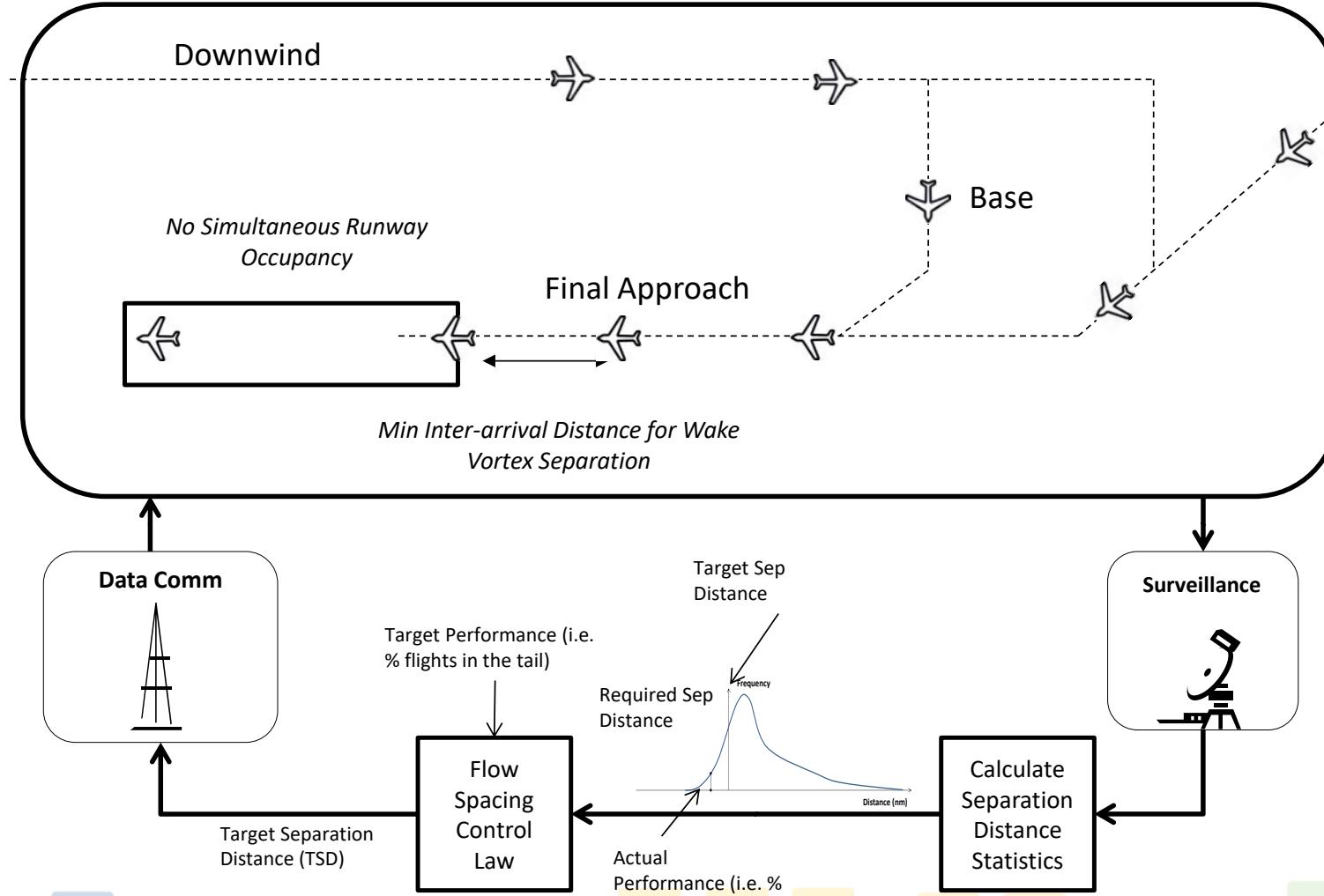
Con-Ops & Reqs



- Increase Throughput & Utilization *and* Maintain Safety margins
 - Knowledge of stochasticity
 - Eliminate voice communication delays
 - Reduce pilot technique
- Reduce right tail (Underutilization):
 - **Required Time of Arrivals (RTA)** places flights at the FAF according to a pre-defined time schedule;
 - **Self-separation** “pulls” sequential flights with a specified time/distance separation;
- Reduce left tail (Safety Margins):
 - **Autonomous Approach & Landing System (AALS)** monitors the inter-arrival times at the runway threshold and sets the buffer-time in excess of the wake vortex separation time to meet a Target Level of Safety (TLS).



Con-Ops & Reqs



- Replace Air Traffic Controller with automation to perform *Flow Spacing Control*



