

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



**28<sup>th</sup>** Annual **INCOSE**  
international symposium

Washington, DC, USA  
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# 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

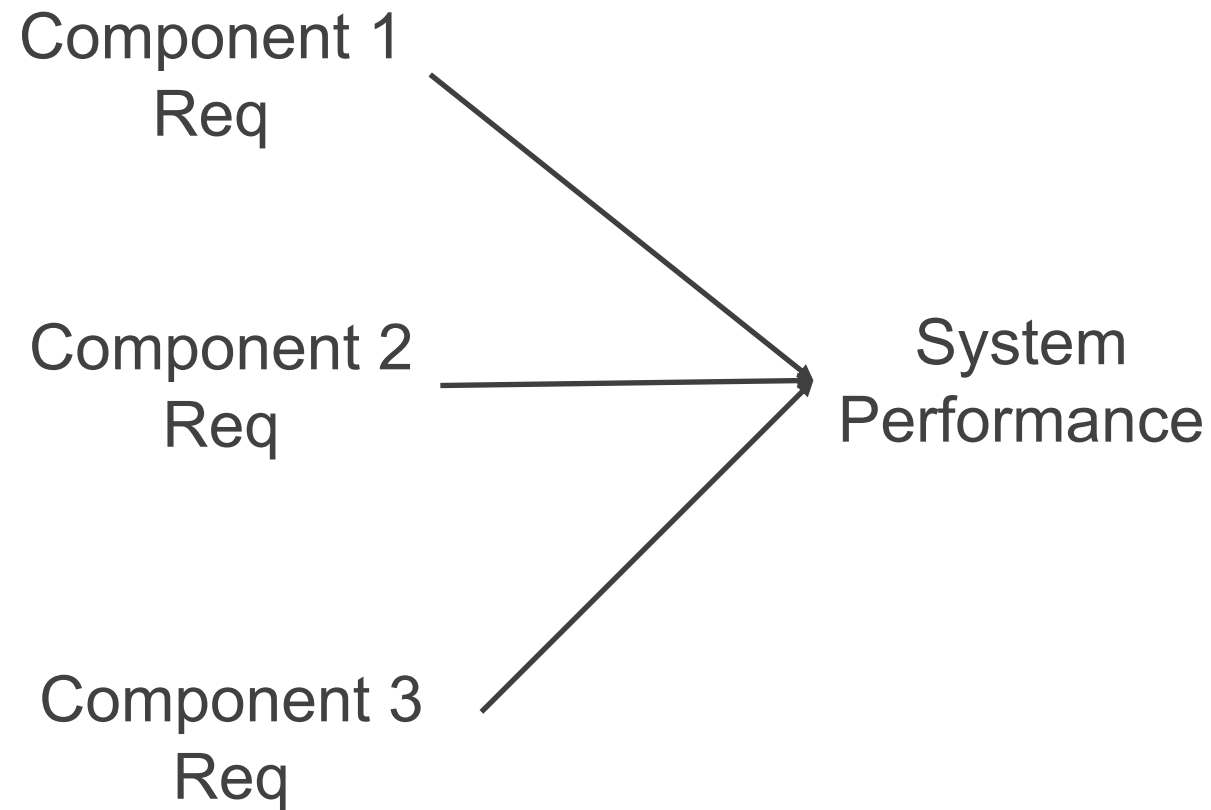
# Challenge #1: Discrete vs Stochastic Design-Space



- 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

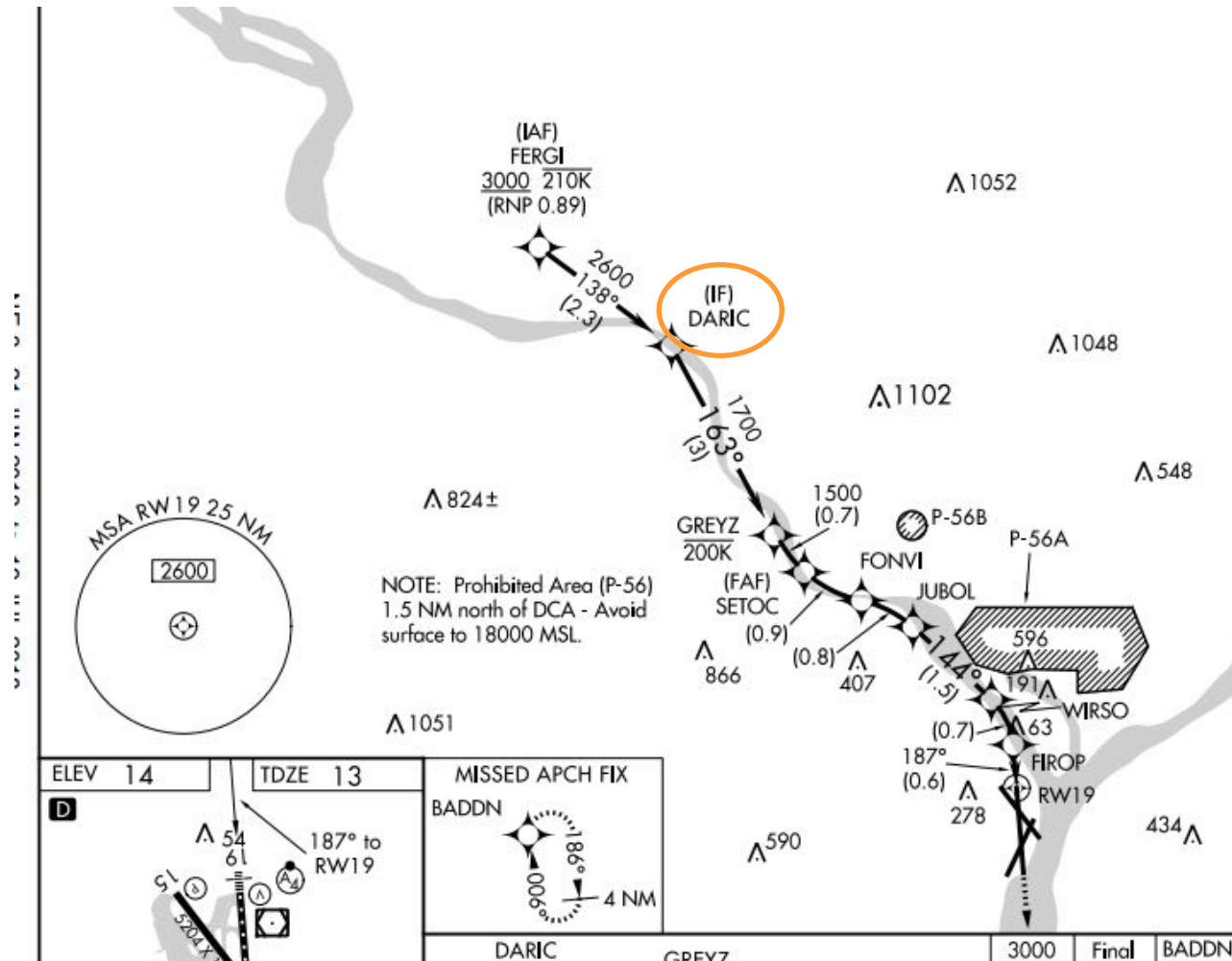
AL-443 (FAA)

18088

APP CRS <b>187°</b>	Rwy Idg <b>6869</b> TDZE <b>13</b> Apt Elev <b>14</b>	<b>RNAV (RNP) RWY 19</b> <b>RONALD REAGAN WASHINGTON NATIONAL (DCA)</b>			
<b>▼</b> 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.		<b>MALSF</b> 	<b>MISSED APPROACH:</b> Climb to 3000 on the final approach track to RW19 then direct BADDN and hold, continue climb-in-hold to 3000.		
D-ATIS <b>132.65</b>	POTOMAC APP CON <b>119.85 319.1</b> (WEST/SOUTH) <b>124.2 269.0</b> (EAST)	<b>WASHINGTON TOWER</b> <b>119.1 257.6</b>	<b>GND CON</b> <b>121.7 257.6</b>	<b>CLNC DEL</b> <b>128.25</b>	CPDLC

