



United States Department of Agriculture



Forecasting the Probability of Bird-Aircraft Collisions

U.S. Aviation Wildlife Management Conference, August, 5th, 2026

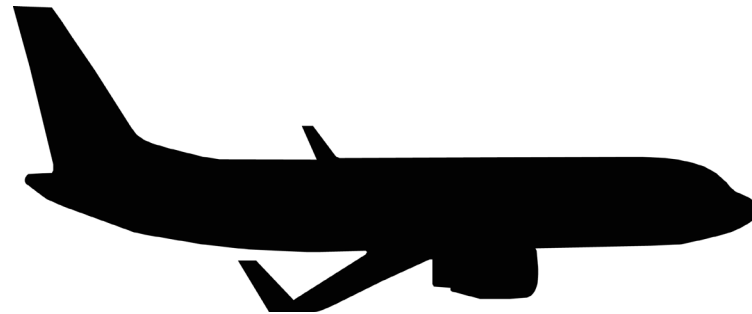
Ryan Lunn, Ph.D., Lauren Hoskovec, Ph.D., Professor
Dave Koons, Ph.D., Kim Pepin, Ph.D., Mike Begier



What is wildlife-aircraft strike risk?

What is wildlife-aircraft strike risk?

- Relative Hazard Scores
- Collision Frequency
- Total Cost of Damage
- Operational Delays
- Closest Approach Point



What is wildlife-aircraft strike risk?

Defining wildlife-aircraft strike risk as an expected value:

$$E(X) = \sum x_i P(x_i)$$

x_i = Measure of Damage (e.g., Direct & Indirect Cost)

$P(x_i)$ = Probability of Damage Occurring

Defining risk as an expected value

$$E(X) = \sum x_i P(x_i)$$

For example: Should you go to the park based on the weather forecast?

x_i = A Rain Shower

$P(x_i)$ = 25%



Defining risk as an expected value

$$E(X) = \sum x_i P(x_i)$$

For example: Should you go to the park based on the weather forecast?

x_i = A Tornado Alert

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What is wildlife-aircraft strike risk?

$$E(X) = \sum x_i P(x_i)$$

x_i = Sum of all direct and indirect financial costs

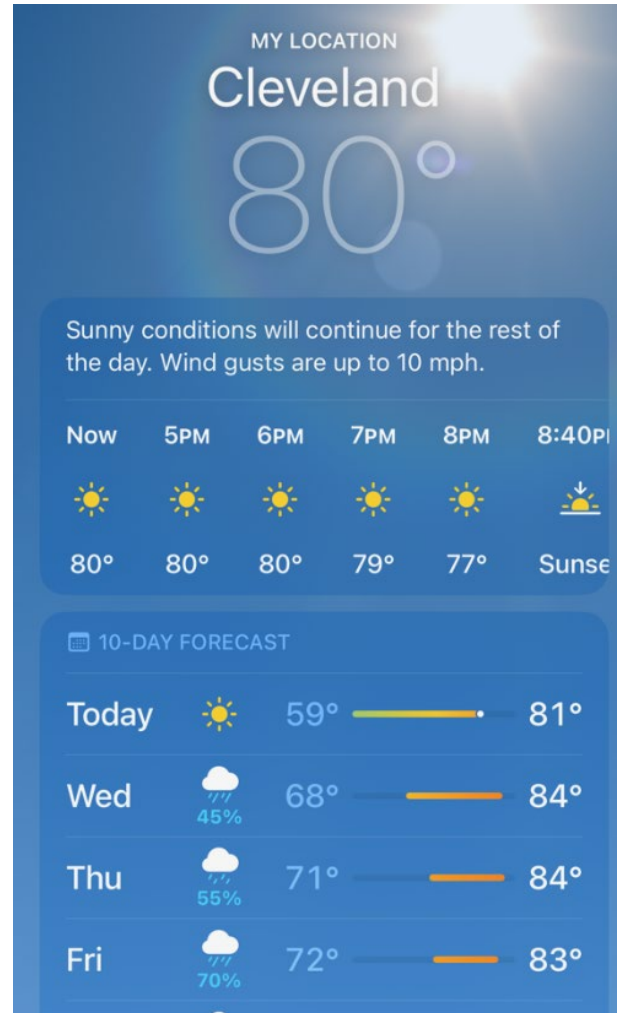
What is wildlife-aircraft strike risk?

$$E(X) = \sum x_i P(x_i)$$

x_i = Sum of all direct and indirect financial costs

$$P(x_i) = ?$$

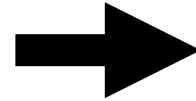
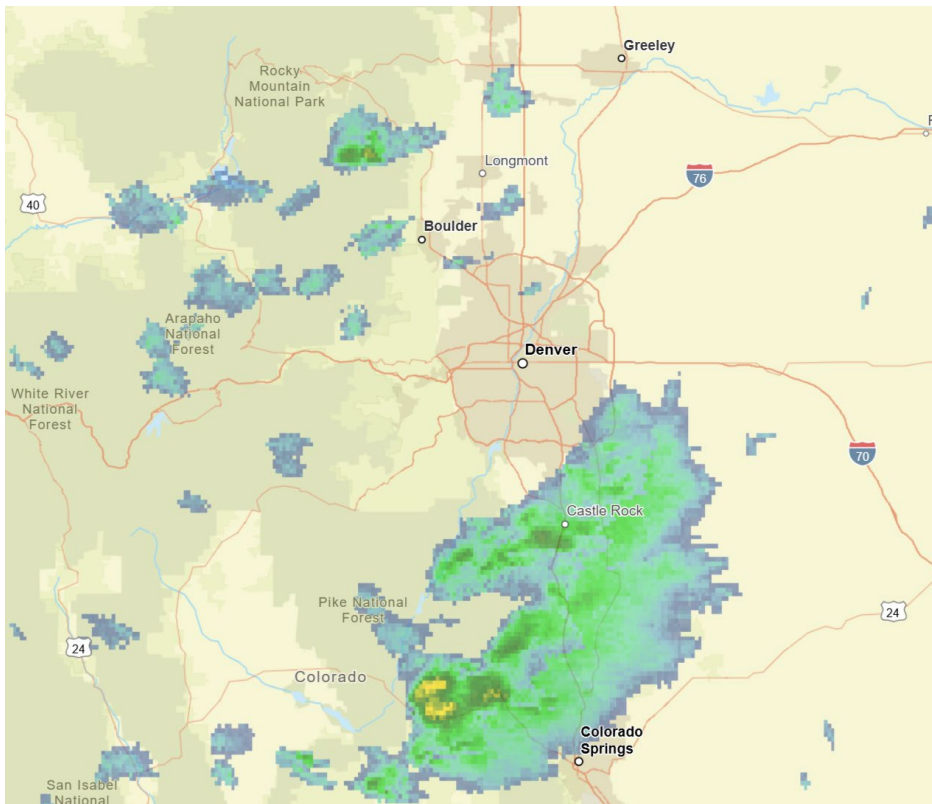
What is the probability of rain at 6:00p?



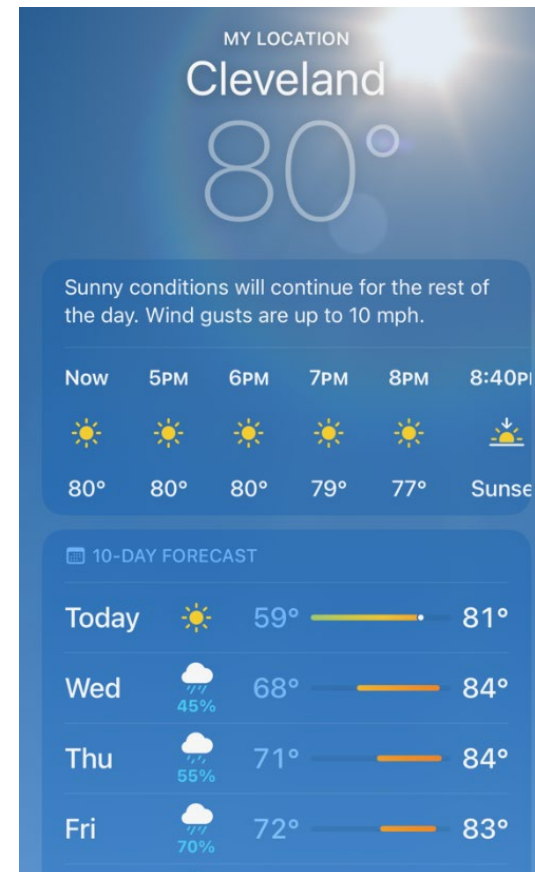
Forecast

What is the probability of rain at 6:00p?

Radar

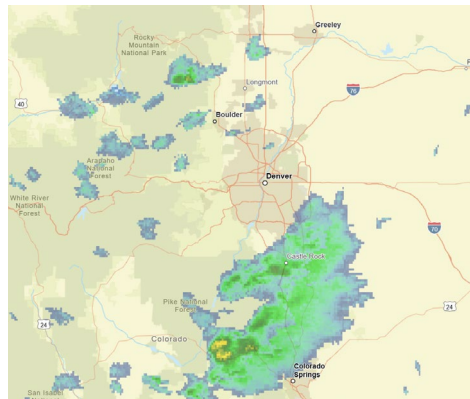


Forecast



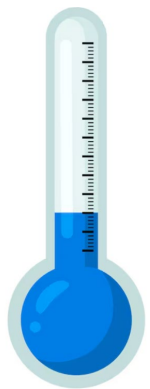
What is the probability of rain at 6:00p?