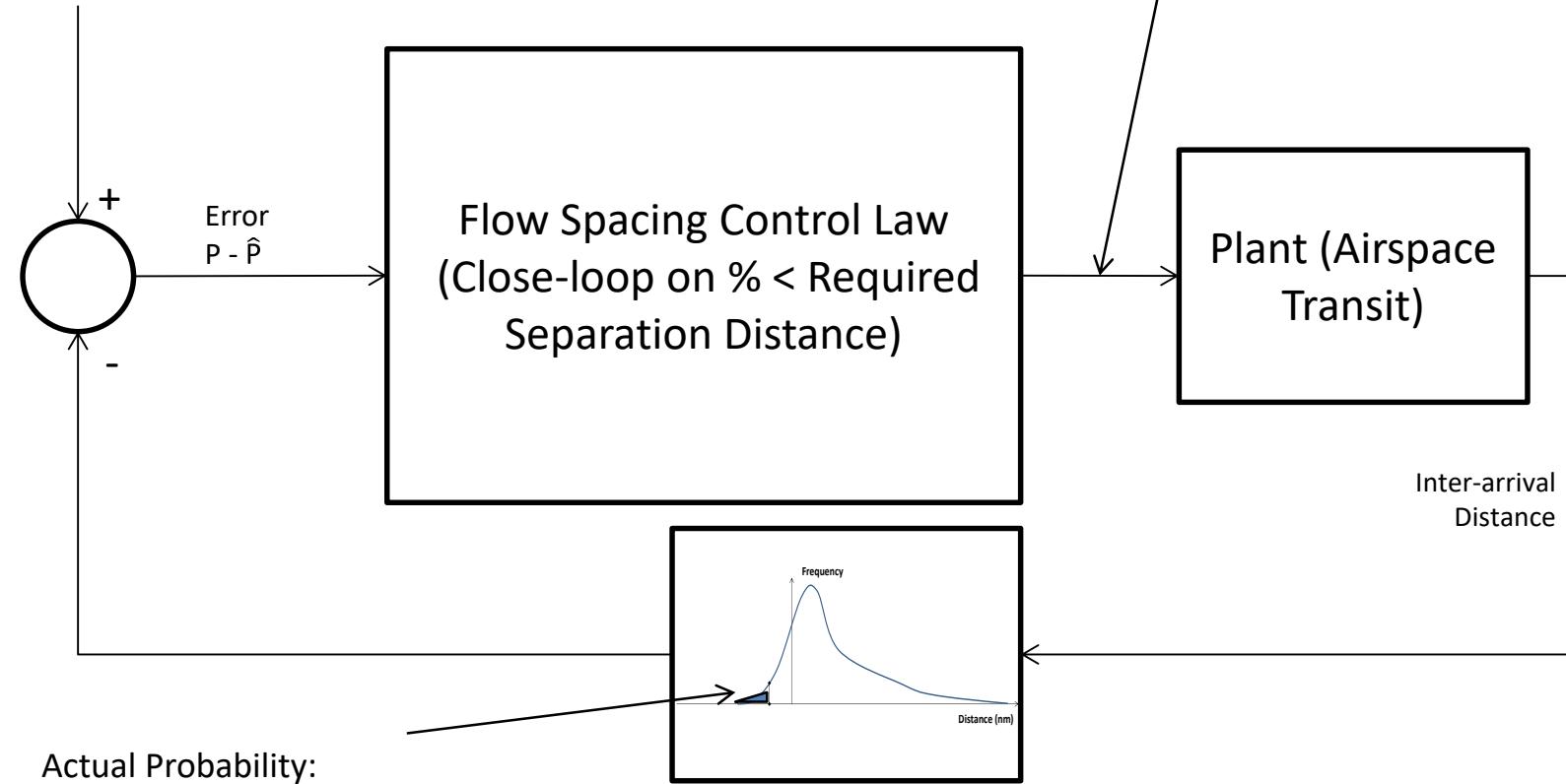
Con-Ops & Reqs

Target Performance:

$$P = (\Pr\{\text{SepDist} < \text{Required Sep Dist}\})$$

$$\text{Target Separation Distance} = \text{MSSD} + \text{Spacing Buffer}$$

(TSD)



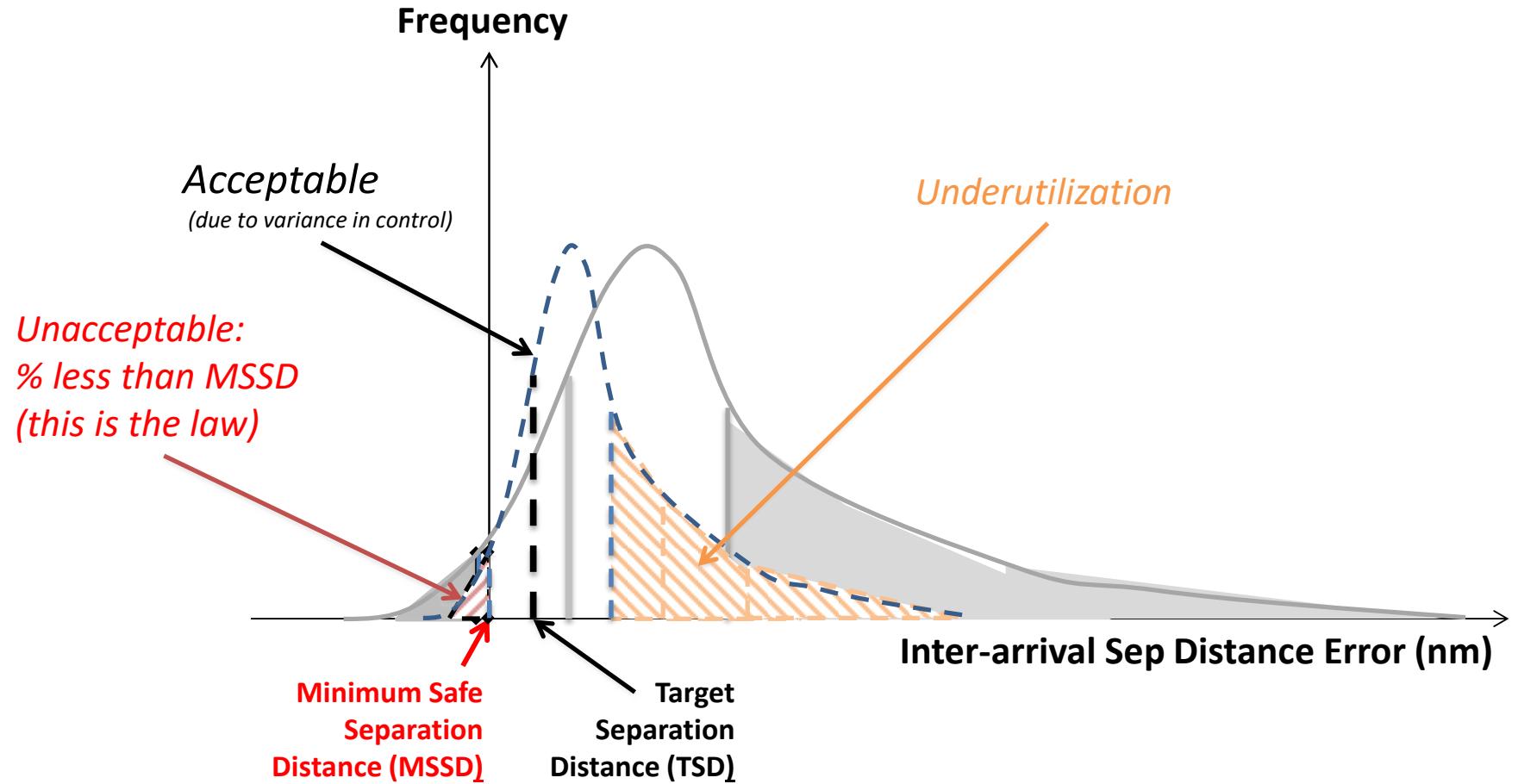
Actual Probability:

$$\hat{P} = (\Pr\{\text{SepDist} < \text{Required Separation Distance}\})$$

- The control law continuously adjusts the Spacing Buffer based on the stochastic performance of the system to maximize throughput and maintain the TLS.