# Airport Approach and Landing - Procedure

Lateral trajectory  
Follows Potomac River

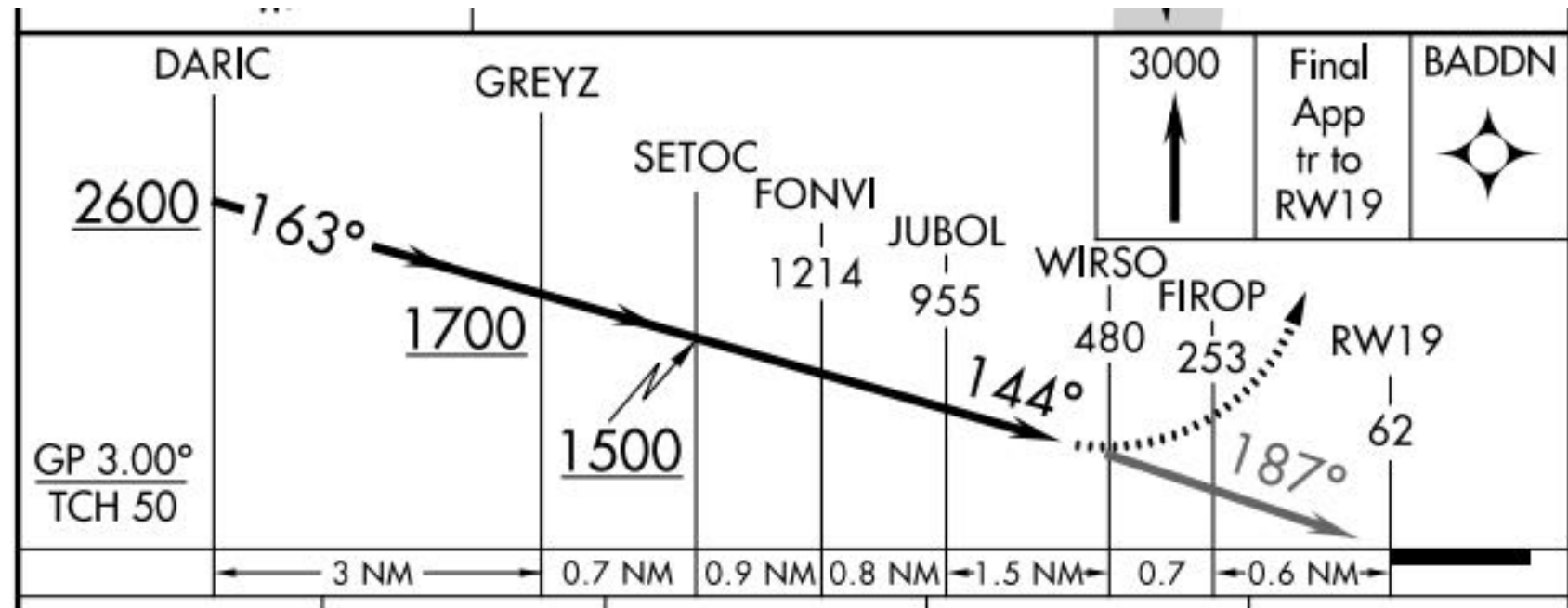




# Airport Approach and Landing - Procedure



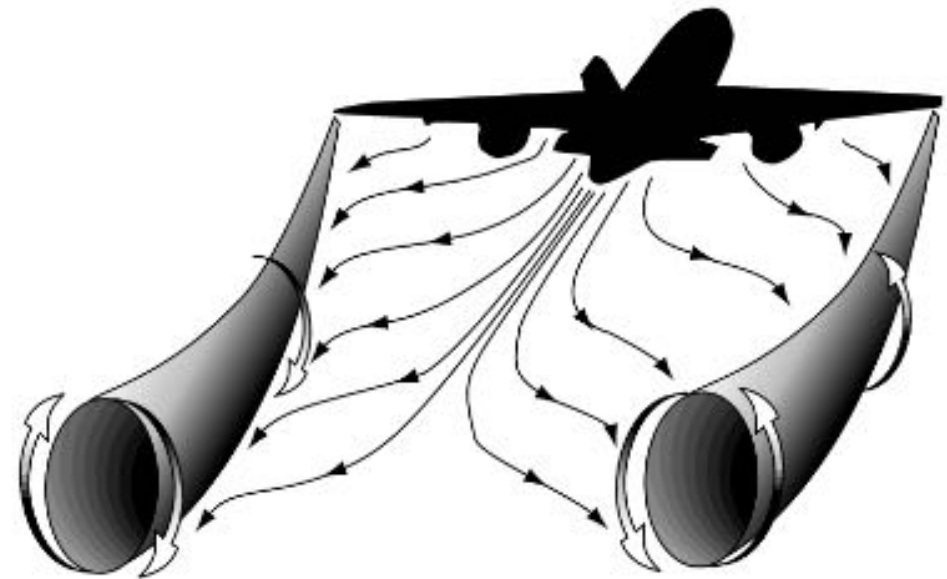
Vertical trajectory  
2600' to 13'  
Rate of descent





# 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)



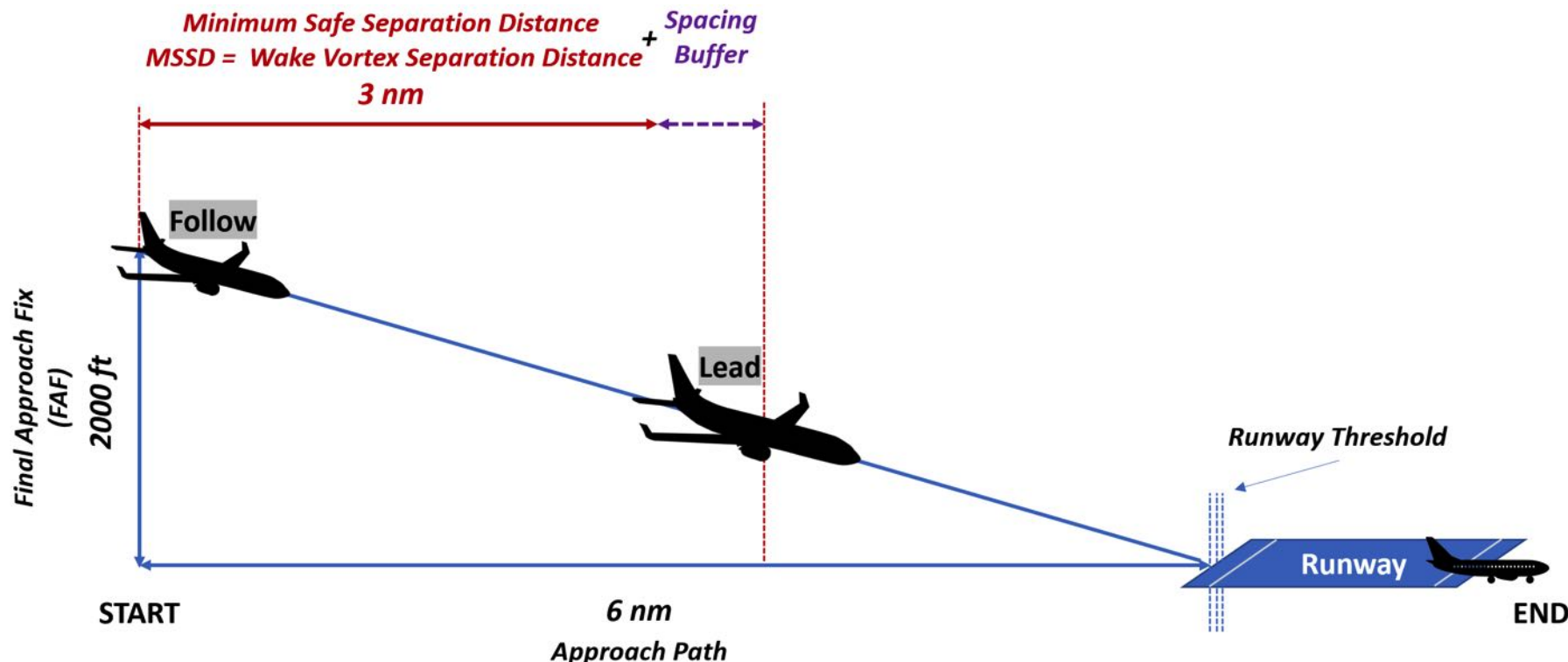
# Spacing is Candidate for Autonomy

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



# Approach & Landing Spacing

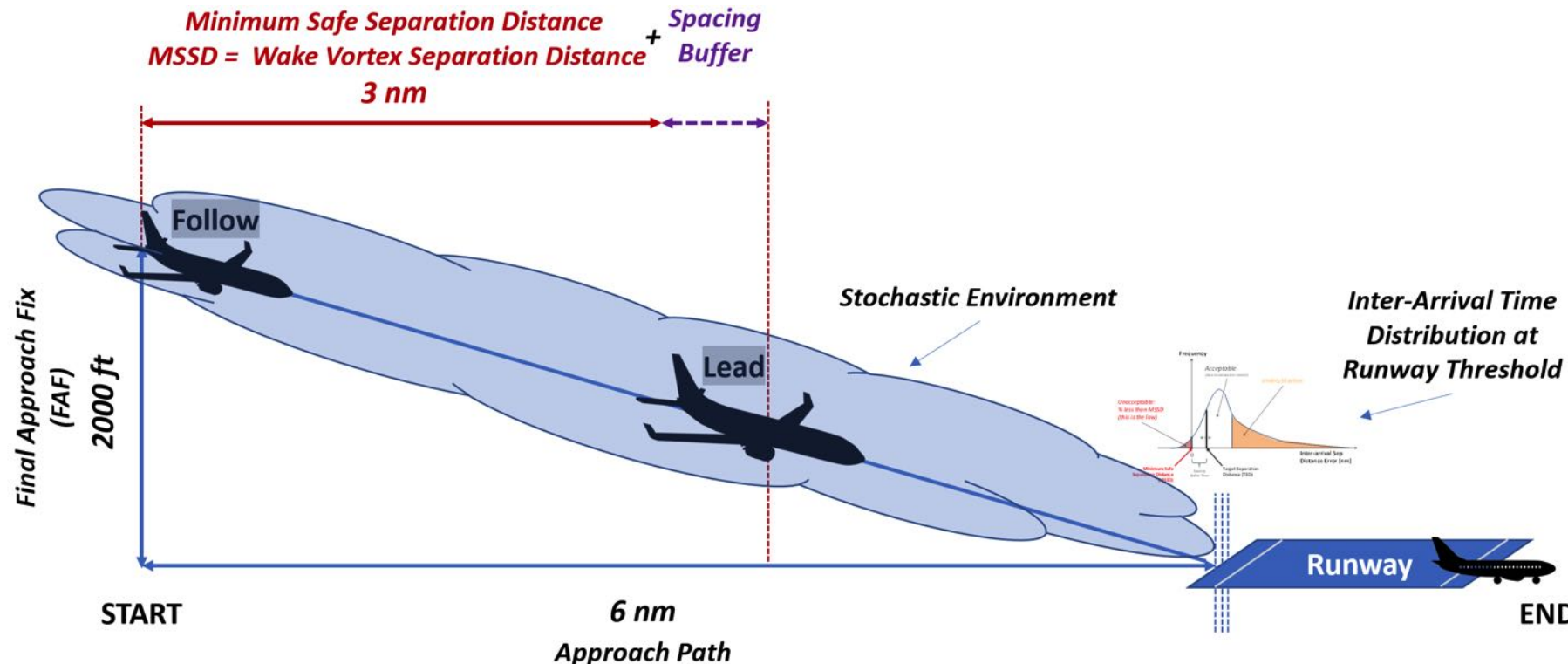
- Final approach segment and runway
- Flights must be sequenced and spaced before the Final Approach Fix (FAF)
  - 6nm from Runway Threshold, 2000' AGL
- Flights are at their lowest speed for the approach and landing phase