Radar



+

Data



&

Modelling

Hydrostatic Eq.

$$\frac{\Delta P}{\Delta z} = -\rho |g|$$

Radar Eq.

$$dBZ = 10 \left[\log \left(\frac{P_R}{P_T} \right) + 2 \log \left(\frac{R}{R_1} \right) - 2 \log \left(\frac{K}{K_1} \right) - \log(b) \right]$$

Frontogenesis (kinematic)

$$\text{Frontal Strength} = FS = \frac{\Delta \theta}{\Delta x}$$

$$\frac{\Delta(FS)}{\Delta t} = - \left(\frac{\Delta \theta}{\Delta x} \right) \left(\frac{\Delta U}{\Delta x} \right) - \left(\frac{\Delta \theta}{\Delta y} \right) \left(\frac{\Delta V}{\Delta x} \right) - \left(\frac{\Delta \theta}{\Delta z} \right) \left(\frac{\Delta W}{\Delta x} \right)$$

Strengthening Confluence Shear Tilting

Omega Eq. (Trenberth)

$$W_{mid} \equiv -2 \cdot \frac{\Delta z}{f_c} \left[U_{TH} \frac{\Delta \bar{\kappa}_g}{\Delta x} + V_{TH} \frac{\Delta \bar{\kappa}_g}{\Delta y} + V_{TH} \frac{\beta}{2} \right]$$

Thermo. 1st Law

$$\frac{\Delta T}{\Delta t} \Big|_{x,y,z} = - \left[U \cdot \frac{\Delta T}{\Delta x} + V \cdot \frac{\Delta T}{\Delta y} \right] - 0.1 \frac{K}{h}$$

advection radiation

$$- \frac{\Delta F_{turb}(\theta)}{\Delta z} + \frac{L_v}{C_p} \cdot \frac{\Delta m_{condensing}}{m_{air} \cdot \Delta t}$$

turbulence latent heat

Thermal Wind Relationship

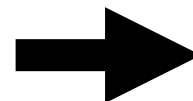
$$\frac{\Delta U_g}{\Delta z} = \frac{-|g|}{T_v \cdot f_c} \cdot \frac{\Delta T_v}{\Delta y}$$

$$\frac{\Delta V_g}{\Delta z} = \frac{|g|}{T_v \cdot f_c} \cdot \frac{\Delta T_v}{\Delta x}$$

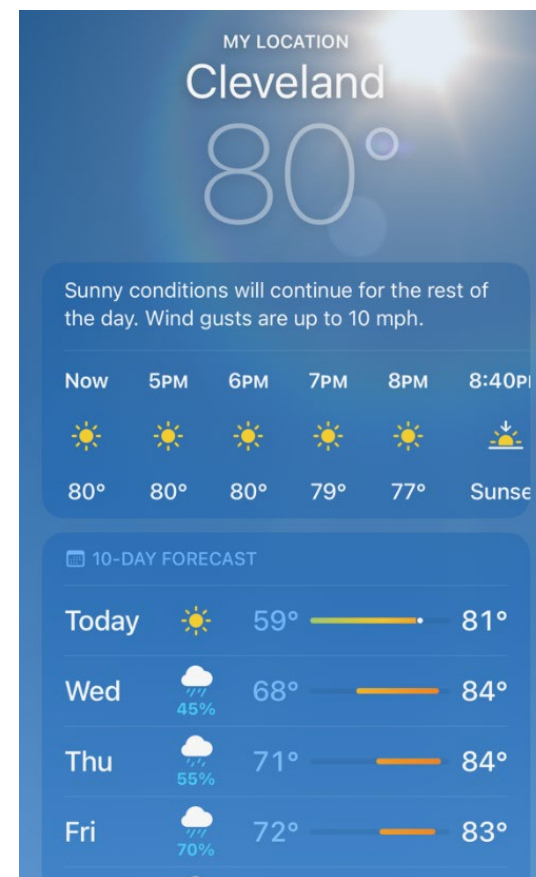
Q vectors

$$Q_x = -\frac{\Re}{P} \left[\left(\frac{\Delta U_g}{\Delta x} \cdot \frac{\Delta T}{\Delta x} \right) + \left(\frac{\Delta V_g}{\Delta x} \cdot \frac{\Delta T}{\Delta y} \right) \right]$$

$$Q_y = -\frac{\Re}{P} \left[\left(\frac{\Delta U_g}{\Delta y} \cdot \frac{\Delta T}{\Delta x} \right) + \left(\frac{\Delta V_g}{\Delta y} \cdot \frac{\Delta T}{\Delta y} \right) \right]$$



Forecast



What is the probability of wildlife aircraft damage?

Radar

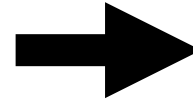


+

Data

Modelling

?



Forecast



The Goal:

- 1. Establish the methodology for modelling the probability wildlife-aircraft damage**
- 2. Identify and validate the data sources that exist that can inform estimates of the probability of wildlife-aircraft damage**

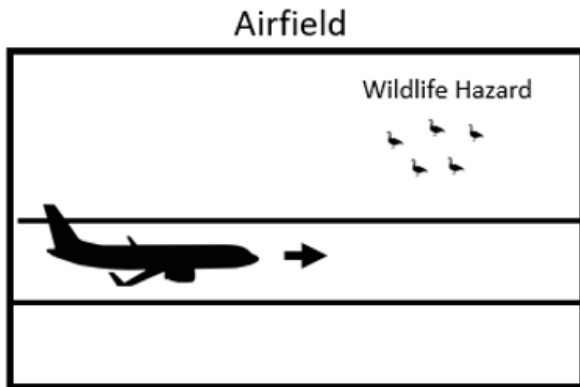
The Overarching Premise:

Establish a methodology to estimate the probability of a damaging bird strike as a conditional probability, with existing data sources, at three different airports (O'Hare, SeaTac, NAS Kingsville) for a subset of species of concern (Ross et al., 2025)



Modelling wildlife-aircraft damage as a CONDITIONAL PROBABILITY

Probability of Interaction



Yes



Probability of Collision



Yes

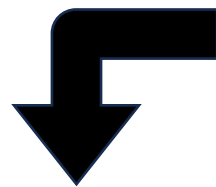


Probability of Damage



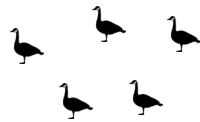
Probability Wildlife-Aircraft Interaction:

Yes

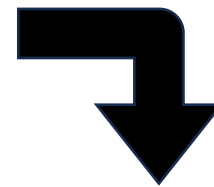


Airfield

Wildlife Hazard

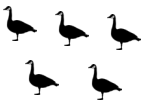


No



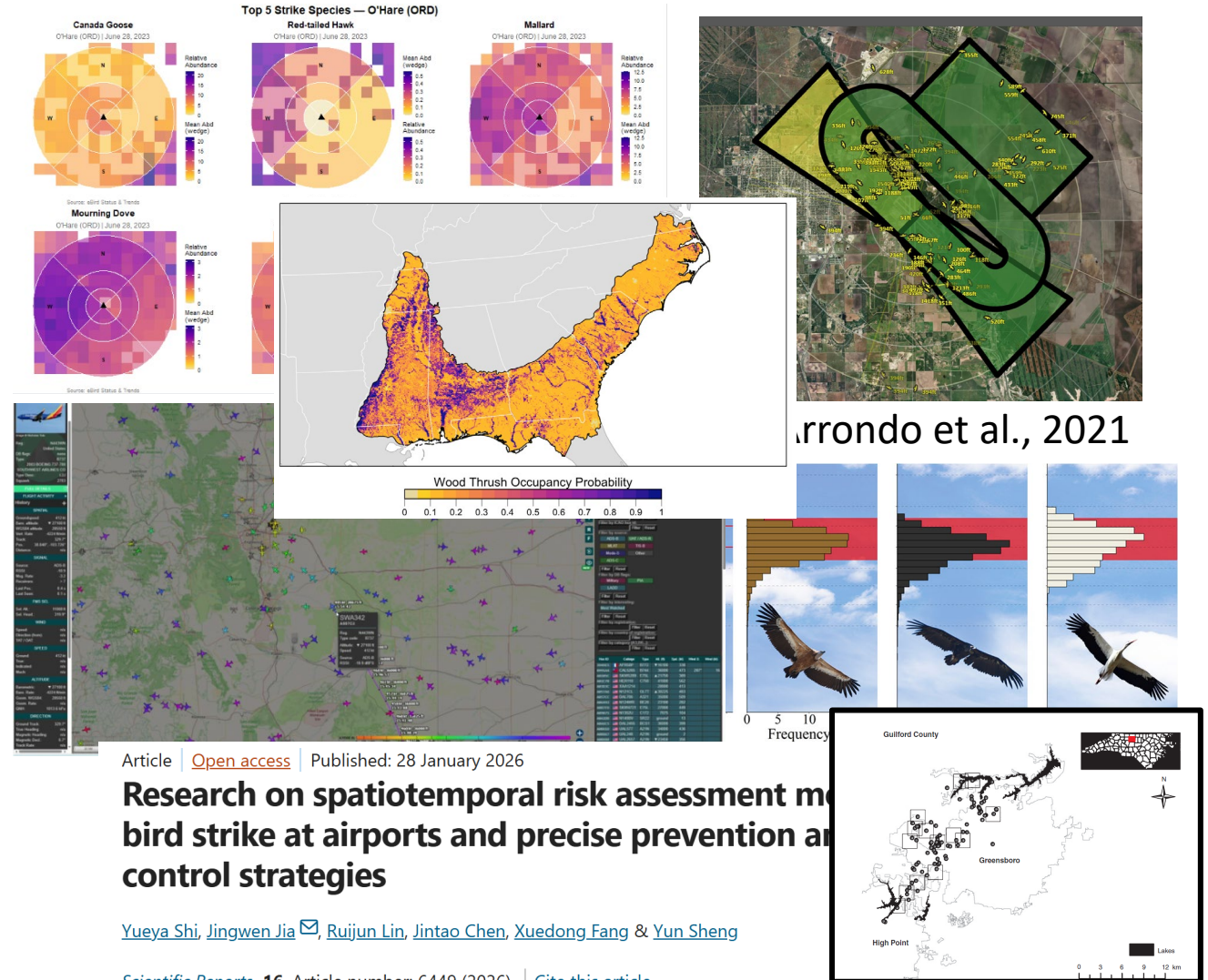
Airfield

Wildlife



Probability Wildlife-Aircraft Interaction:

- eBird
- Species Distribution Modelling
- Radar Data
- Date
- Survey Data
- Movement Data
- Existing Theoretical Tools
- ADS-B
- ASPM Flight data



Probability Wildlife-Aircraft Interaction:

 OPEN ACCESS

 PEER-REVIEWED

RESEARCH ARTICLE

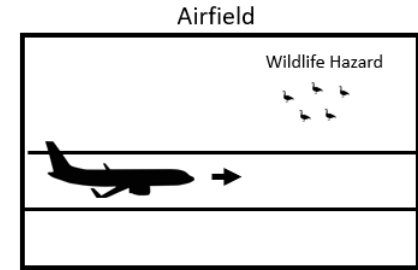
Do more birds mean more bird-aircraft collisions? A meta-analysis testing a key wildlife management tenet

Shane Guenin , Yue Liu, Bradley F. Blackwell, Travis L. DeVault, Esteban Fernández-Juricic