Con-Ops & Reqs



- The result of the AALS is an *inter-arrival time distribution* that continuously balances the trade-off between *utilization* and *safety* to actively maintain the TLS



MBSE Simulation

Function of Components Reqs



Initial Velocity (μ and σ)
Initial Spacing Buffer (μ and σ)
Approach Path
FAF Altitude
MSSD
Target Probability
Sample Size
of Flights



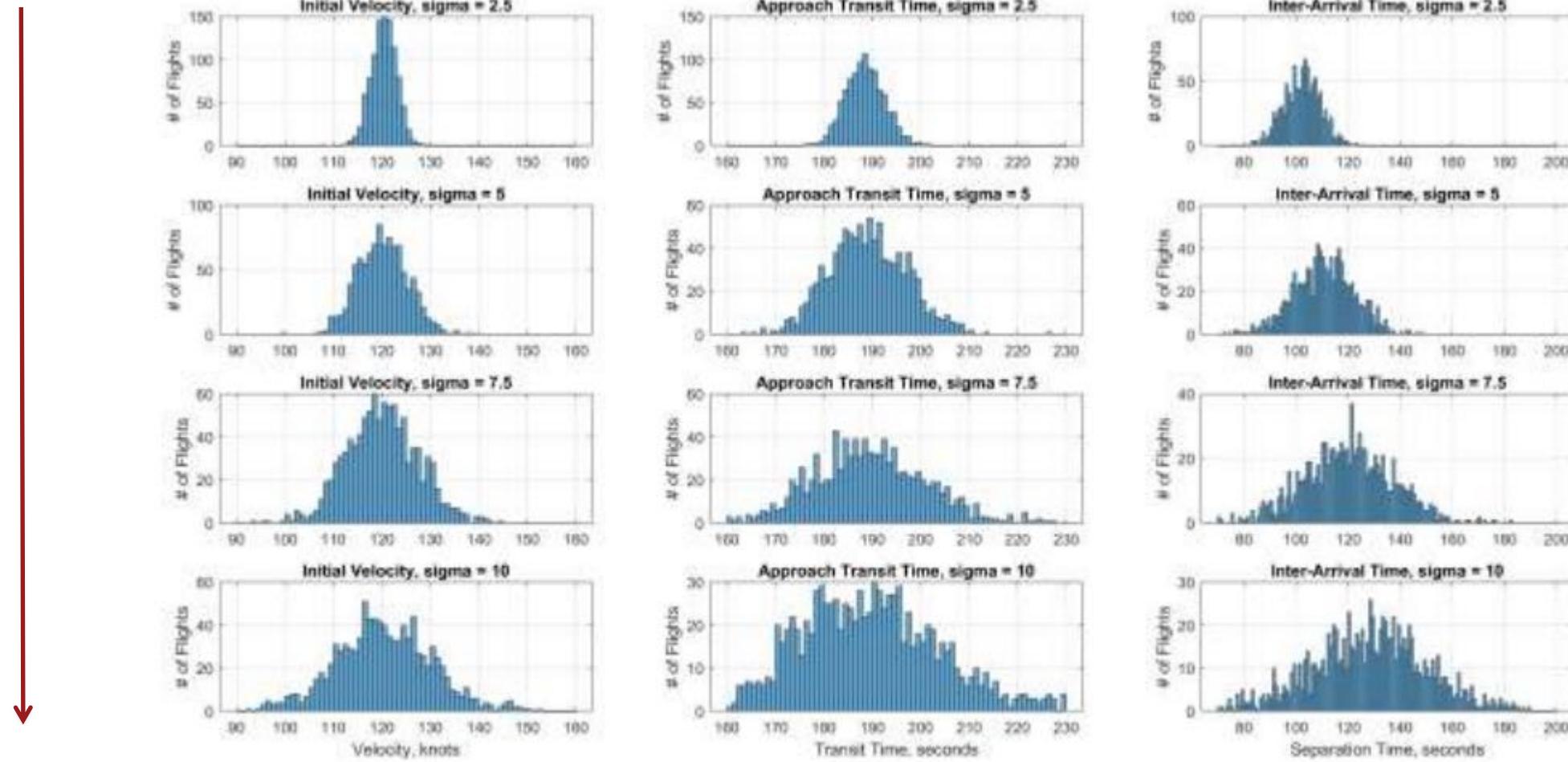
Inter-Arrival Time Distribution
Actual Probability
Error
Target Separation Time
Spacing Buffer Time
Maximum Capacity Throughput