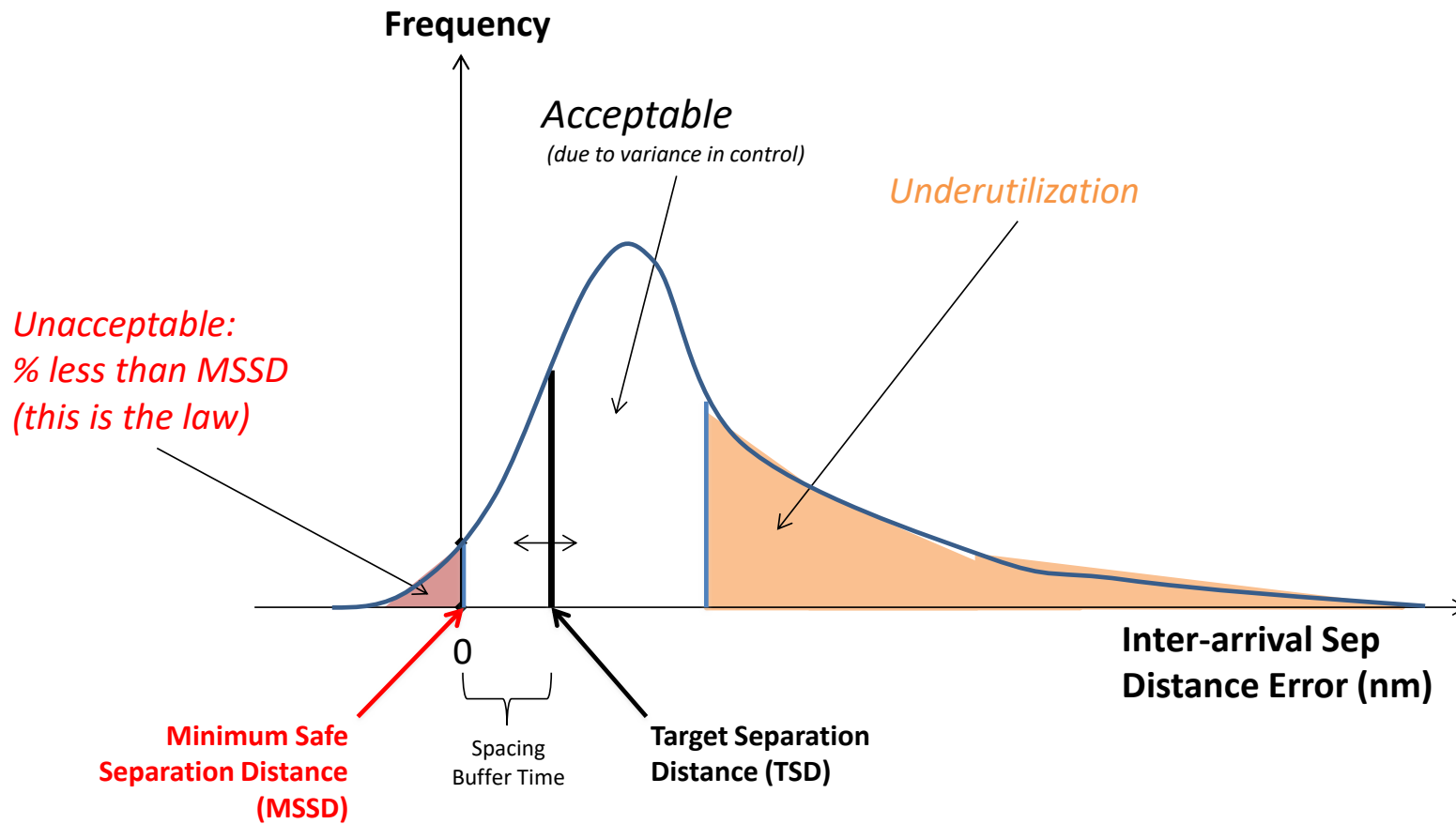


# Approach & Landing Spacing

- 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

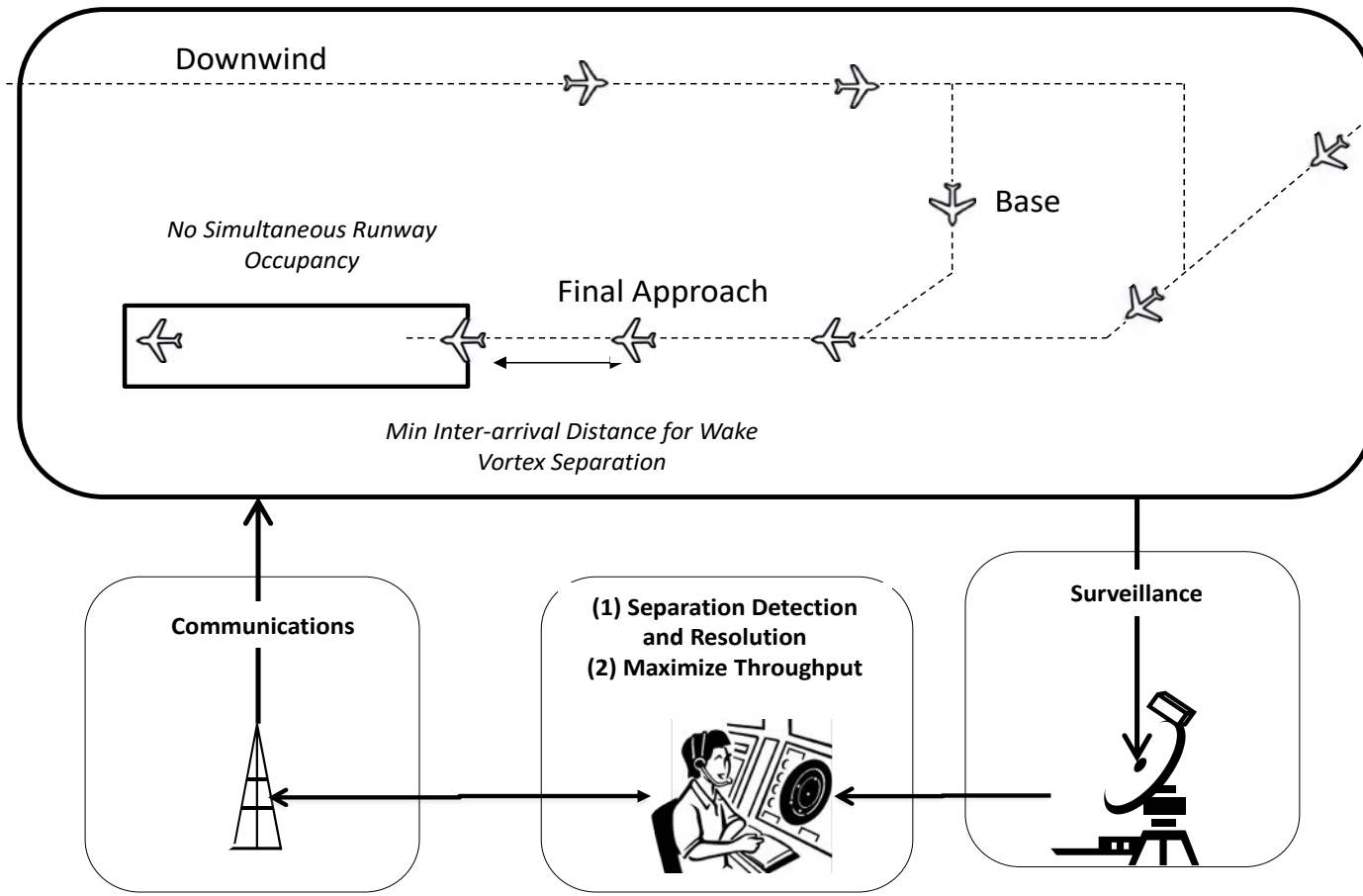


# Approach & Landing Spacing

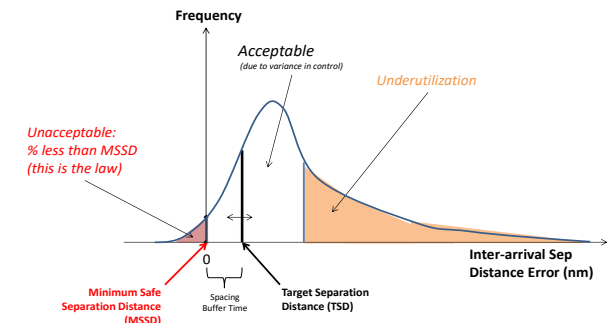


- The magnitude of the **left-tail** of the distribution determines **safety margins** of the approach process.
- The magnitude of the **right tail** of the distribution represents **gaps in the flow** and **reduced runway throughput**.