Published: July 1, 2026 • <https://doi.org/10.1371/journal.pone.0349352>

Article	Authors	Metrics	Comments	Media Coverage	Peer Review
					

Probability of Wildlife-Aircraft Collision |



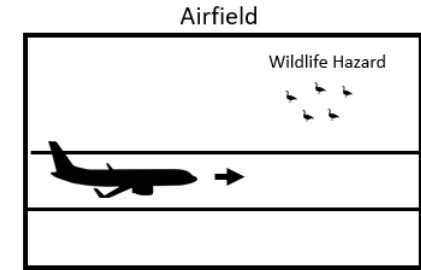
Yes



No

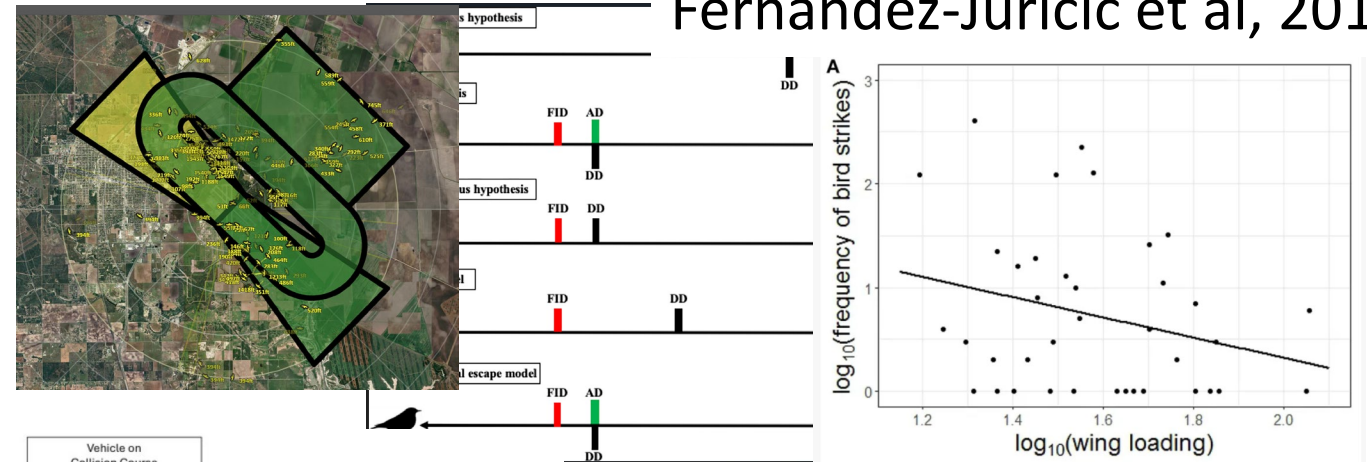


Probability of Wildlife-Aircraft Collision |

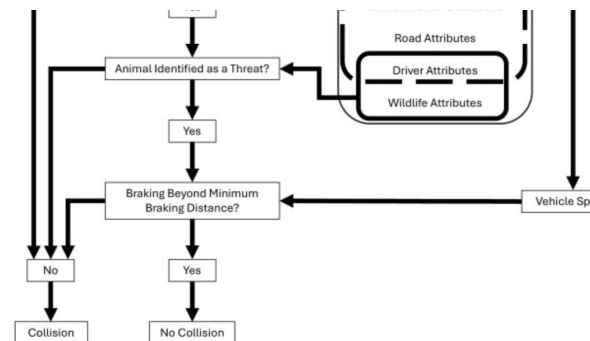


Fernández-Juricic et al, 2018

- Radar Data
- Species Morphology & Physiology
- Wildlife Behavior
- Pilot Behavior



Pakula et al., 2026



ECOLOGICAL APPLICATIONS
ECOLOGICAL SOCIETY OF AMERICA

ARTICLE | [Open Access](#) |

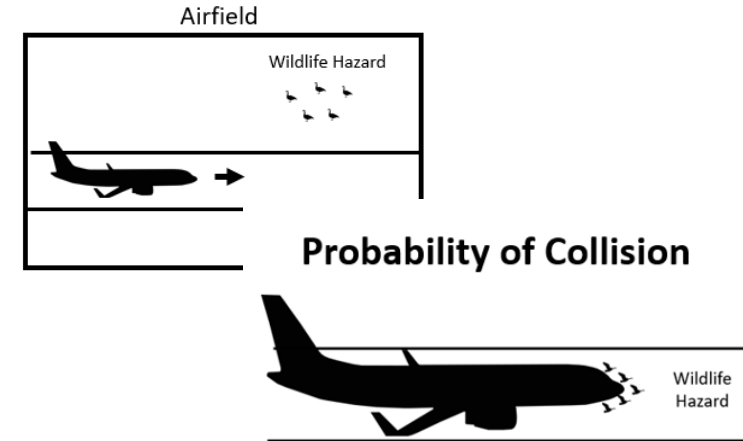
A model to quantify and apply wildlife attributes to aircraft collisions

Ryan B. Lunn [✉](#) Bradley F. Blum

First published: 01 April 2026 |



Probability of Wildlife-Aircraft Damage |



Yes

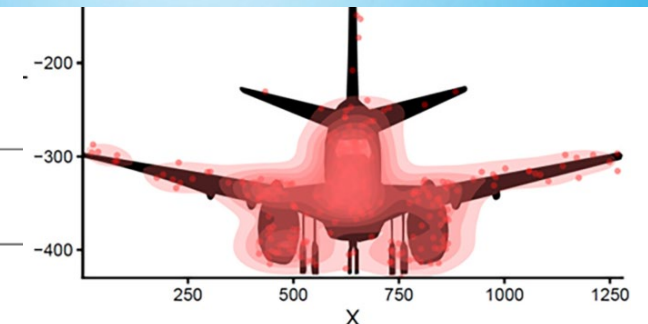
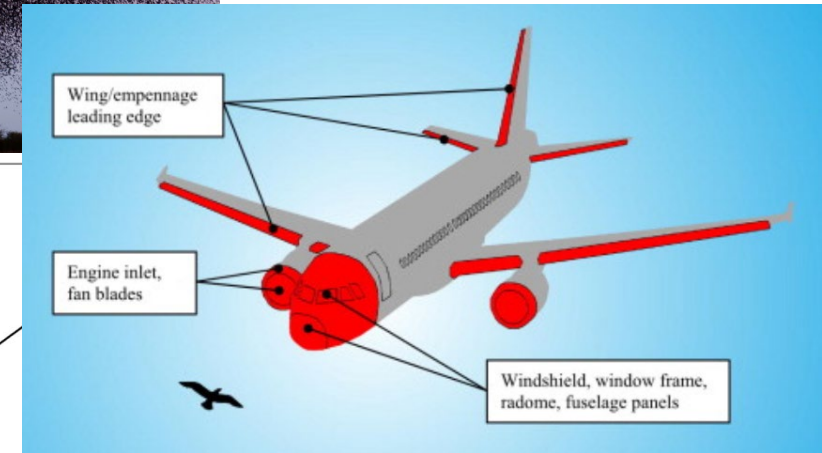
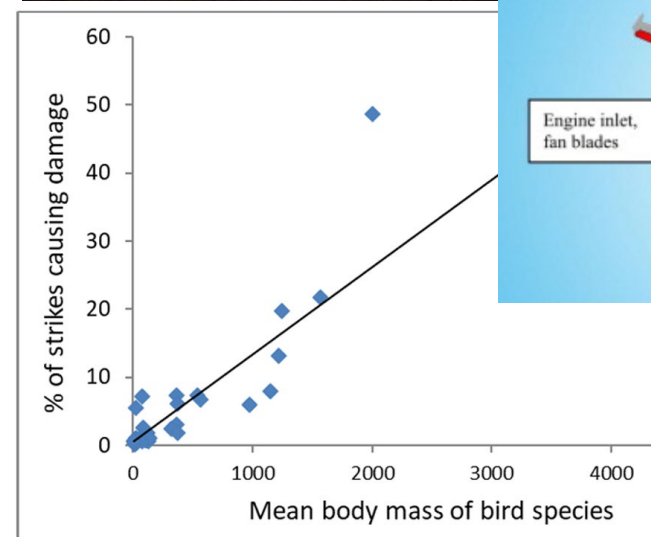
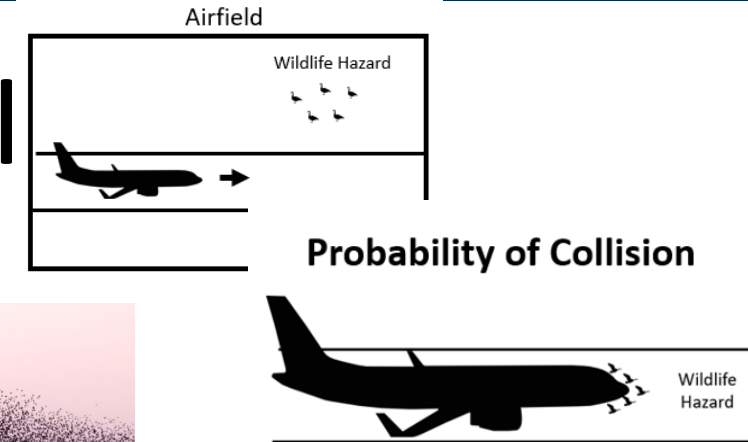


No



Probability of Wildlife-Aircraft Damage

- Aircraft Speed
- Phase of Flight
- Aircraft Type
- Bird Body Size
- Bird Flock Size/Volume/Density



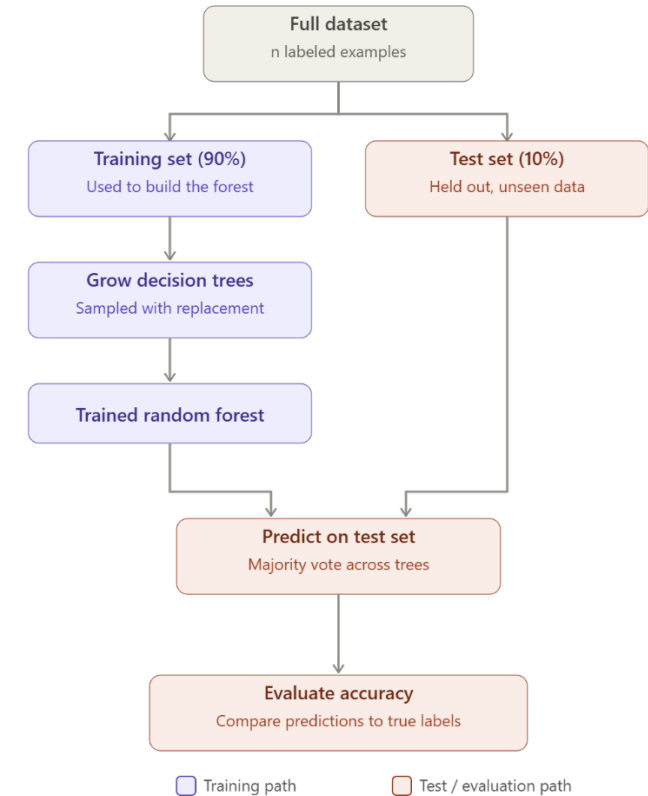
Airfields & Aerodomes are complicated places