Approach and Landing Spacing Simulation

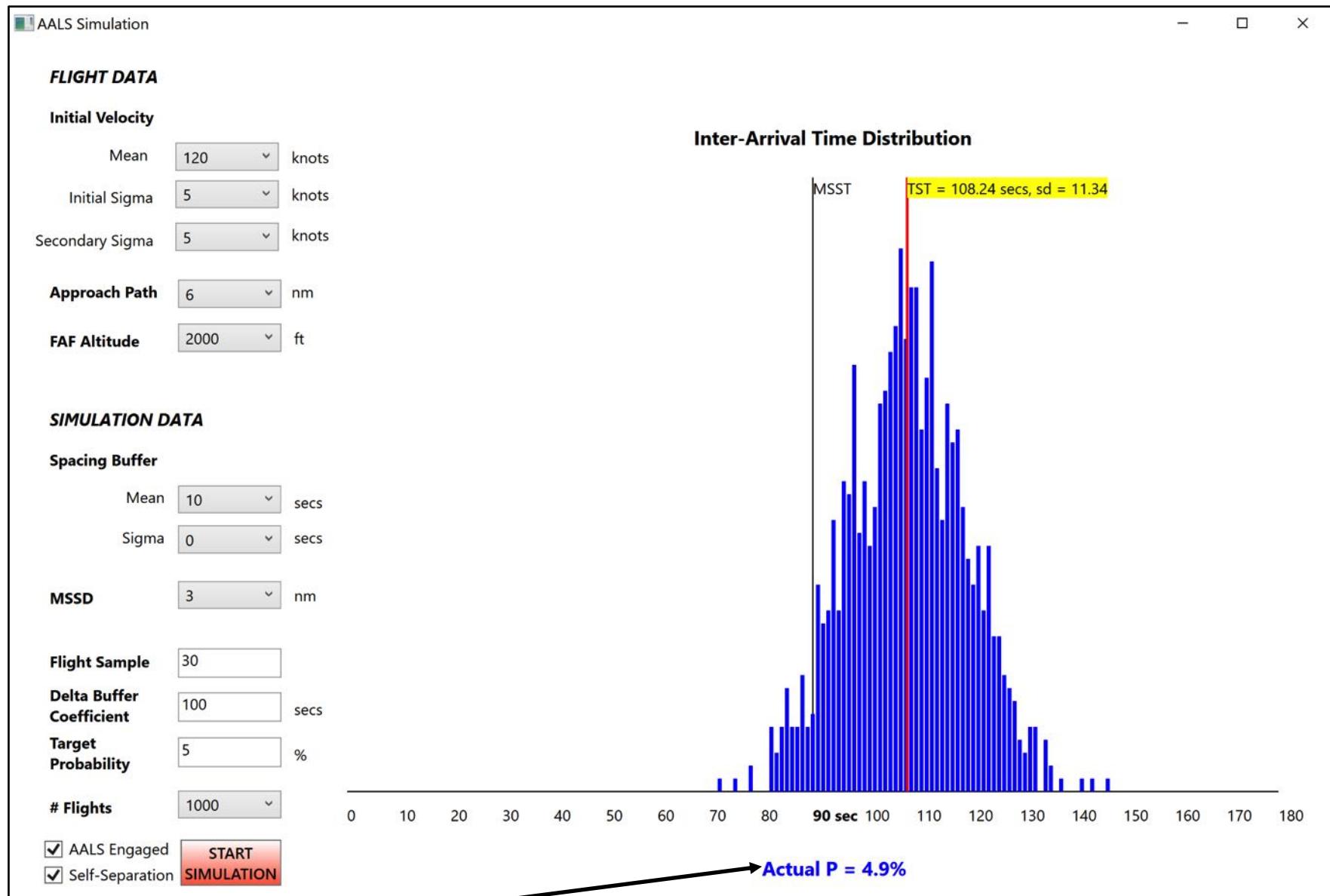
- **Initial Velocity Distribution** (μ and σ)
 - Models stochasticity in final segment approach
- **Initial Spacing Buffer Distribution** (μ and σ)
 - Models gaps in arrival flow at FAF
- **Maximum Capacity Throughput (MCT)** is a rate of number of flights that have landed on a runway per given period of time.

Approach and Landing Spacing Simulation



Increasing Stochasticity during Approach

Simulation GUI





Fixed Spacing at FAF (Baseline)

Input:

$V = 120$ knots

$\sigma_{IV} = 10$ knots

Buffer = 10 s

$\sigma_{SB} = 0$

Output:

$P = 30.5\%$

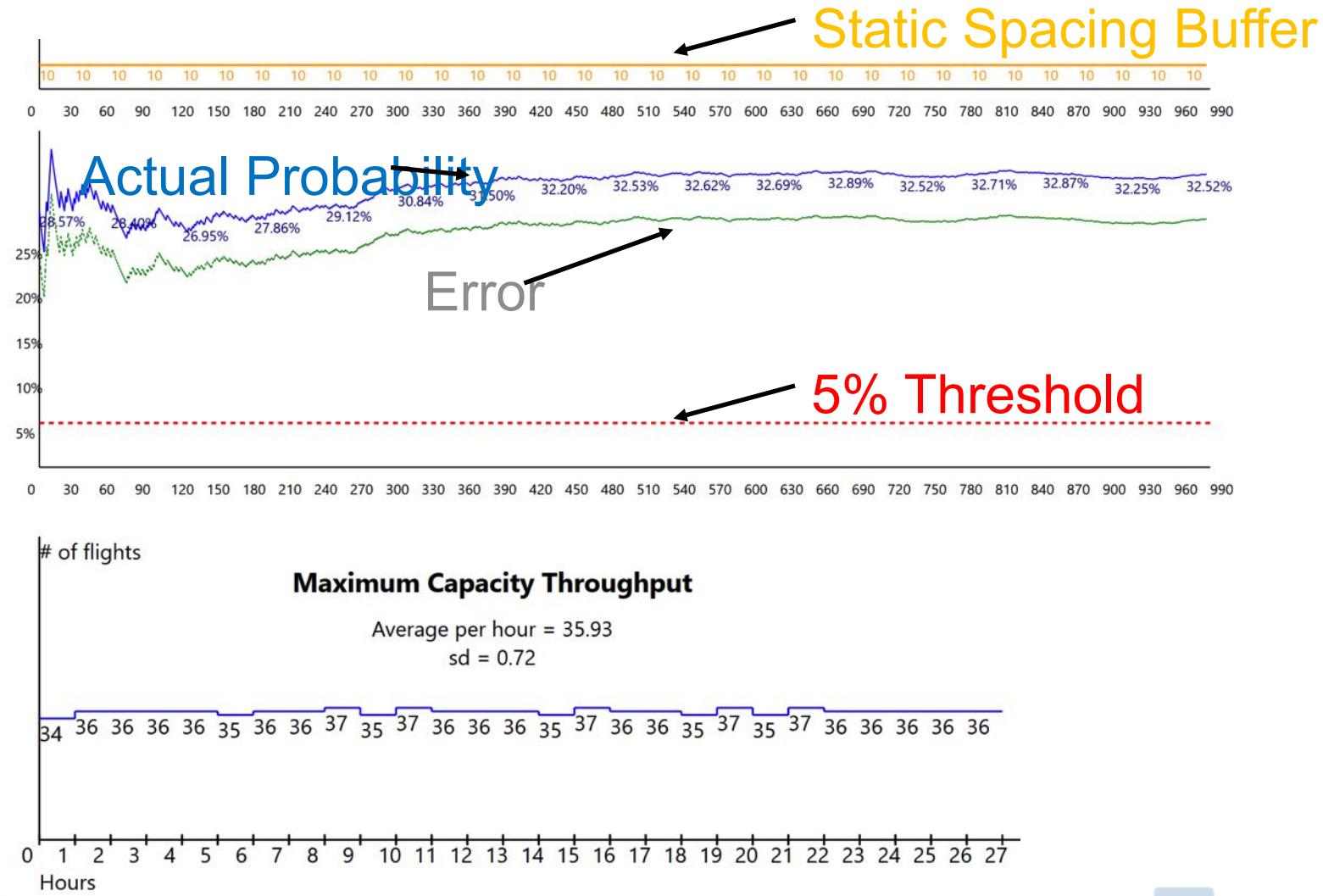
Buffer = 10 s

MCT = 36

IAT = 102.17 s

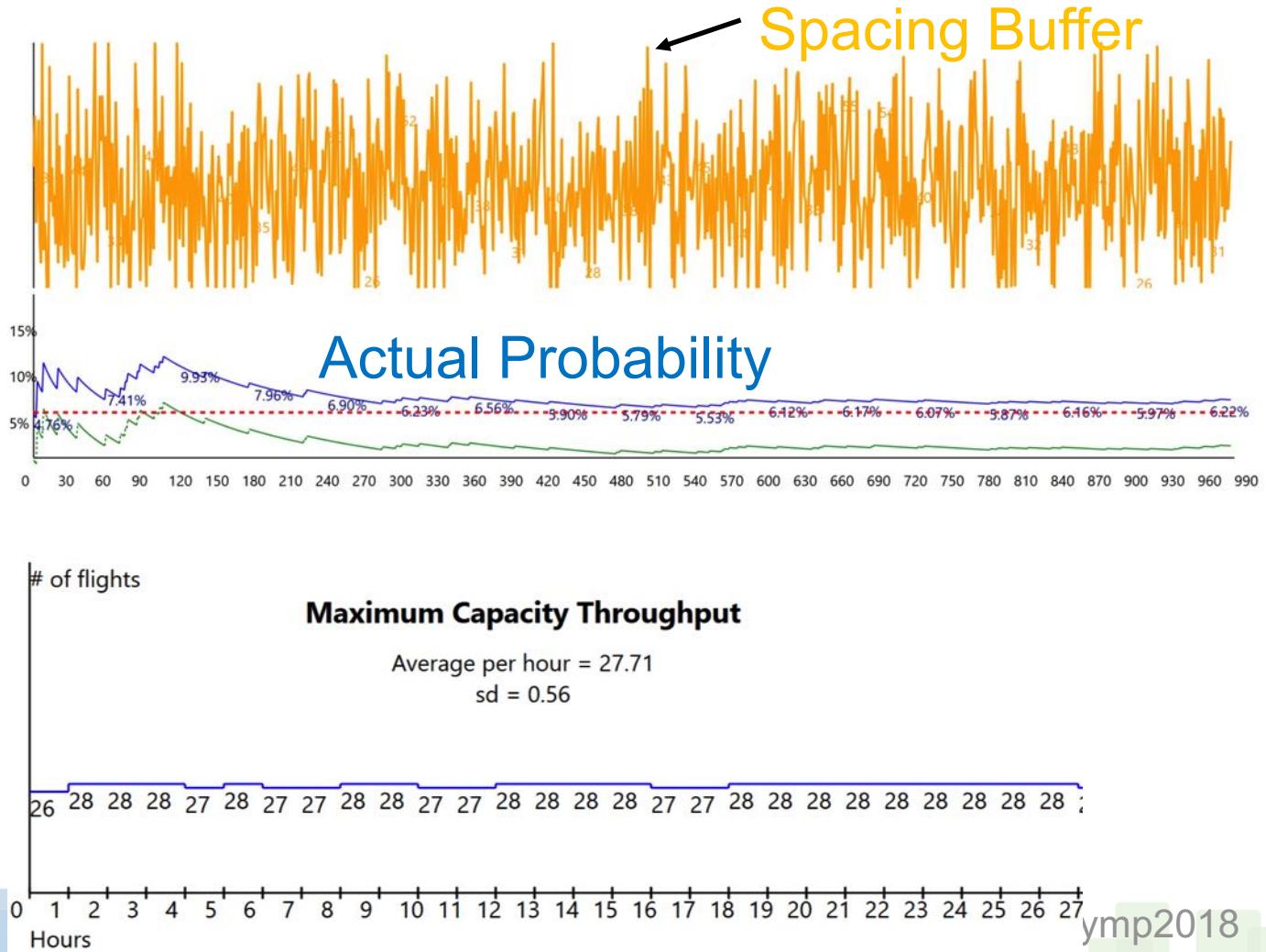
$\sigma_{IAT} = 23.21$ s

This scenario leads to extreme safety violations.