# As-Is Spacing for Approach and Landing

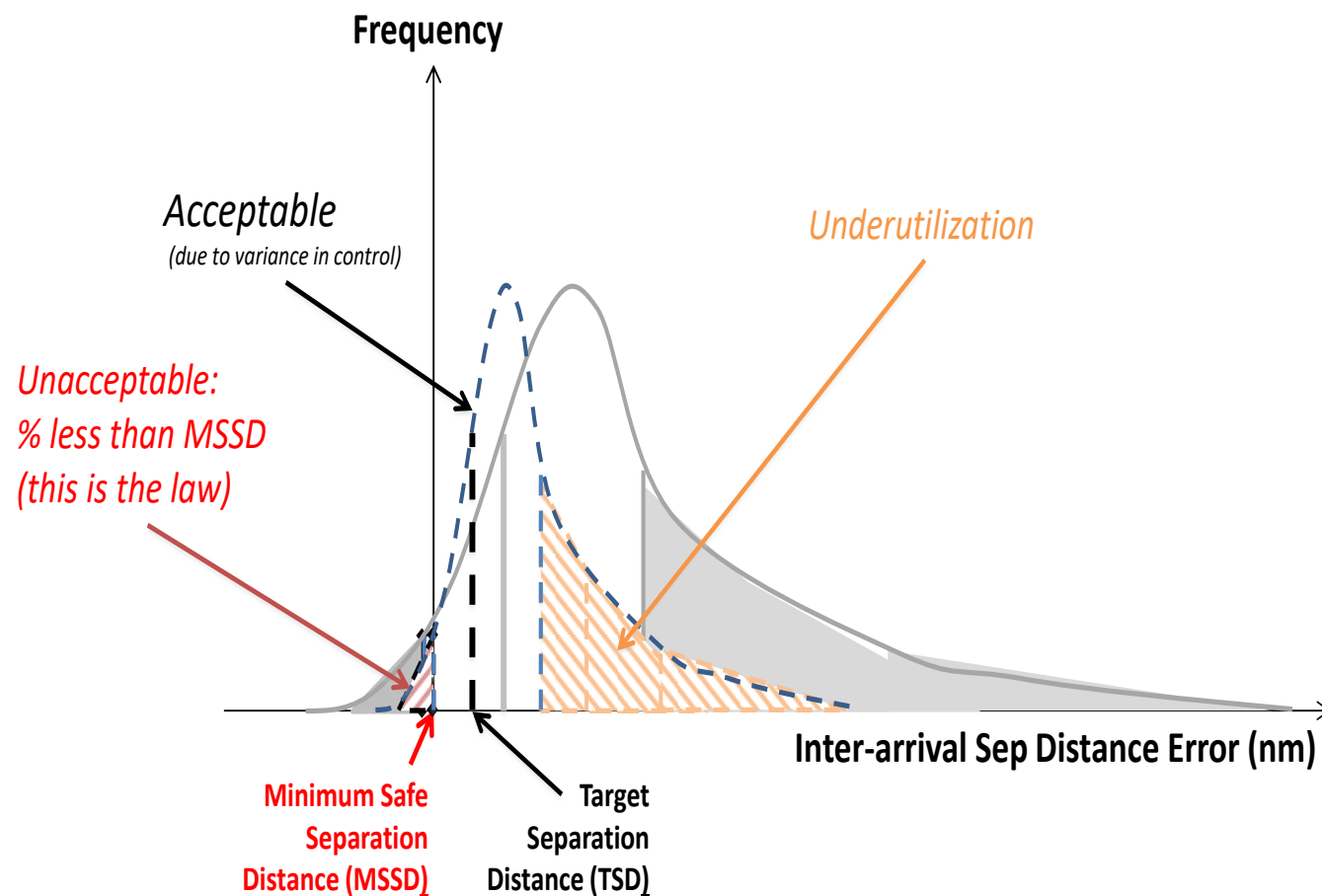


- Air Traffic Controller introduces Spacing Buffer (SB) by controlling the Target Separation Distance (TSD)
- Not supported by distribution





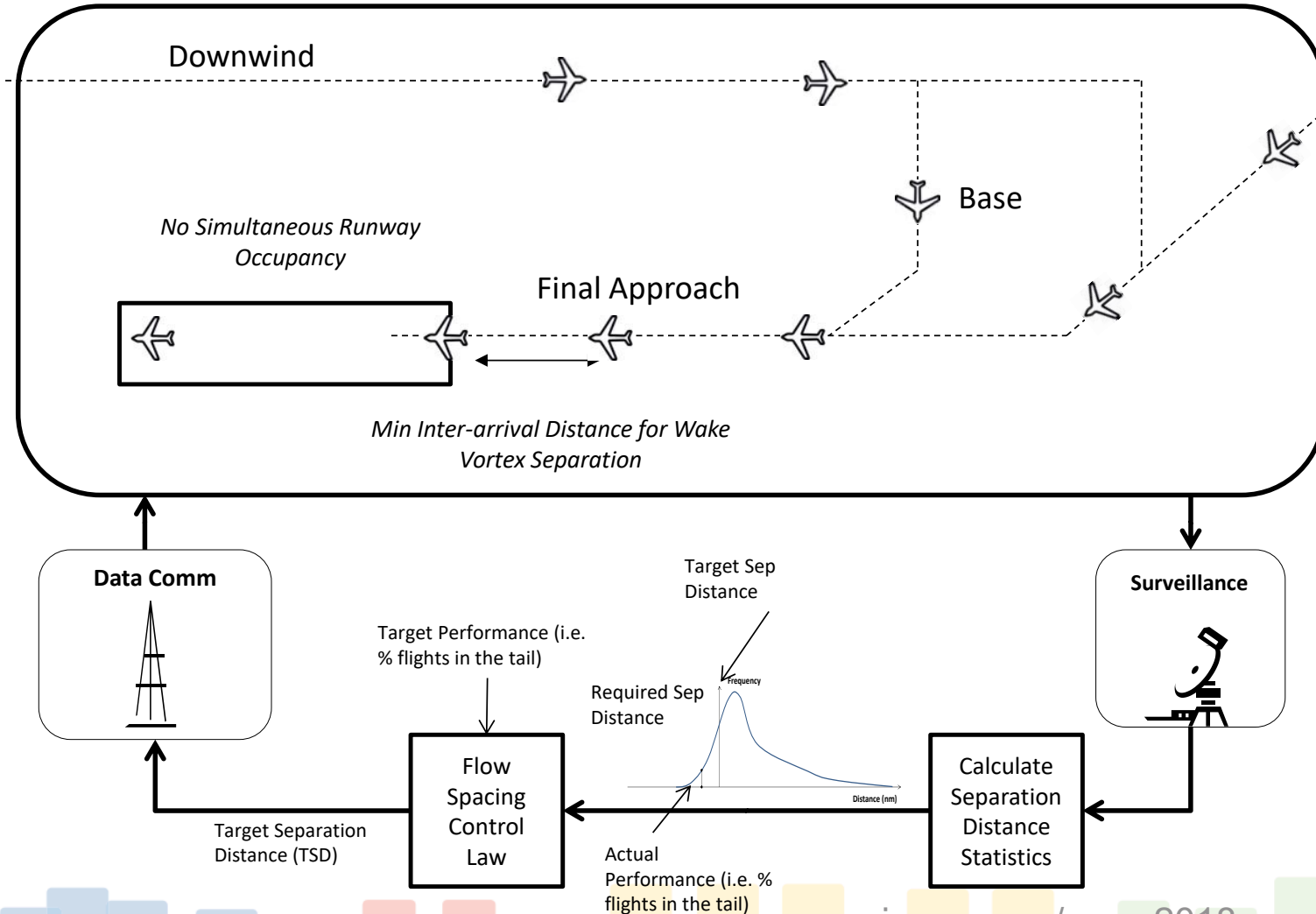
# Con-Ops & Reqs



- 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



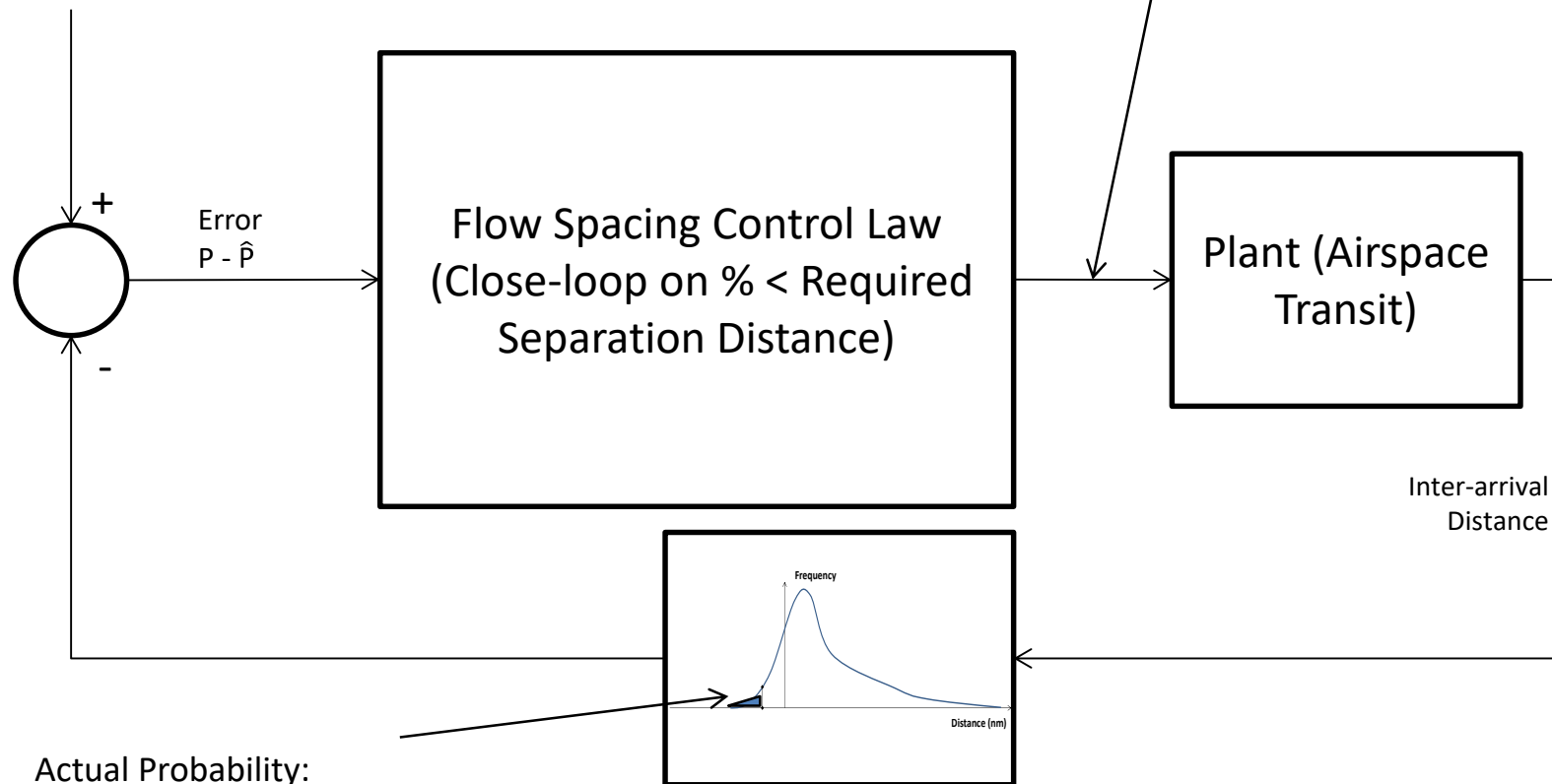
- Replace Air Traffic Controller with automation to perform *Flow Spacing Control*