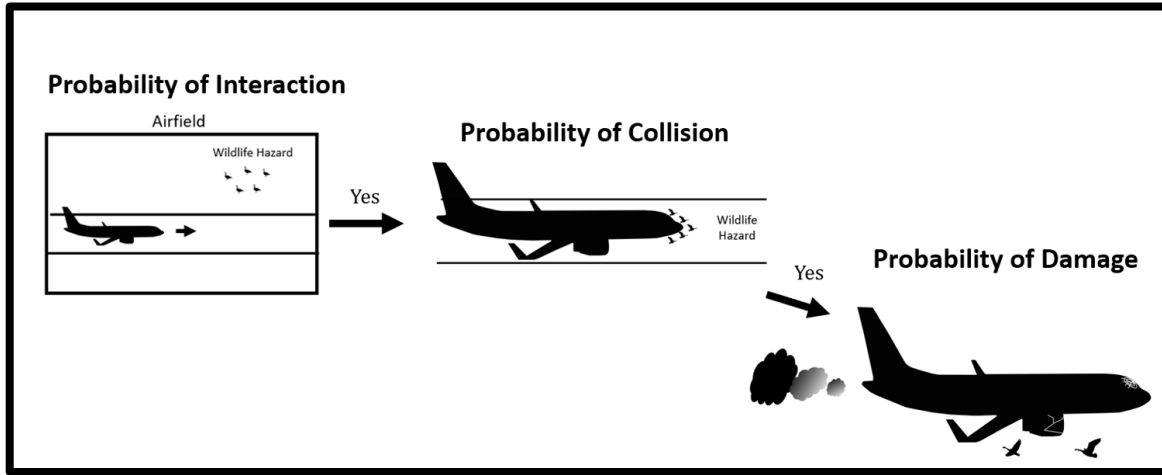
Existing Data Sources



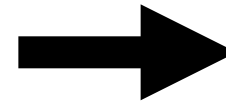
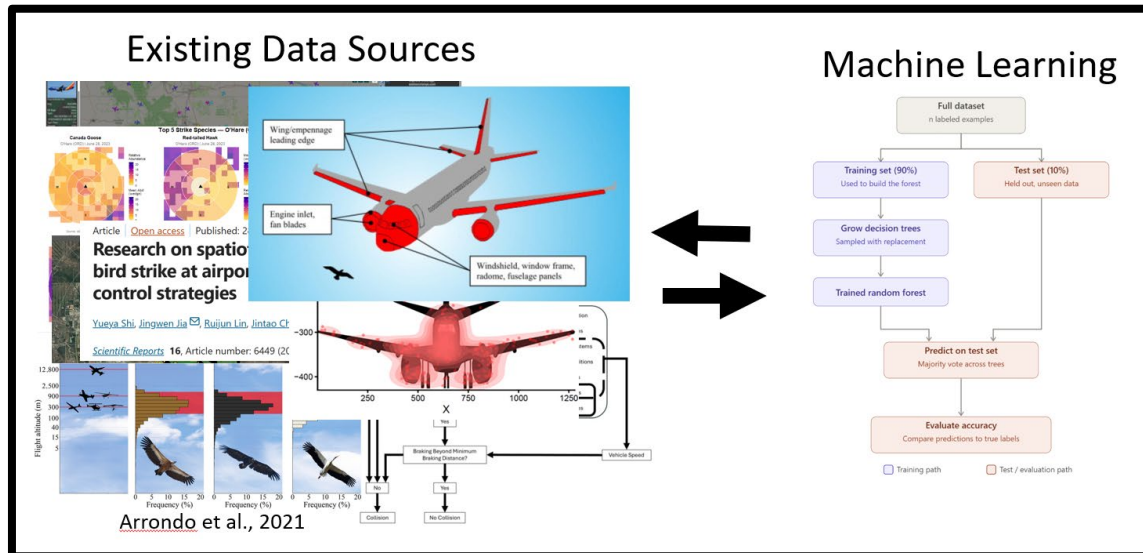
Machine Learning



Modelling



Data





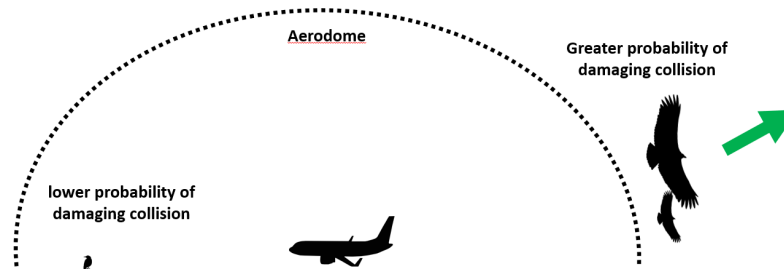
In Conclusion:

A robust system, not just birds in vicinity, capable of predicting the probability of damaging wildlife-aircraft interactions to inform:

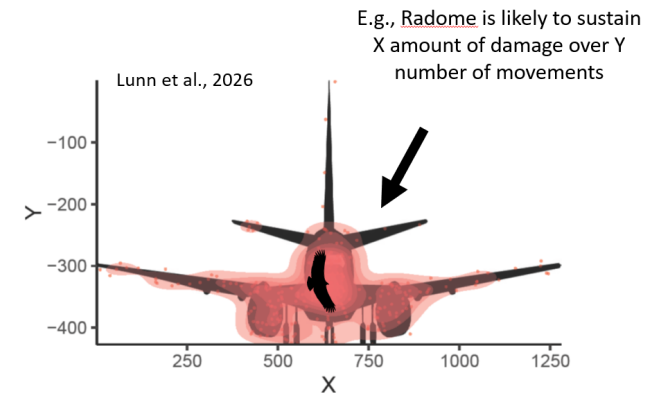
Flight Planning



Wildlife Management



Aircraft Design



Acknowledgements



Bradley F. Blackwell

USDA/APHIS/WS National Wildlife Research Center
Verified email at usda.gov

[Applied ecology](#) [transportation ecology](#) [human-wildlife interactions](#) [birdstrikes](#)
[animal-vehicle collisions](#)



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[Bayesian statistics](#) [environmental health](#) [statistical imputation](#)



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Questions?

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email: rlunn@purdue.edu



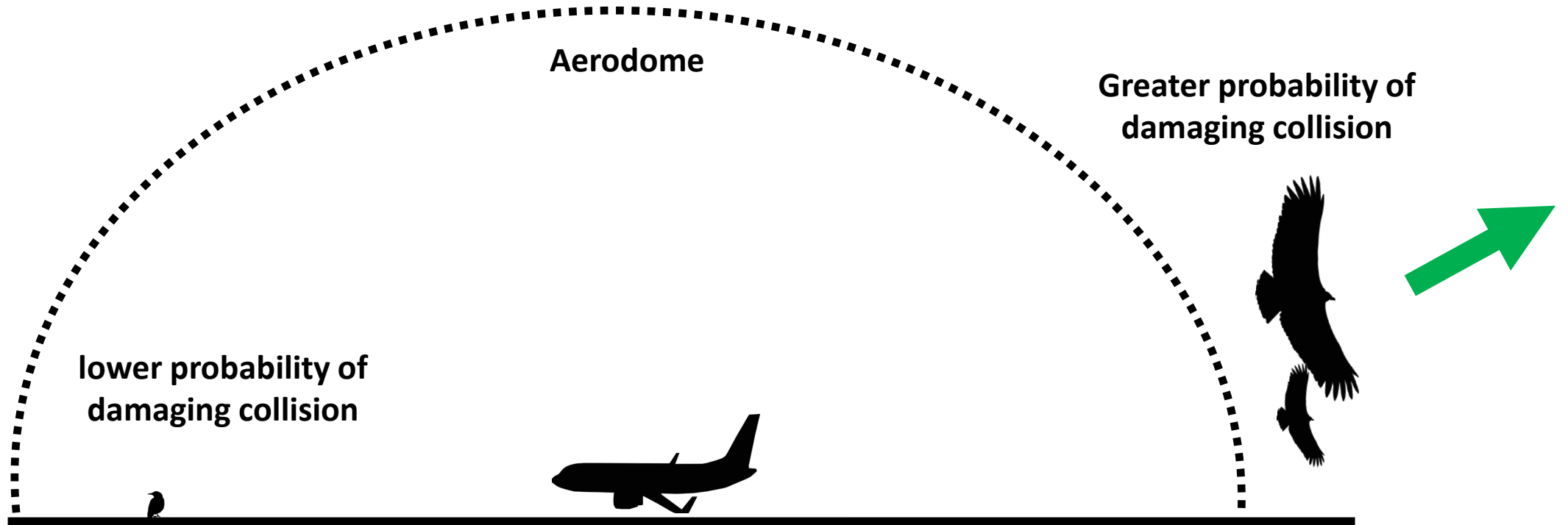
Management Implications:

1. Flight Planning & Safety: providing estimates of the probability of a damaging bird aircraft collision for specific flight paths & locations



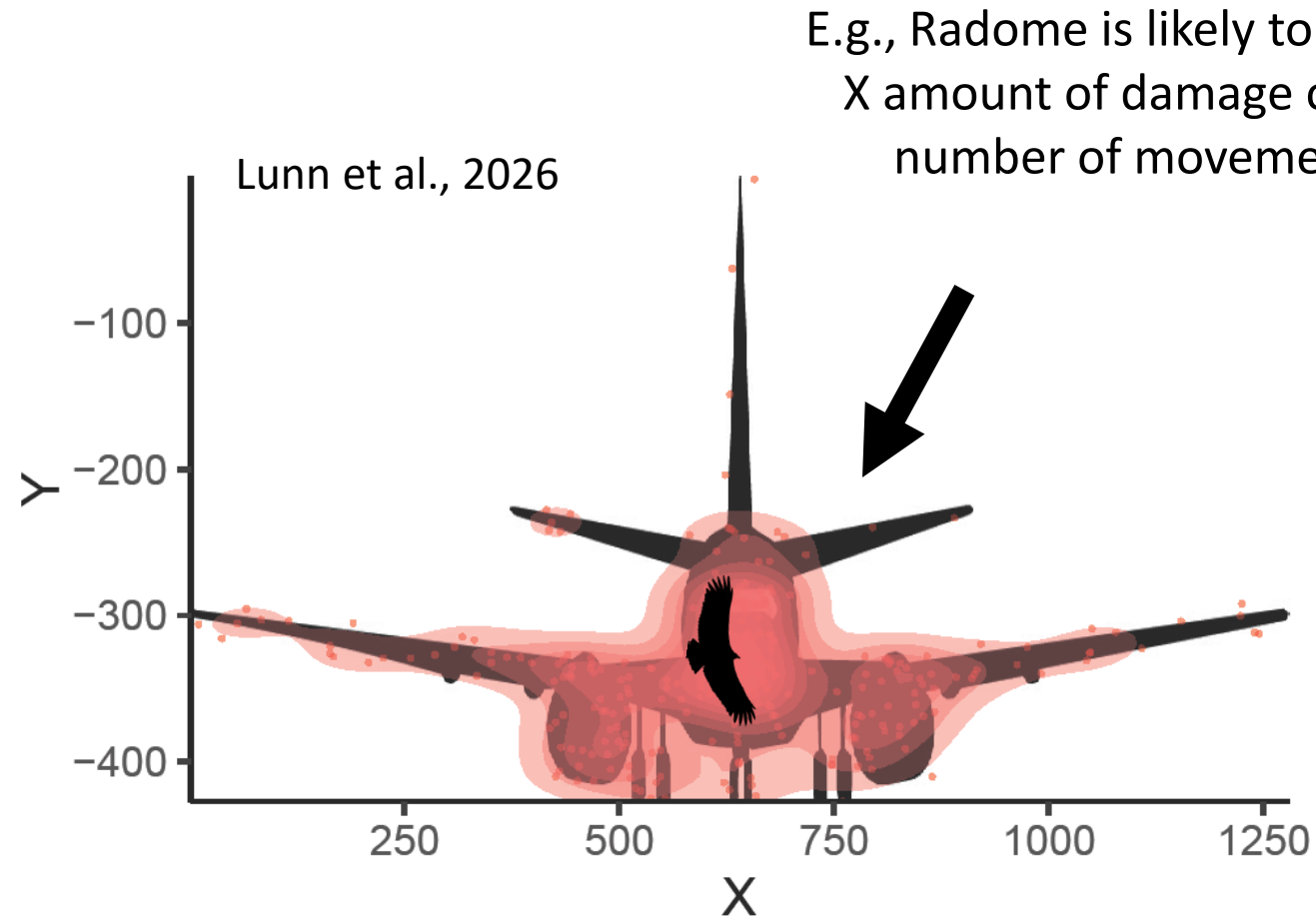
Management Implications:

2. Management Operations: Prioritizing management practices on the airfield to target species of concern. (i.e., Wildlife Hazard Management Plans)

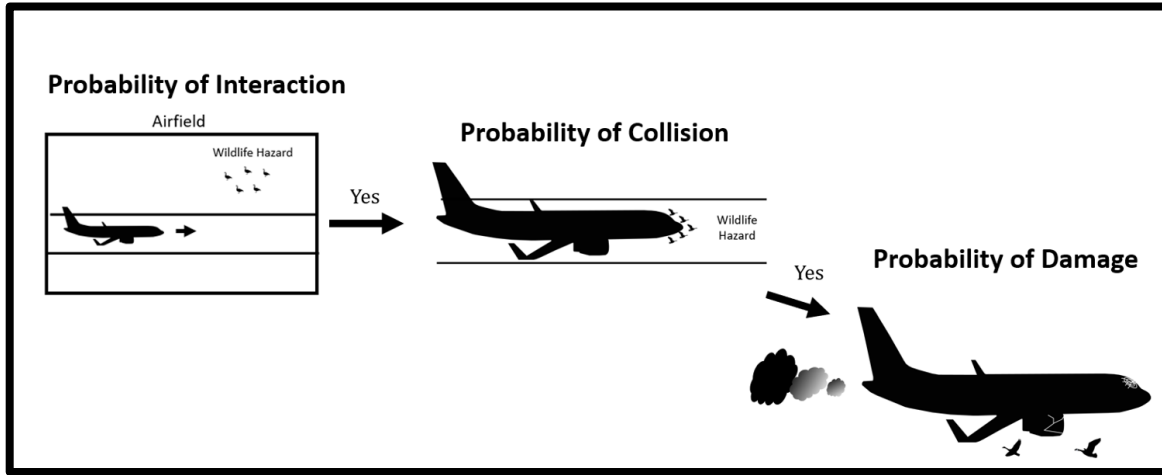


Management Implications:

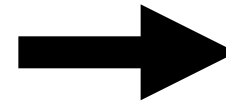
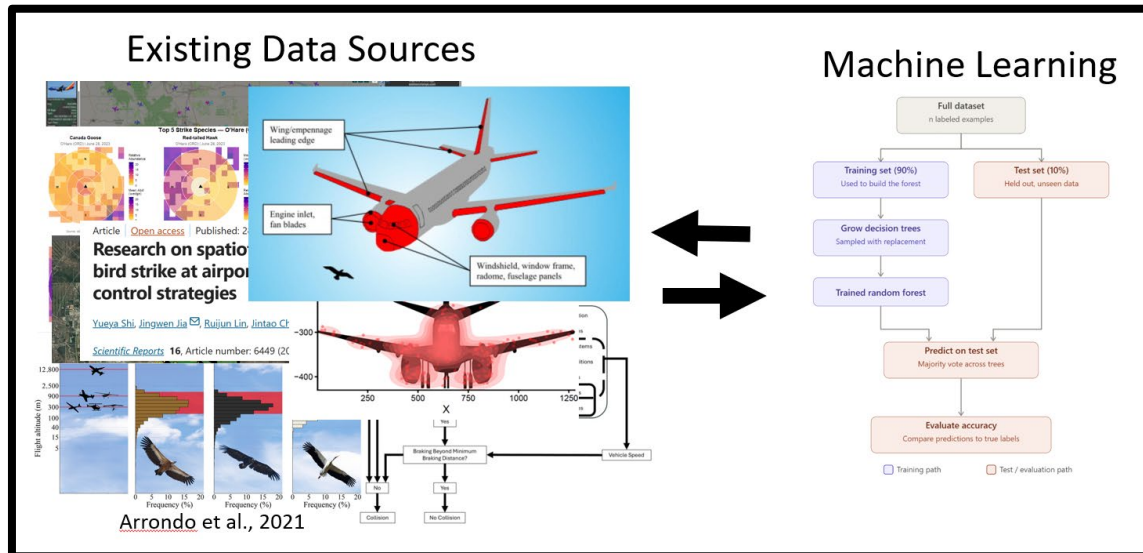
3. Informing decision making regarding aircraft repairs and components



Modelling

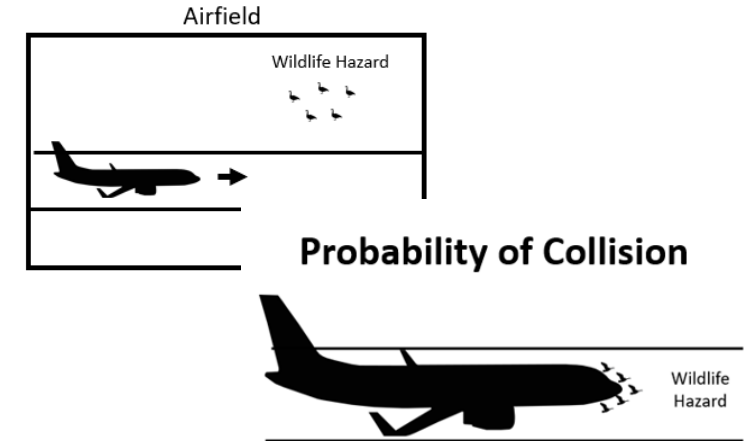


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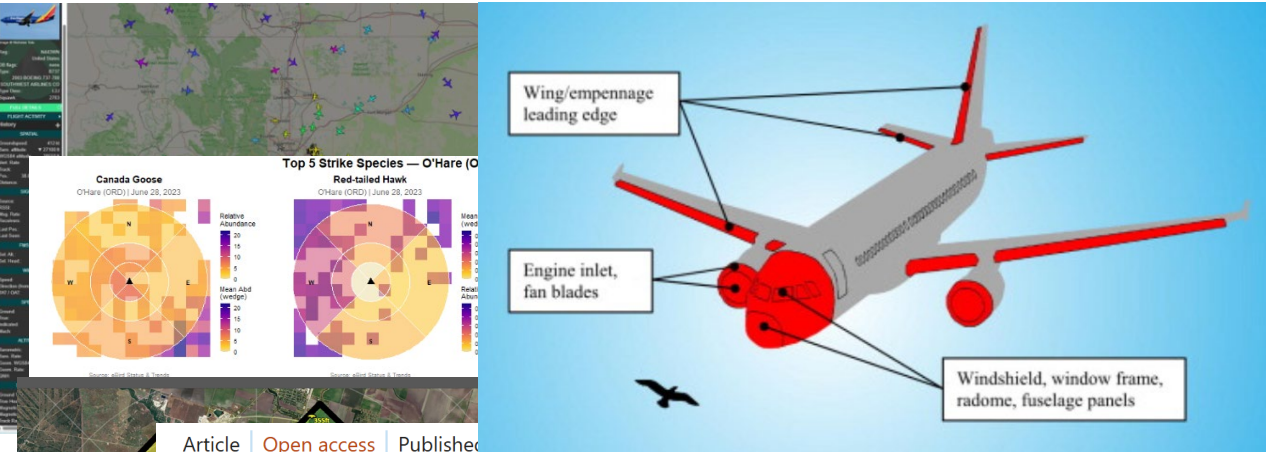


Probability of Wildlife-Aircraft Damage |

Probability of Damage



Probability Wildlife-Aircraft Interaction:

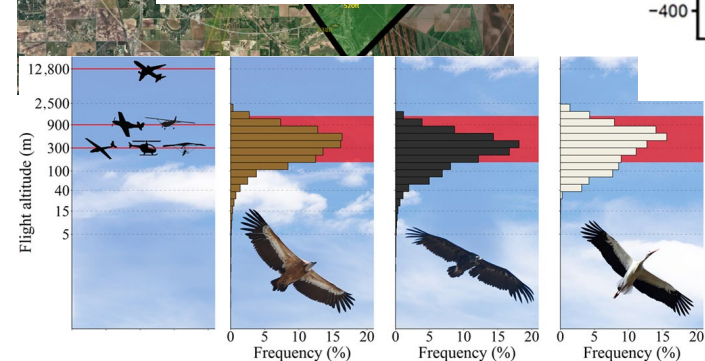


Article | [Open access](#) | Published

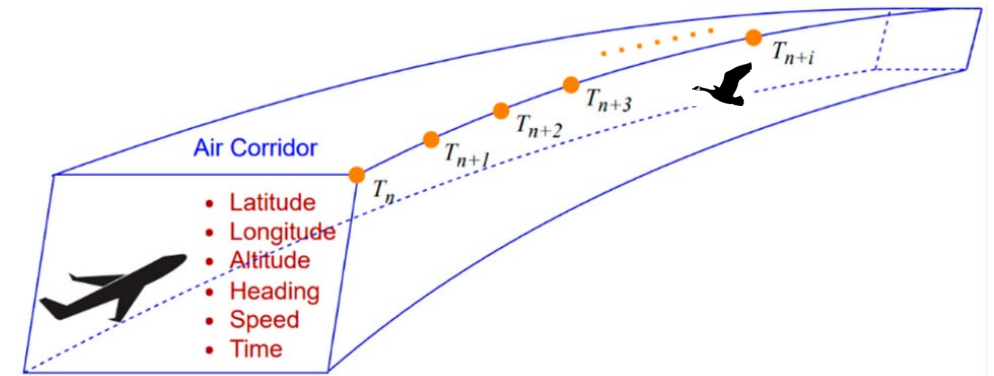
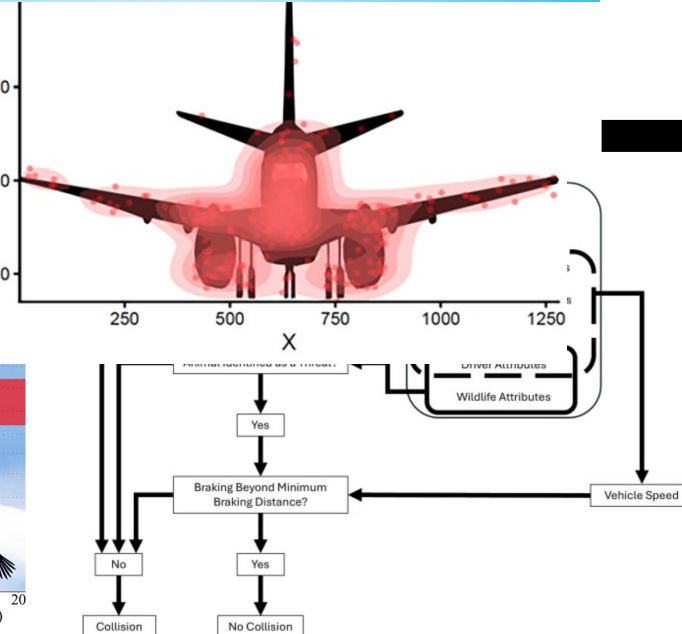
Research on spatiotemporal bird strike at airports and control strategies