Manual Spacing at FAF (Spacing Buffer = 40 s, σ_{SB} = 10 s)



Input:

$V = 120$ knots
 $\sigma_{IV} = 10$ knots
Buffer = 40 s
 $\sigma_{SB} = 10$ s

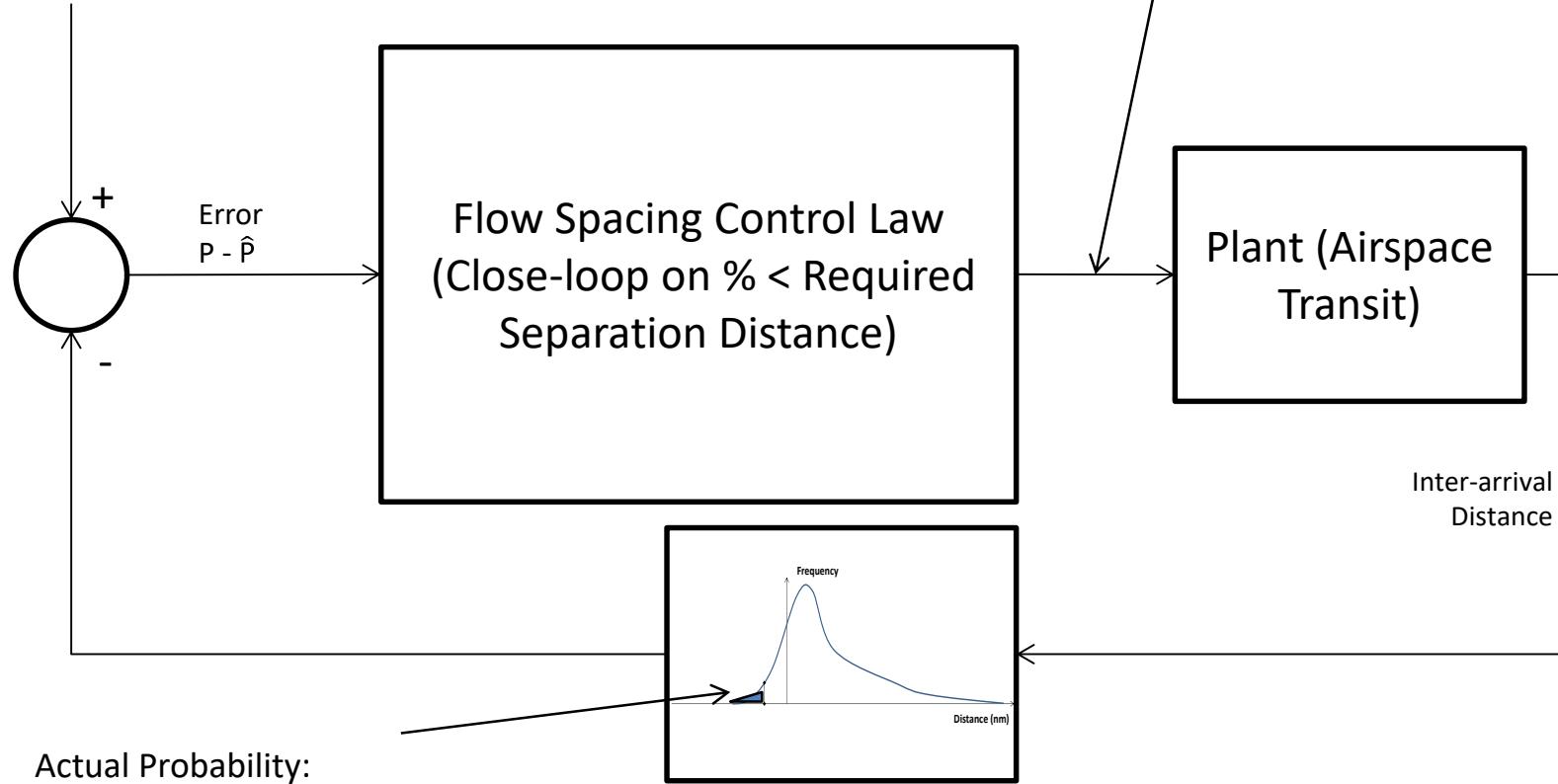
Output:

P = 6.1%
Buffer = 39.99 s
 $\sigma_{SB} = 9.75$ s
MCT = 28
IAT = 129.75 s
 $\sigma_{IAT} = 25.49$ s



Autonomous Spacing Control

Target Performance:
 $P = (\Pr\{\text{SepDist} < \text{Required Sep Dist}\})$



Actual Probability:
 $\hat{P} = (\Pr\{\text{SepDist} < \text{Required Separation Distance}\})$