# Con-Ops & Reqs



Target Performance:

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



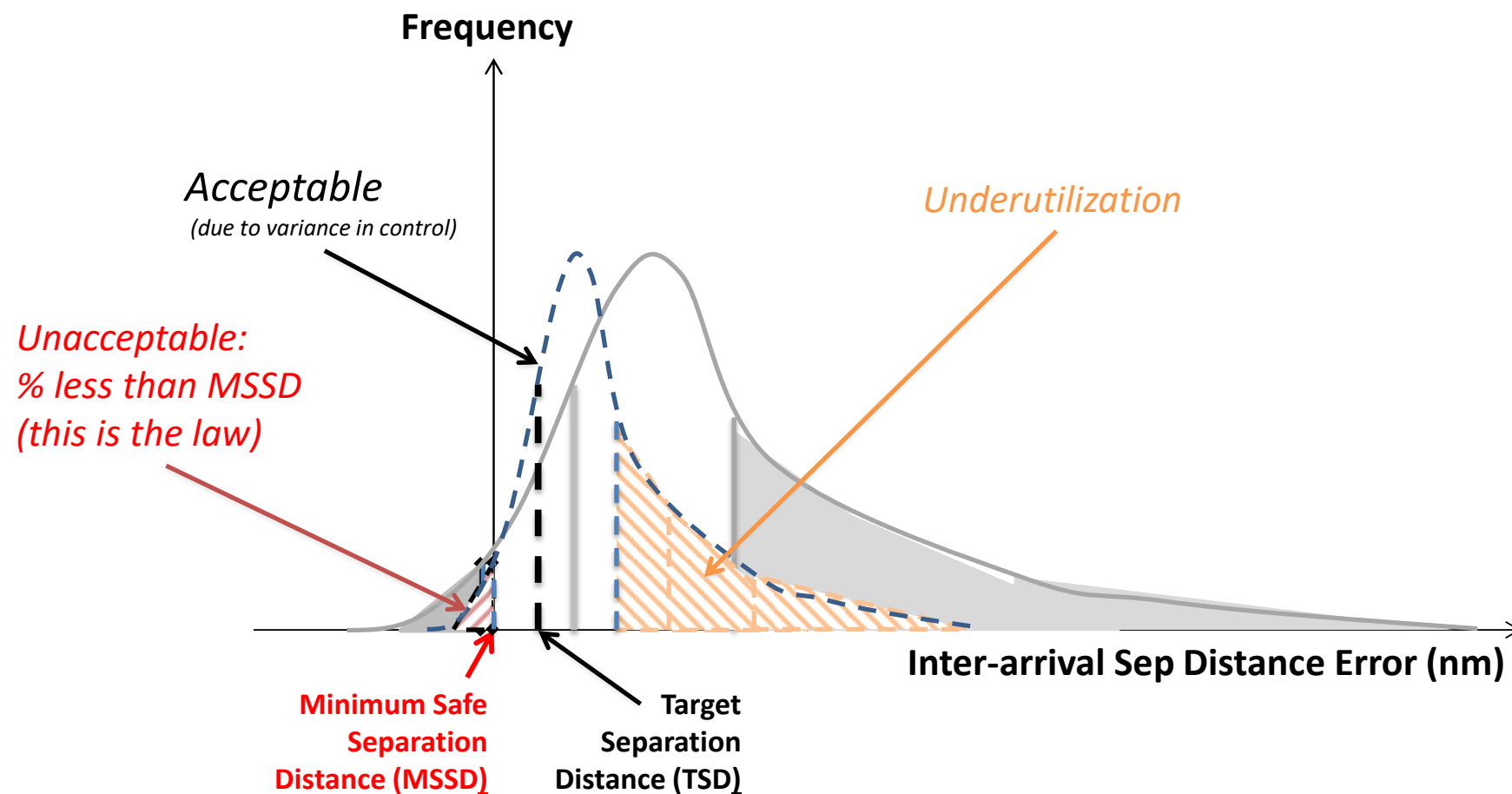
Actual Probability:

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

$$\text{Target Separation Distance} = \text{MSSD} + \text{Spacing Buffer} \quad (\text{TSD})$$

- 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 ( $\mu$  and  $\sigma$ )

Initial Spacing Buffer ( $\mu$  and  $\sigma$ )

Approach Path

FAF Altitude

MSSD

Target Probability

Sample Size

# of Flights

Autonomous  
Approach and Landing  
System  
(AALS)  
Simulation

Inter-Arrival Time Distribution

Actual Probability

Error

Target Separation Time

Spacing Buffer Time

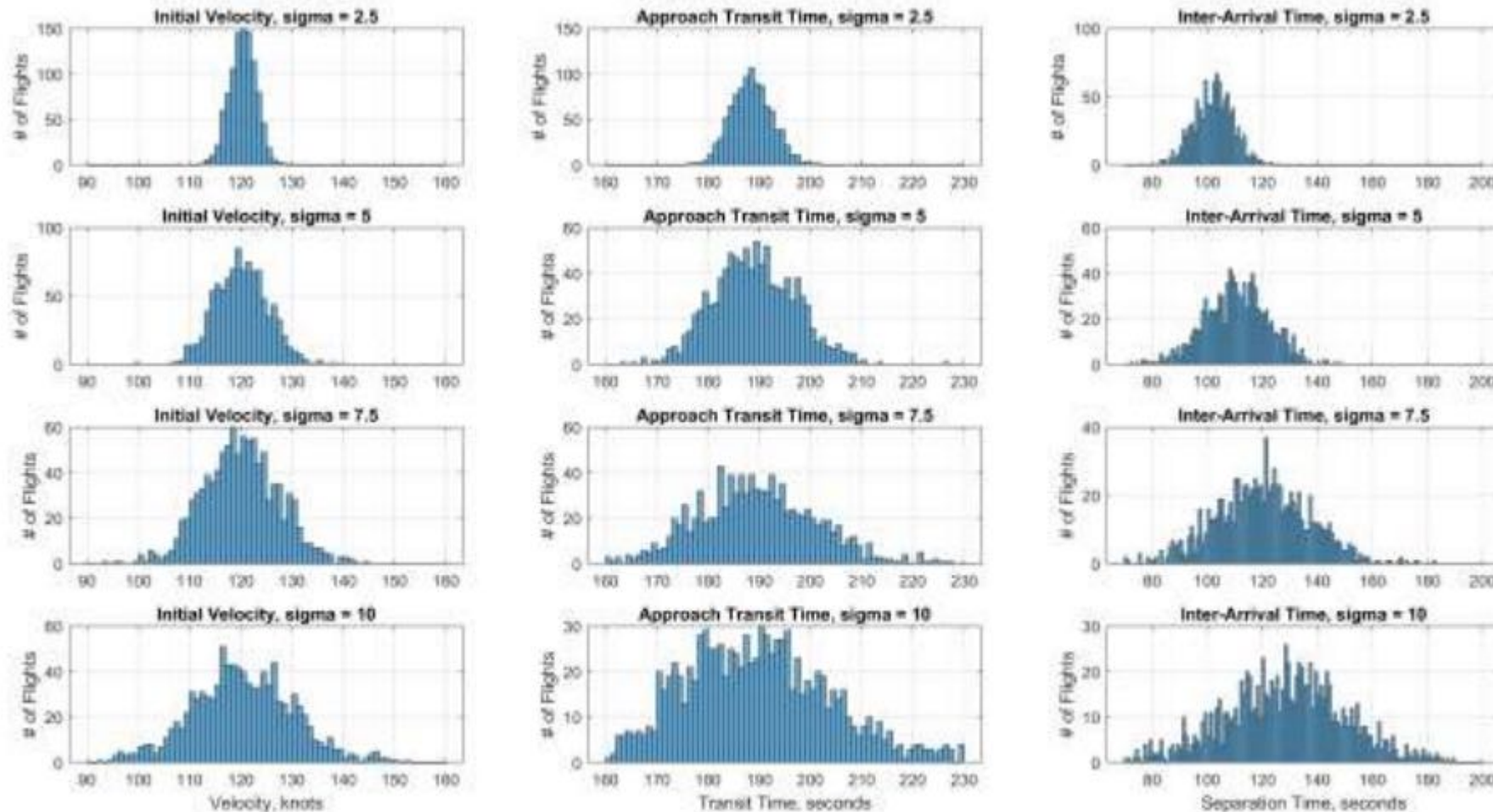
Maximum Capacity Throughput

# Approach and Landing Spacing Simulation



- **Initial Velocity Distribution** ( $\mu$  and  $\sigma$ )
  - Models stochasticity in final segment approach
- **Initial Spacing Buffer Distribution** ( $\mu$  and  $\sigma$ )
  - 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.