[Yueya Shi](#), [Jingwen Jia](#) [Ruijun Lin](#), [Jintao Chen](#), [Zhenhua Chen](#)

[Scientific Reports](#) **16**, Article number: 6449 (2026)



Arrondo et al., 2021

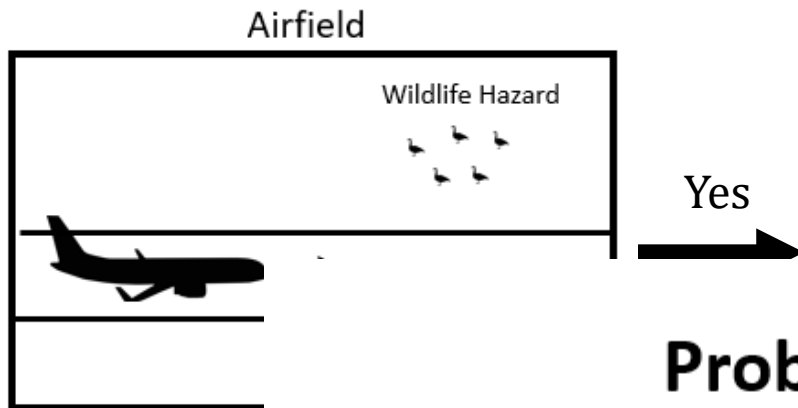


Hashemi et al., 2023



Yes

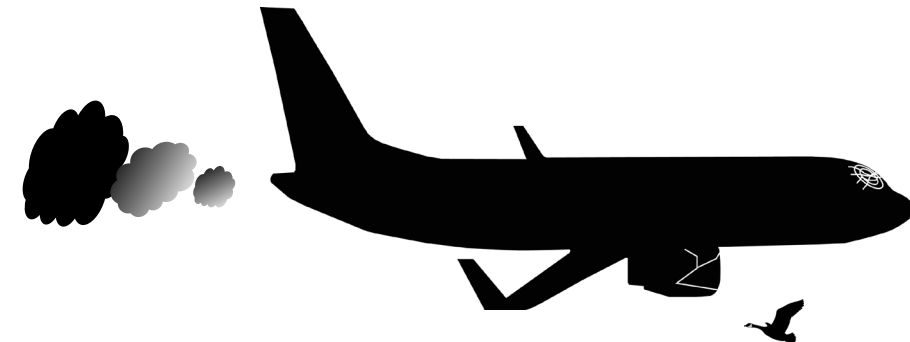
Probability of Interaction



Probability of Collision

Probability of Damage

Probability of Damage

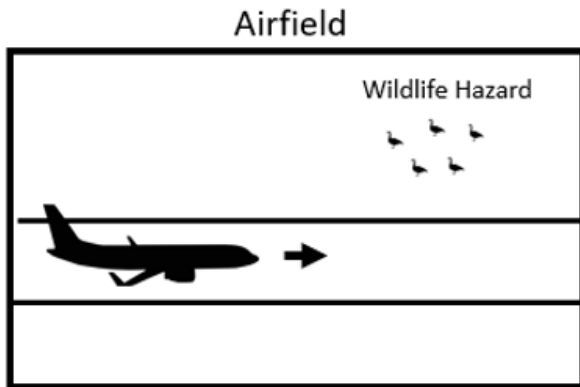


What is the probability of a damaging bird strike?

Modelling

Modelling wildlife-aircraft strike damage as a CONDITIONAL PROBABILITY

Probability of Interaction



Yes



Probability of Collision



Yes

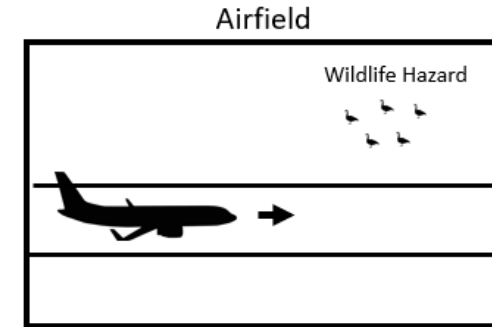


Probability of Damage



Wildlife-Aircraft Strike Risk: A Conditional Probability

Probability of Collision |



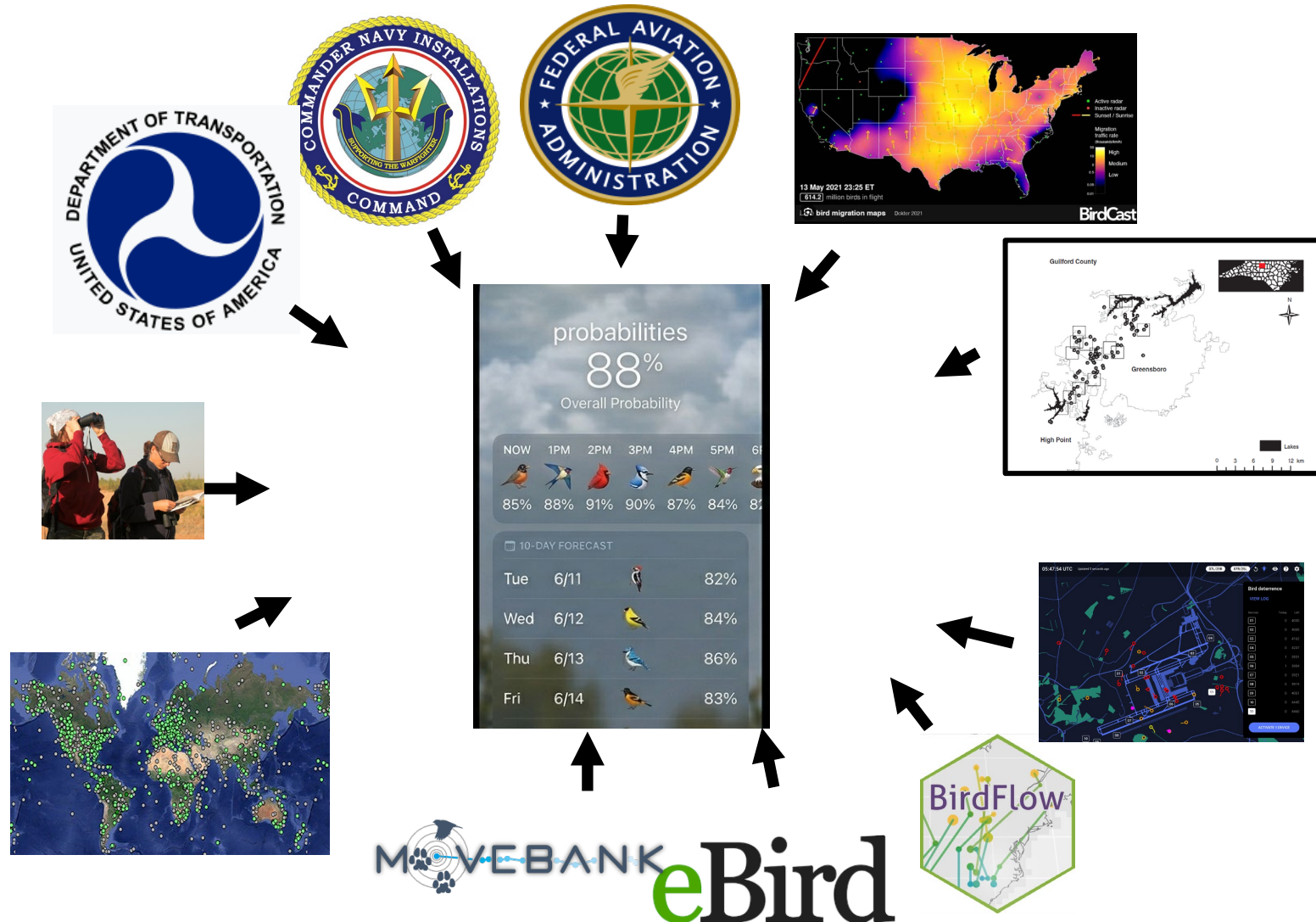
Yes

No



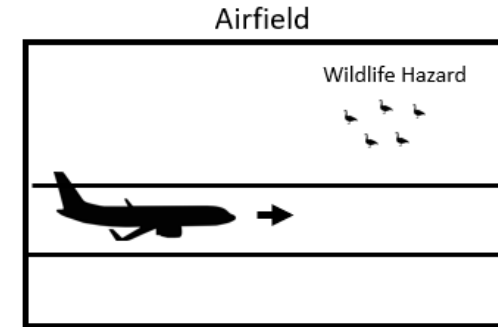
Harnessing “*Big Data*” to quantify the probability of bird strikes at airports

- Citizen Science (e.g., eBird)
- Weather Radar Data (e.g., BirdCast)
- Radar Systems (site specific)
- Flight Numbers (e.g., DOT)
- Collisions Reported (e.g., FAA Database)
- Scientific Literature
- Survey Data (e.g., Airfield Biologist)

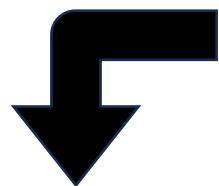


How does wildlife negatively impact flight operations?

Probability of Collision |



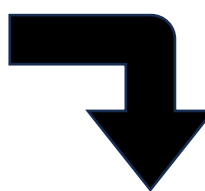
Yes



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No

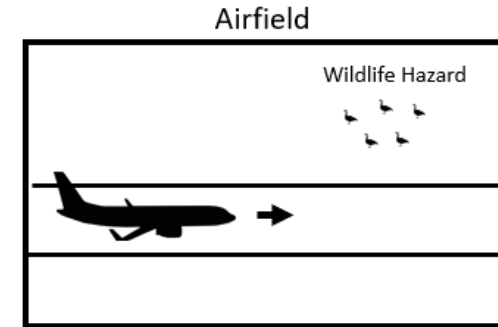


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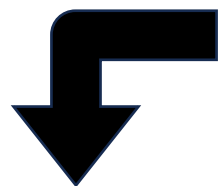


How does wildlife negatively impact flight operations?

Probability of Collision |



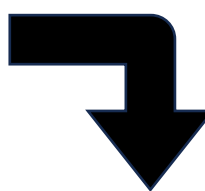
Yes



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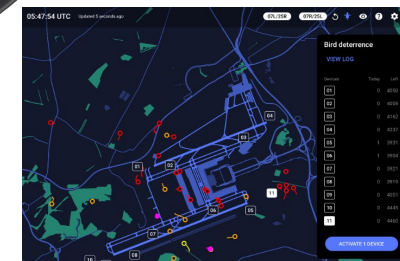
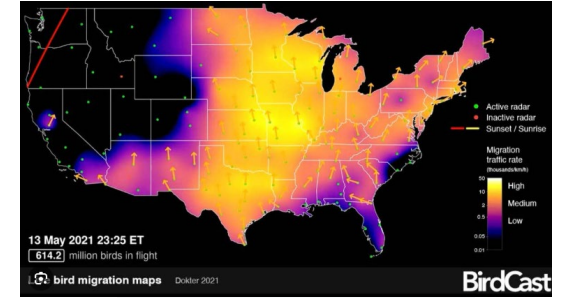
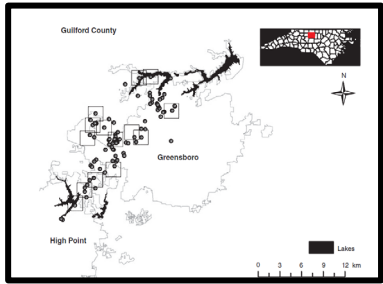
No



A large, thick, black arrow pointing downwards and slightly to the left, indicating a 'No' response to the question 'Probability of Collision |'.