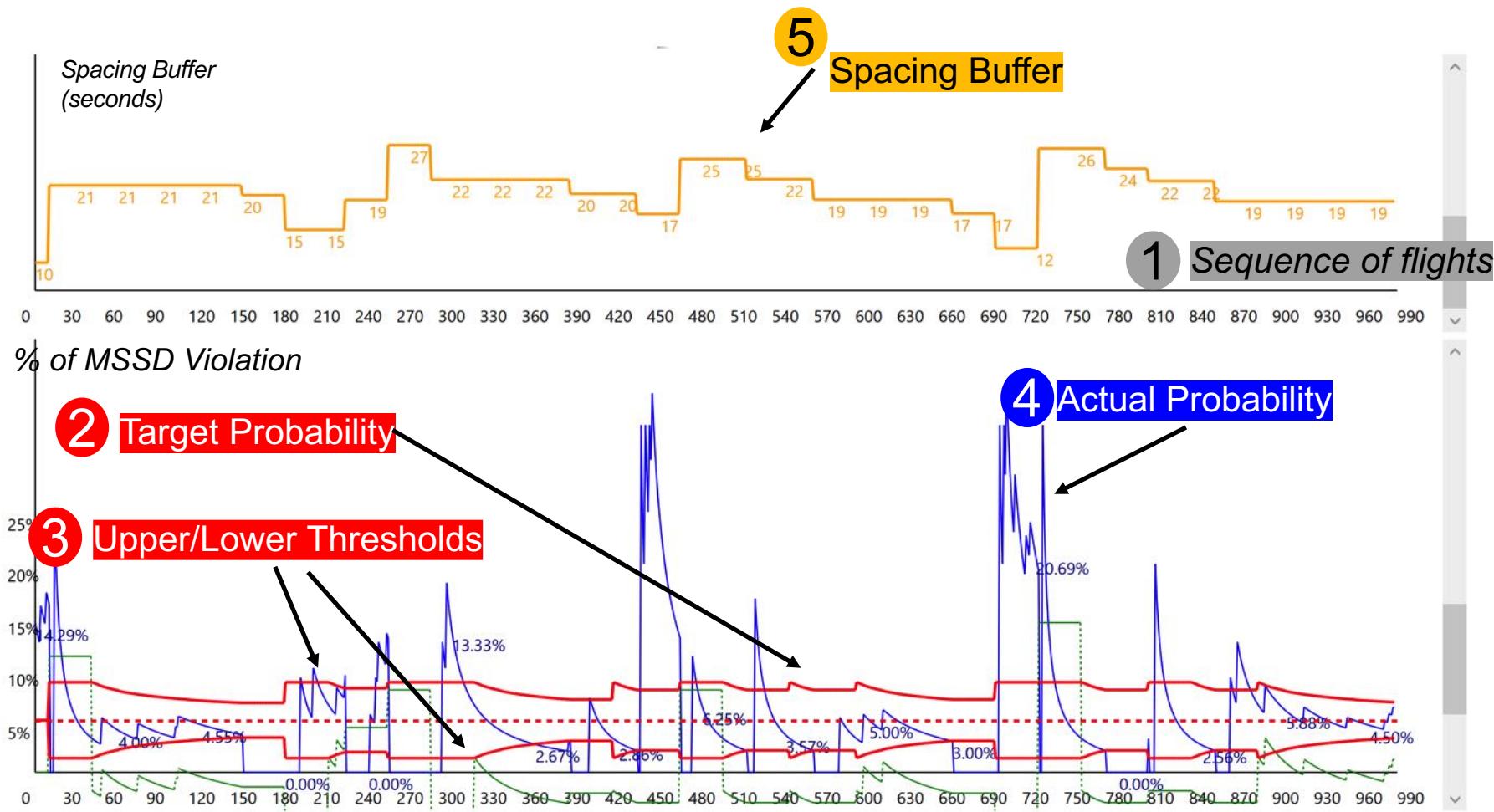
$$\text{Target Separation Distance} = \text{MSSD} + \text{Spacing Buffer}$$

(TSD)

- **Actual Probability** is the current probability of "hitting" an acceptable region:
 - *Actual Probability = # of flights that violated MSSD / Flight Counter*
- **Target Probability** is the desired TLS, set to 5%.
- **Upper/Lower Thresholds** approach Target Probability as number of flights increased:
 - *Upper / Lower Threshold = Target Probability +/- $(t_{1-\alpha} * (1 / \text{SQRT}(\# \text{ of flights}))$*



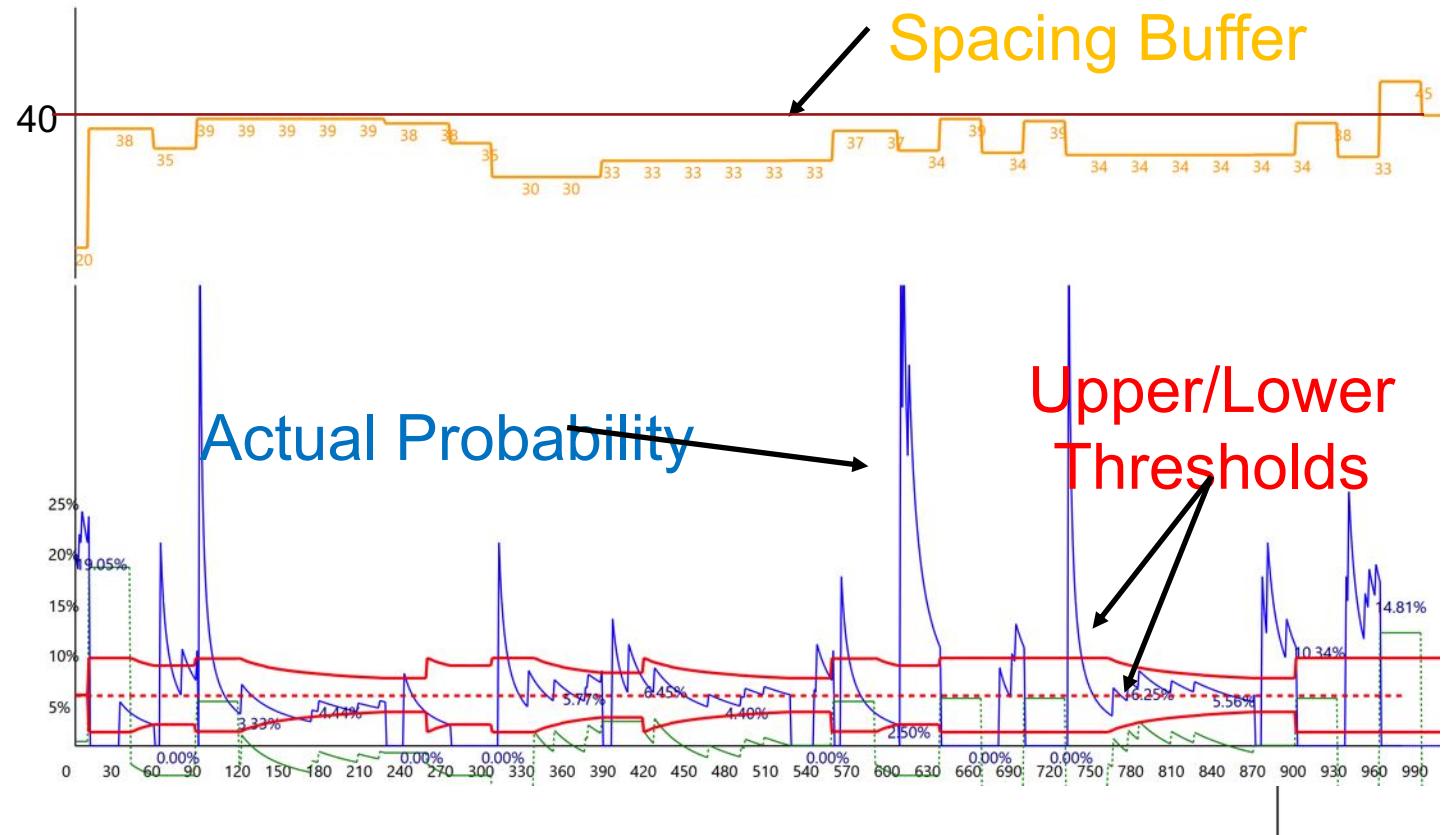
Autonomous Spacing Control



- Average Spacing Buffer = 20.16 seconds with standard deviation of 3.59 s
- Maximum Capacity Throughput = 32.6 flights per hour
- Actual Probability = 4.9% (<5% of Target Probability).