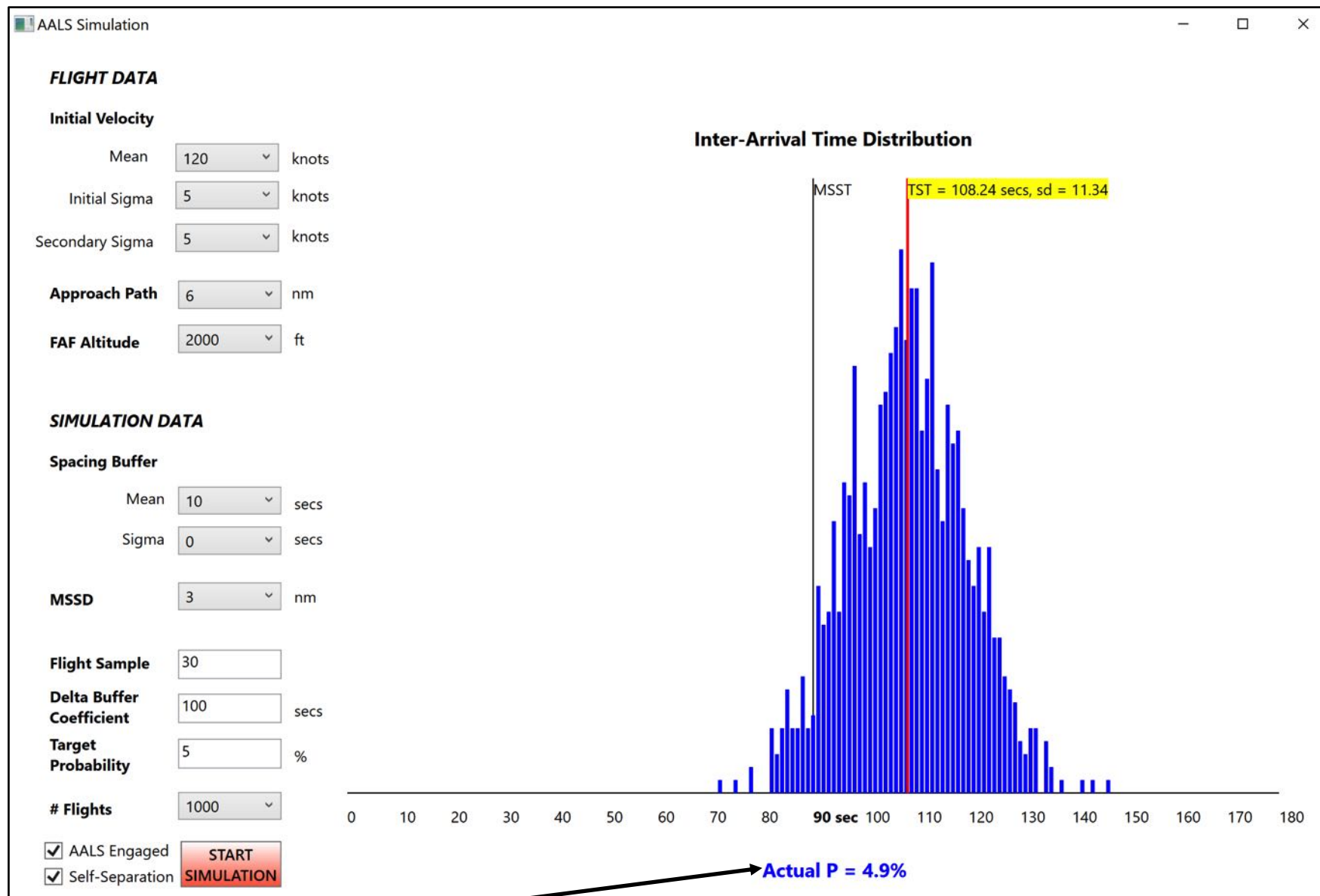
# Approach and Landing Spacing Simulation