Claude Harnessing “*Big Data*” to quantify the probability of bird strikes at airports



Defining risk as an expected value

$$E(X) = \sum x_i P(x_i)$$

For example: Should you go to the park based on the weather forecast?

x_i = A Tornado Alert

$P(x_i) = 25\%$

What is wildlife-aircraft strike risk?

Measure of consequence (e.g., Direct & Indirect Cost)

Likely Stakeholder Specific

- Direct Repair Costs
- Indirect Costs (e.g., flight delays, lost income)

What is the probability of a consequence occurring as the result of wildlife & aircraft interaction?

Defining wildlife-aircraft strike risk as an expected value:

$$E(X) = \sum x_i P(x_i)$$

x_i = Measure of consequence (e.g., Direct & Indirect Cost)

$P(x_i)$ = Probability of consequence occurring

What is wildlife-aircraft strike risk?

Measure of consequence (e.g., Direct & Indirect Cost)

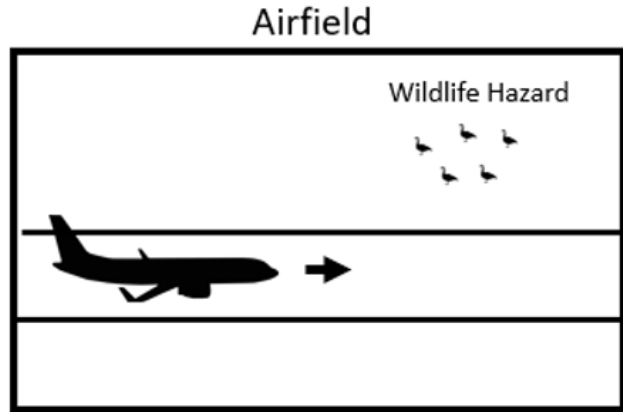
Likely Stakeholder Specific

- Direct Repair Costs
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What is wildlife-aircraft strike risk?

$$E(X) = \sum x_i P(x_i)$$

Probability of Interaction



Yes



Probability of Collision



Yes



Probability of Damage

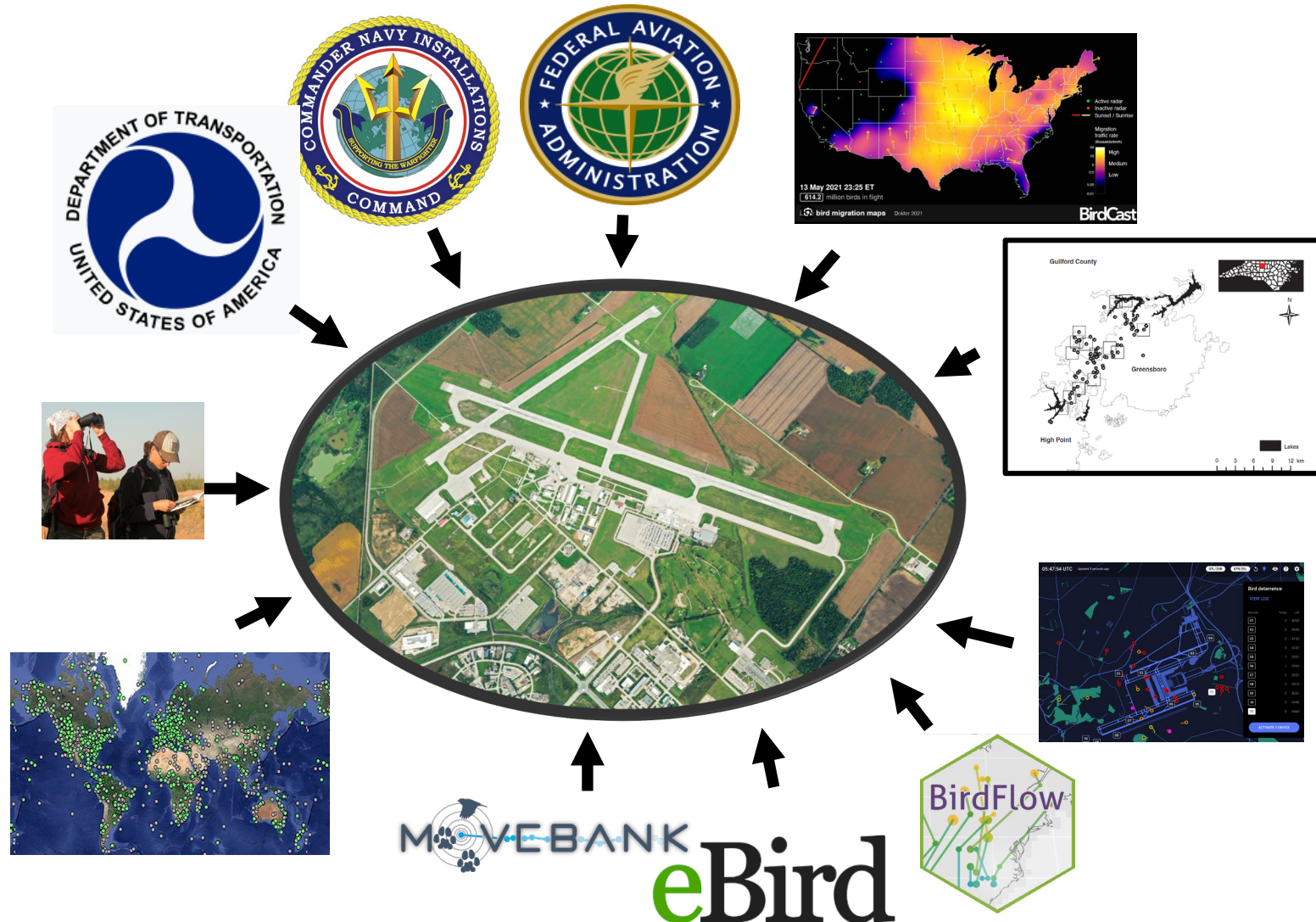


Harnessing “*Big Data*” to quantify the probability of bird strikes at airports



Harnessing “*Big Data*” to quantify the probability of bird strikes at airports

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- Scientific Literature
- Survey Data (e.g., Airfield Biologist)



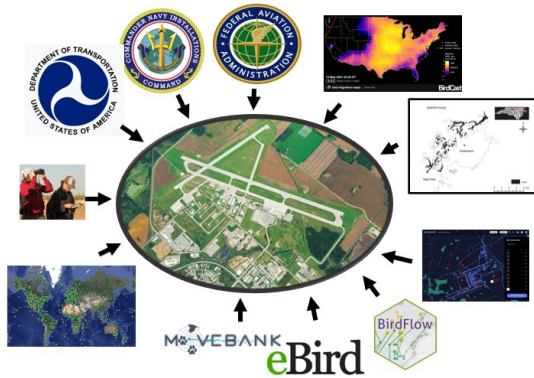
Project Objectives

- Forecast the probability of bird strikes
- Evaluate effectiveness of current BASH management practices
- Develop interactive dashboards for airport operations and flight planning

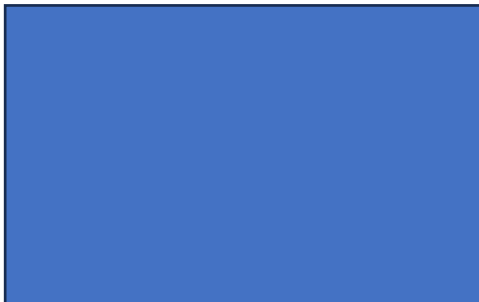


Data Processing

1. Collate data



2. Build & Automate Pipelines Pipelines

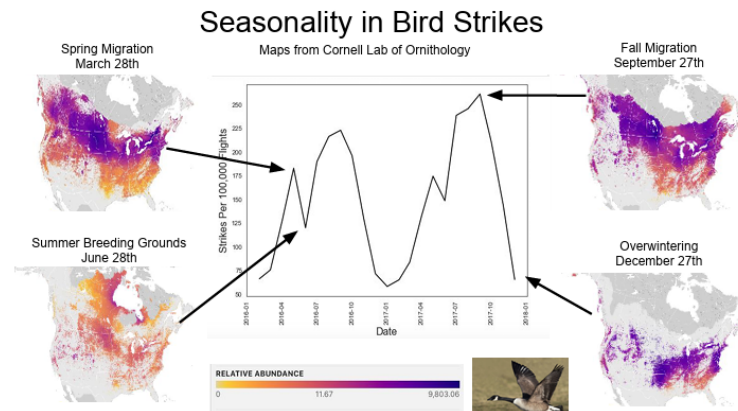


Modeling & dashboard development

4. Forecasts of strike probability



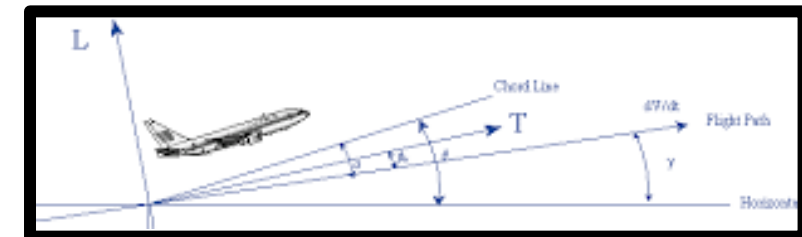
3. Develop & evaluate predictive models of strike probability