Automated Spacing Control



Input:

V = 120 knots

$$\sigma_{IV} = 10 \text{ knots}$$

Buffer = AALS

$$\sigma_{\text{SB}} = 10 \text{ s}$$

Output:

$$P = 4.72\%$$

Buffer = 37.55 s

$$\sigma_{\text{SB}} = 4.31 \text{ s}$$

Maximum Capacity Throughput

Average per hour = 28.22

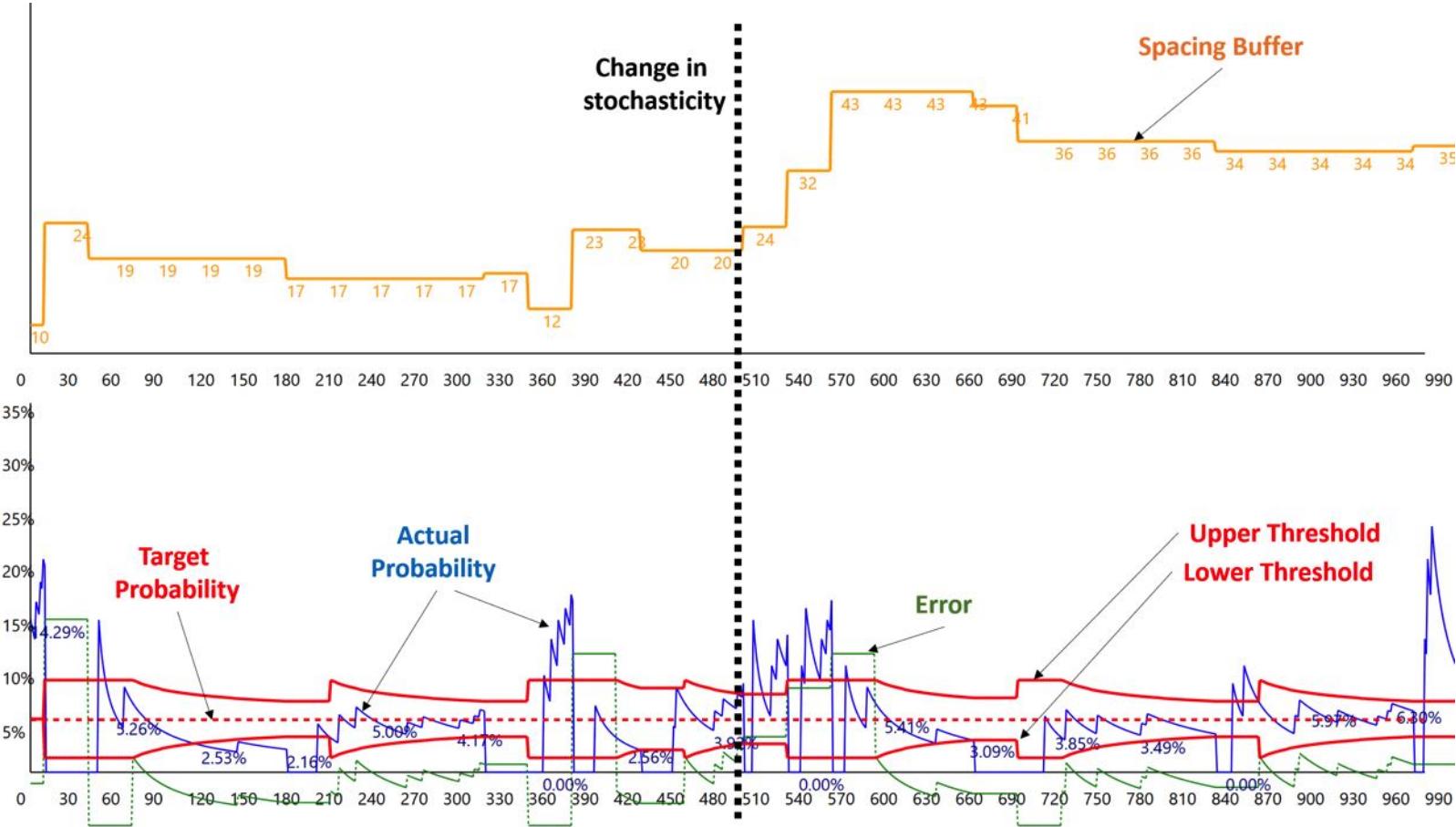


Configuration Design

High Approach Stochasticity $V = 120$ knots, $\sigma = 10$			Input		Output					
Run	Configuration	μ	σ	Inter-Arrival Time, Excess Spacing		Throughput		P (Left-tail)		
				μ	σ	μ	σ	μ	σ	
11	Self Sep (Ideal) with AALS	AALS	0	130.11	22.9	40	0	27.69	0.49	3.92%
12	Self-Sep with AALS	AASL	5	130.06	23.07	39.95	4.97	27.69	0.52	3.91%
13	RTA with AALS	AALS	10	130.25	24.57	40.01	9.99	27.67	0.62	6.1%
14	RTA/Self-Sep with AALS	AALS	10	128.37	23.41	38.19	4.41	28.07	1.05	4.76%



Automated Spacing Control (Adaptive)



Conclusions

- Stochastic simulation integrated into MBSE tools
 - Not a *seamless* process
- Provided necessary means to evaluate design trades



Inter-Arrival Time Distribution