Increasing Stochasticity during Approach



# Simulation GUI



Actual Probability after simulation





# Fixed Spacing at FAF (Baseline)

## Input:

$V = 120$  knots

$\sigma_{IV} = 10$  knots

Buffer = 10 s

$\sigma_{SB} = 0$

## Output:

**P = 30.5%**

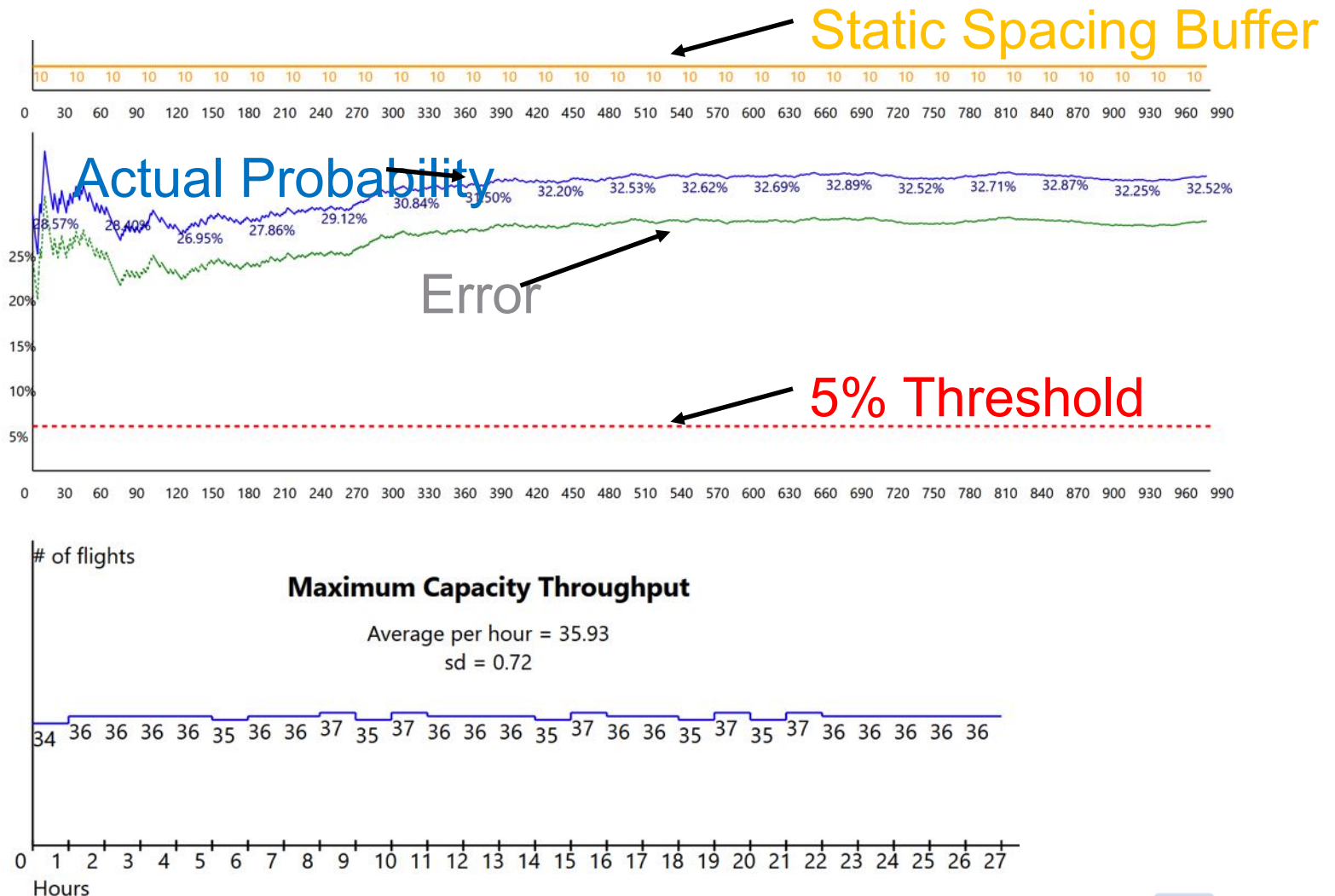
Buffer = 10 s

**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, $\sigma_{SB} = 10$ s)



## Input:

$V = 120$  knots

$\sigma_{IV} = 10$  knots

Buffer = 40 s

$\sigma_{SB} = 10$  s

## Output:

**P = 6.1%**

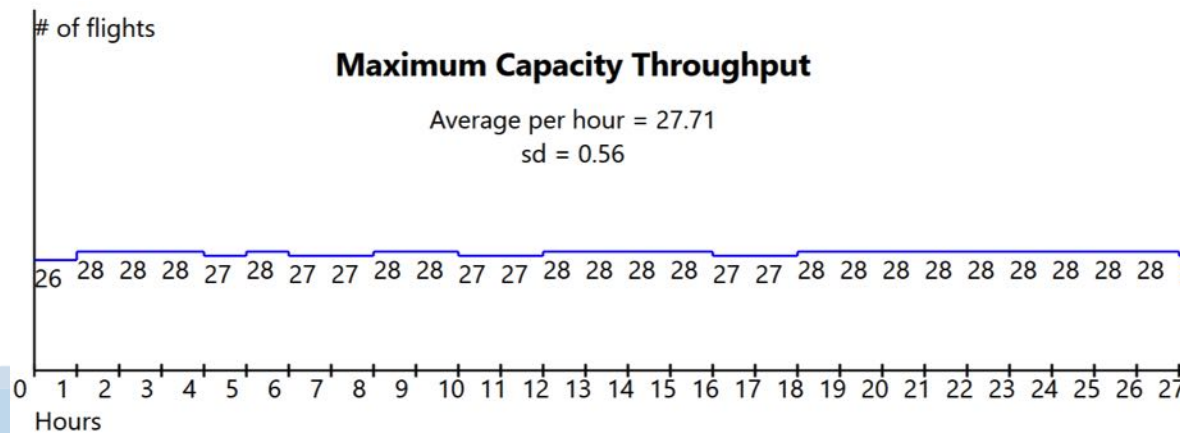
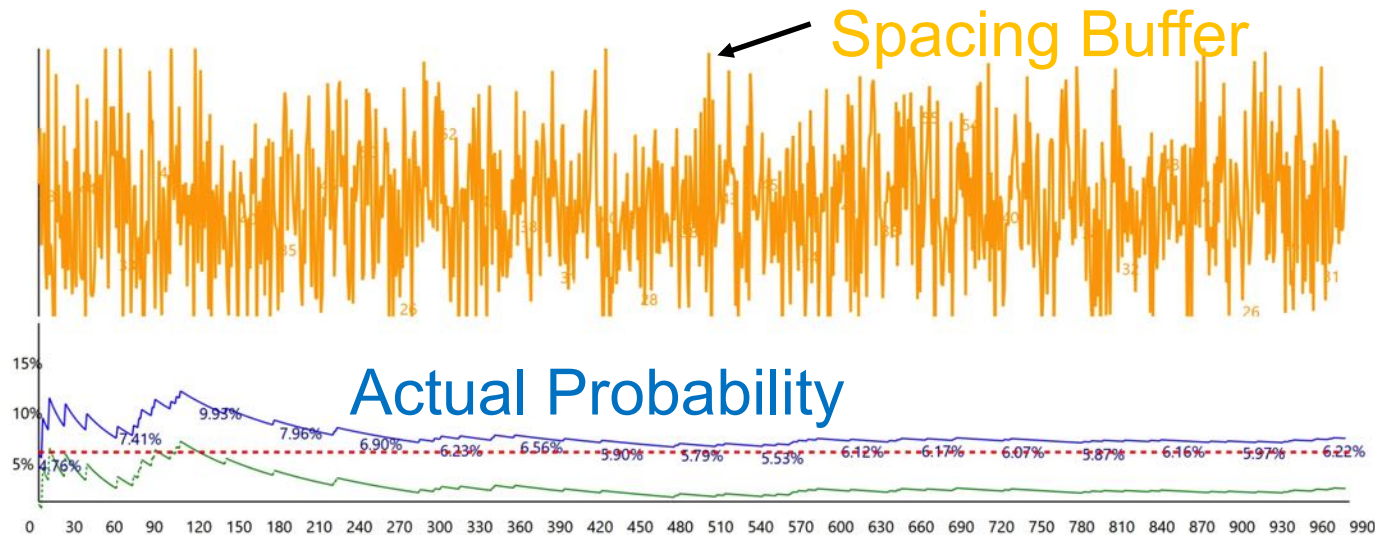
**Buffer = 39.99 s**

**$\sigma_{SB} = 9.75$  s**

**MCT = 28**

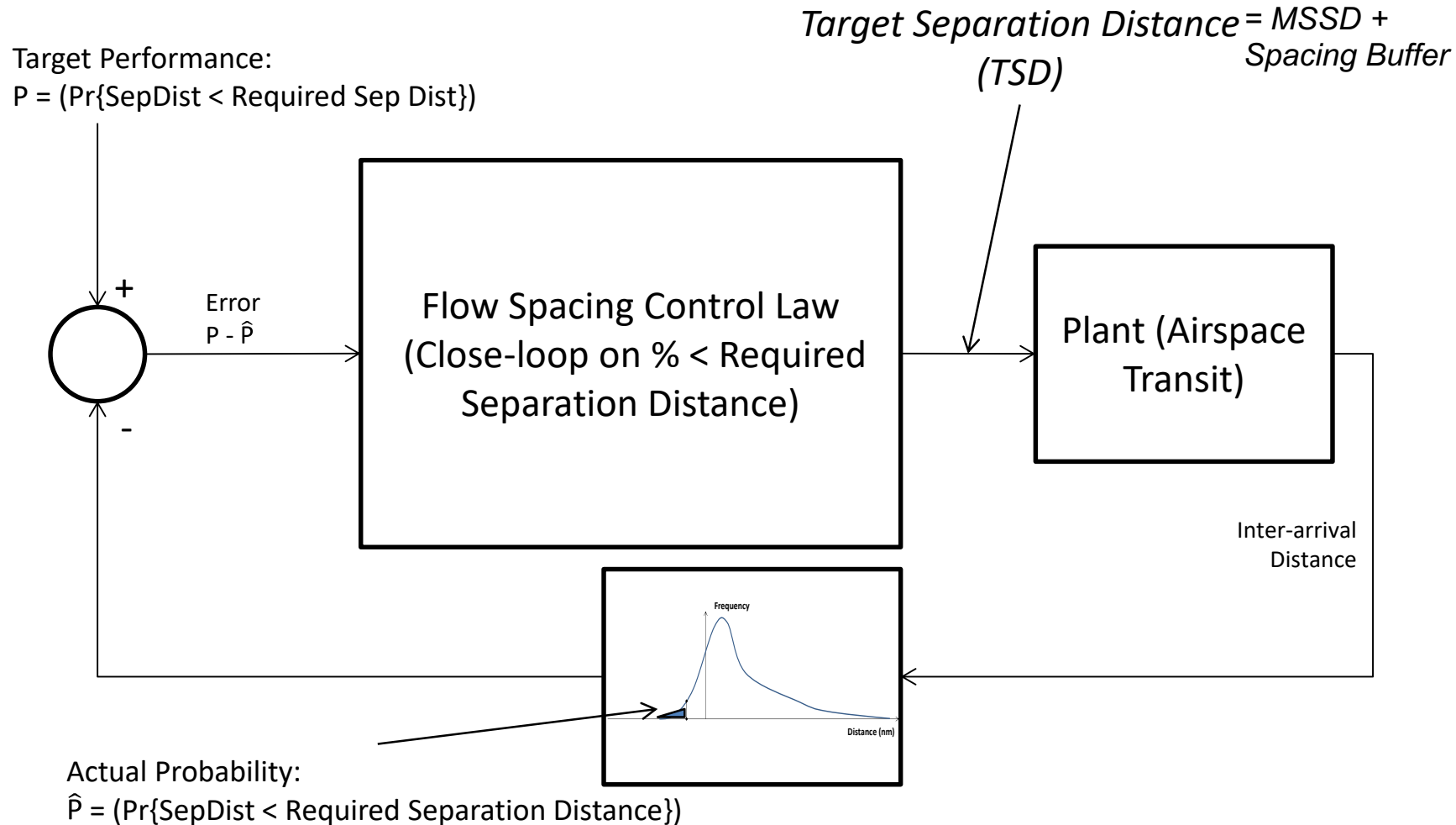
IAT = 129.75 s

$\sigma_{IAT} = 25.49$  s





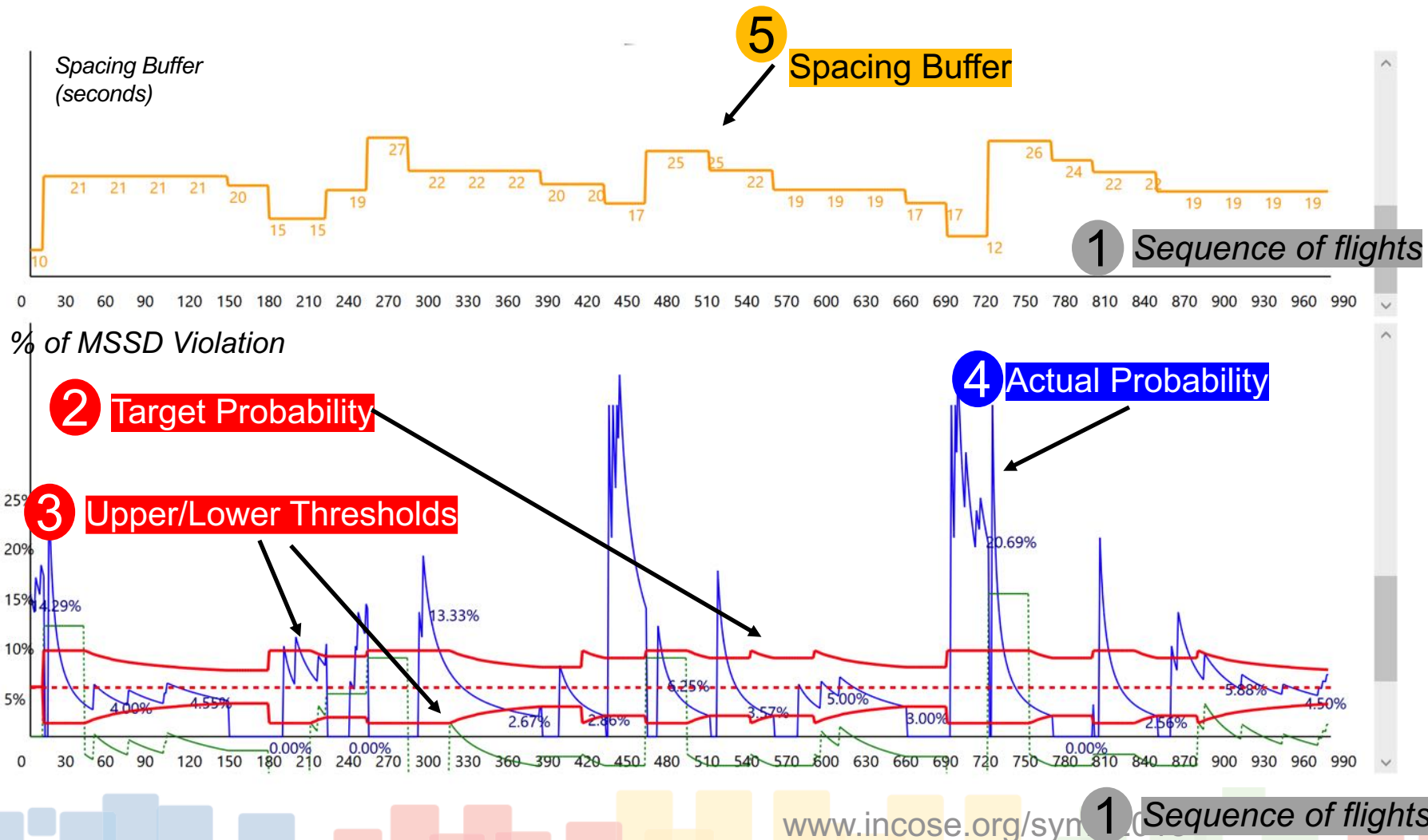
# Autonomous Spacing Control



- **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 +/-  $(t_{1-\alpha}^* (1 / \text{SQRT}(\# \text{ of flights})))$*



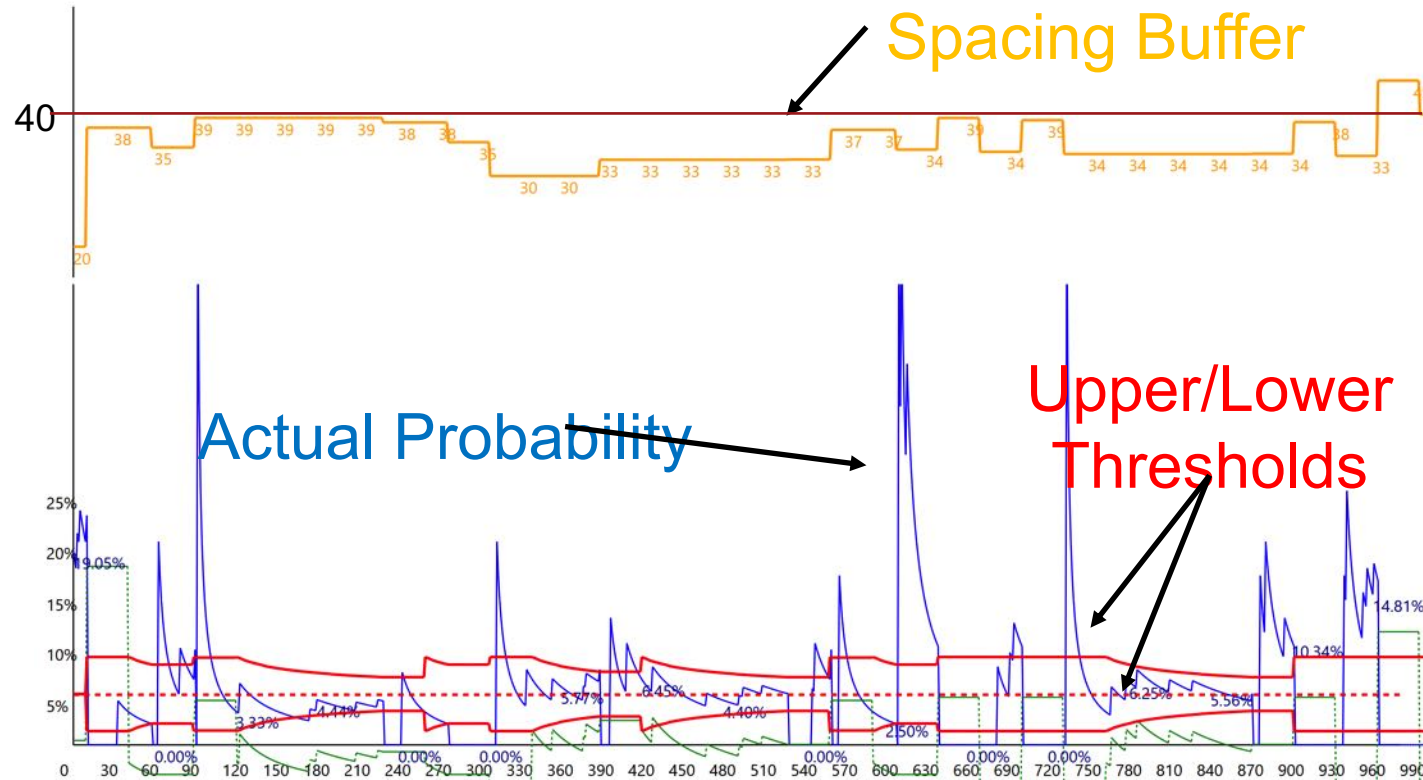
# Autonomous Spacing Control



- 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

$\sigma_{IV} = 10$  knots

Buffer = AALS

$\sigma_{SB} = 10$  s

## Output:

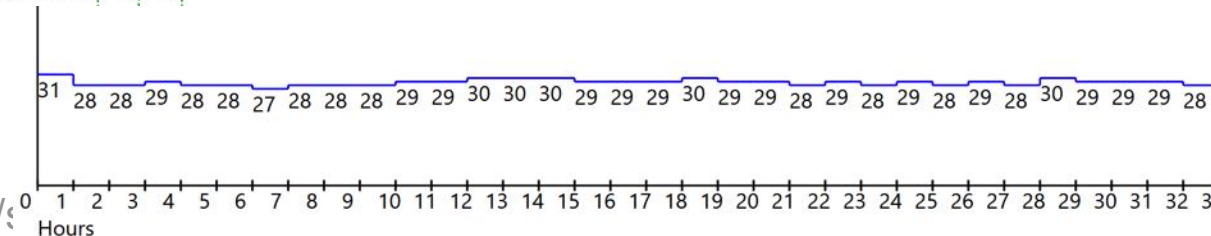
**$P = 4.72\%$**

**Buffer = 37.55 s**

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

## Maximum Capacity Throughput

Average per hour = 28.22





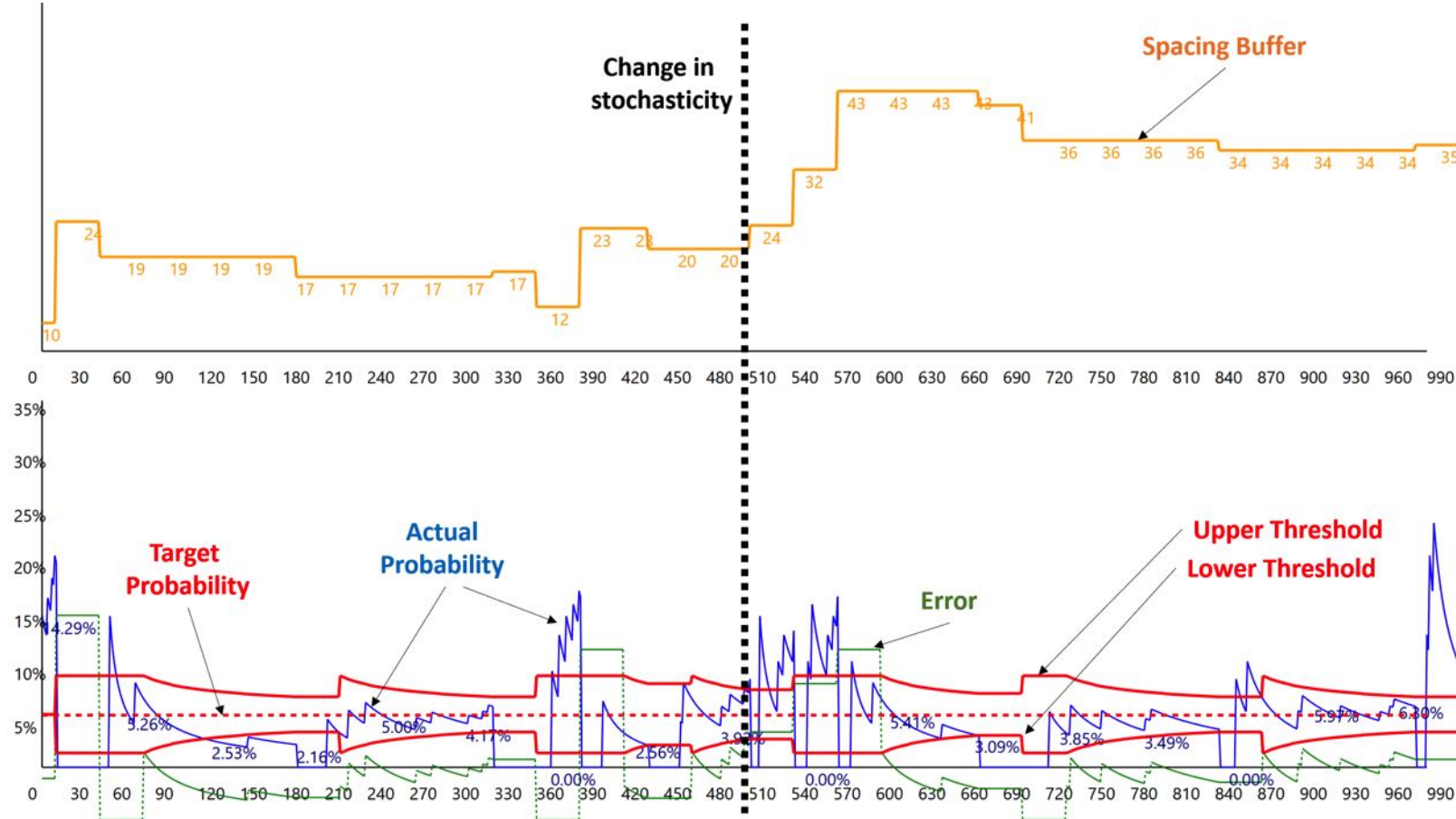


# Configuration Design

High Approach Stochasticity V = 120 knots, <u><math>\sigma = 10</math></u>		Input		Output						
		Spacing Buffer, secs		Inter-Arrival Time, secs		Excess Spacing Buffer, secs		Throughput		P (Left-tail)
Run	Configuration	$\mu$	$\sigma$	$\mu$	$\sigma$	$\mu$	$\sigma$	$\mu$	$\sigma$	
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