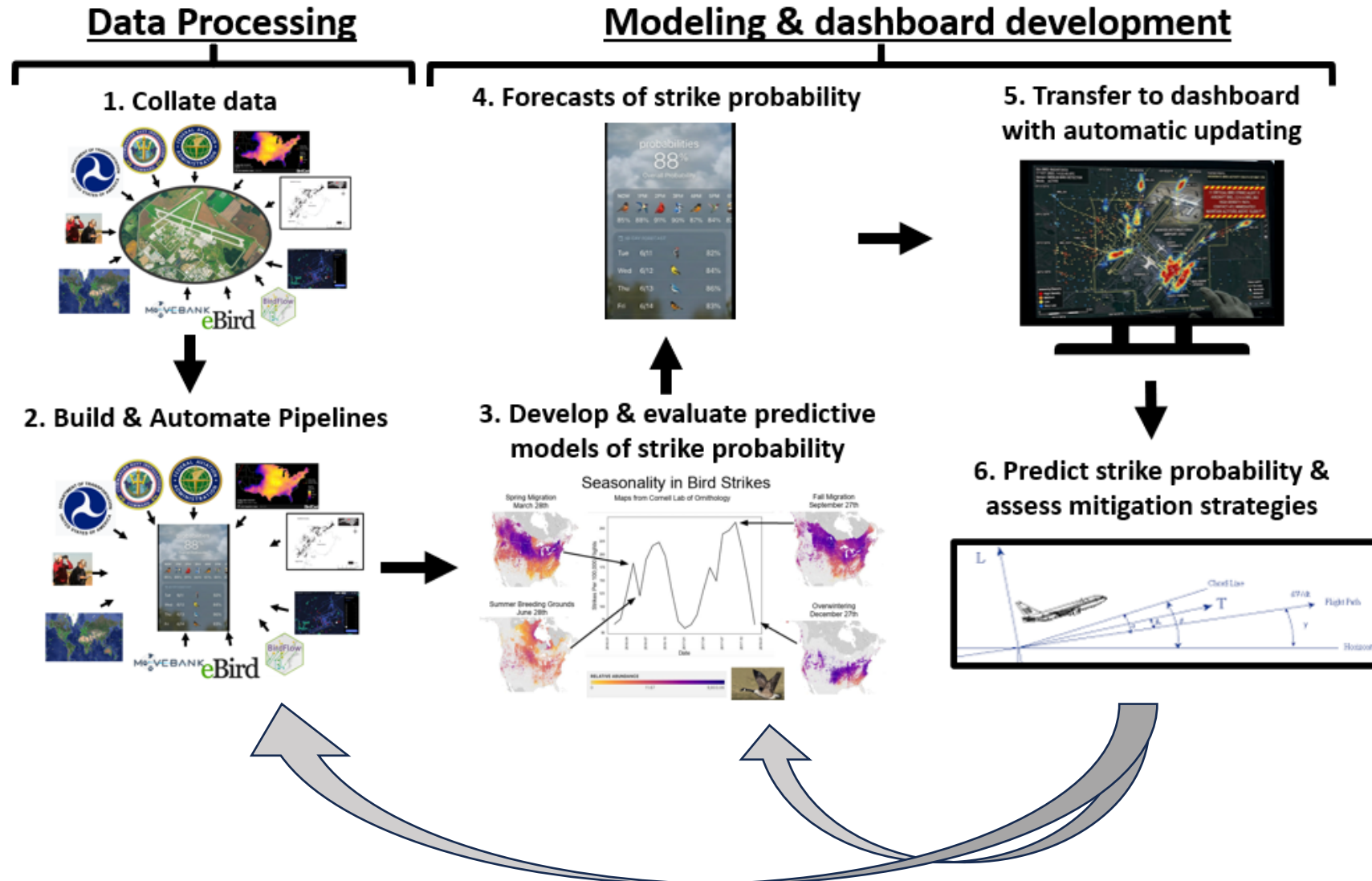
5. Transfer to dashboard with automatic updating



6. Predict strike probability & assess mitigation strategies

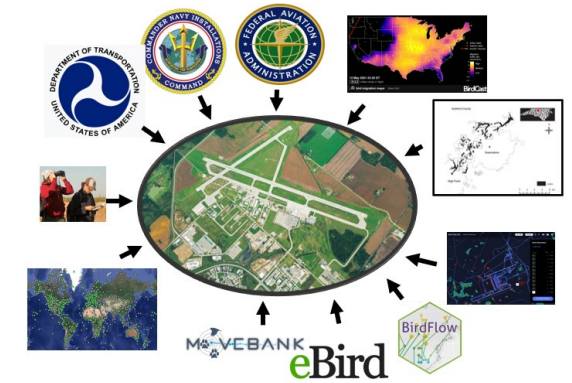


Development an iterative process

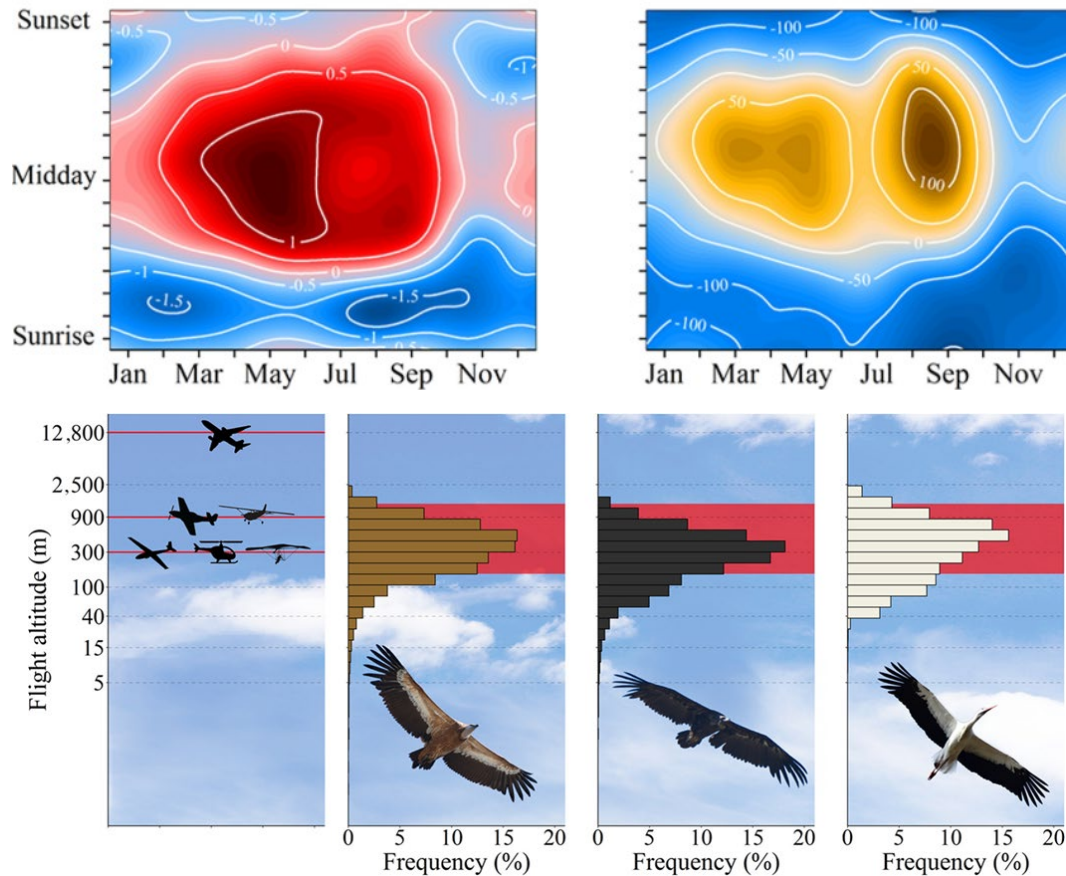


Next Research Steps:

1. Identify, gather, & assess the utility of existing data sources



White stork



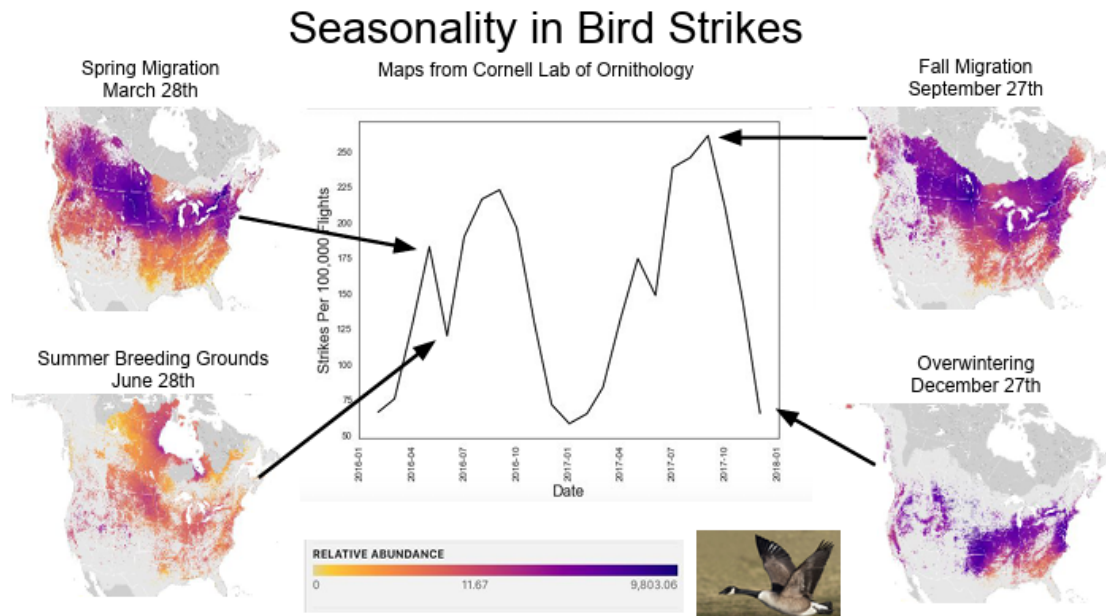
Arrondo et al., 2021

In the process identify

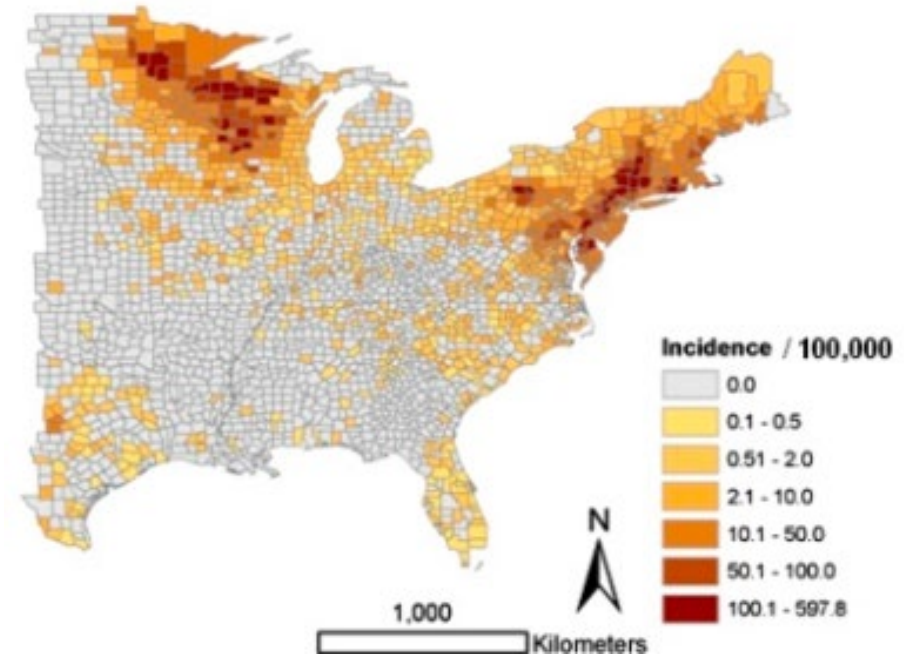
- Spatial and temporal scale
- Species of concern
- Critical variables (e.g., landcover, altitude, speed, etc.)

Next Research Steps:

3. Implement species distribution modeling in 3D around the airfield to forecast the probability of a bird strike

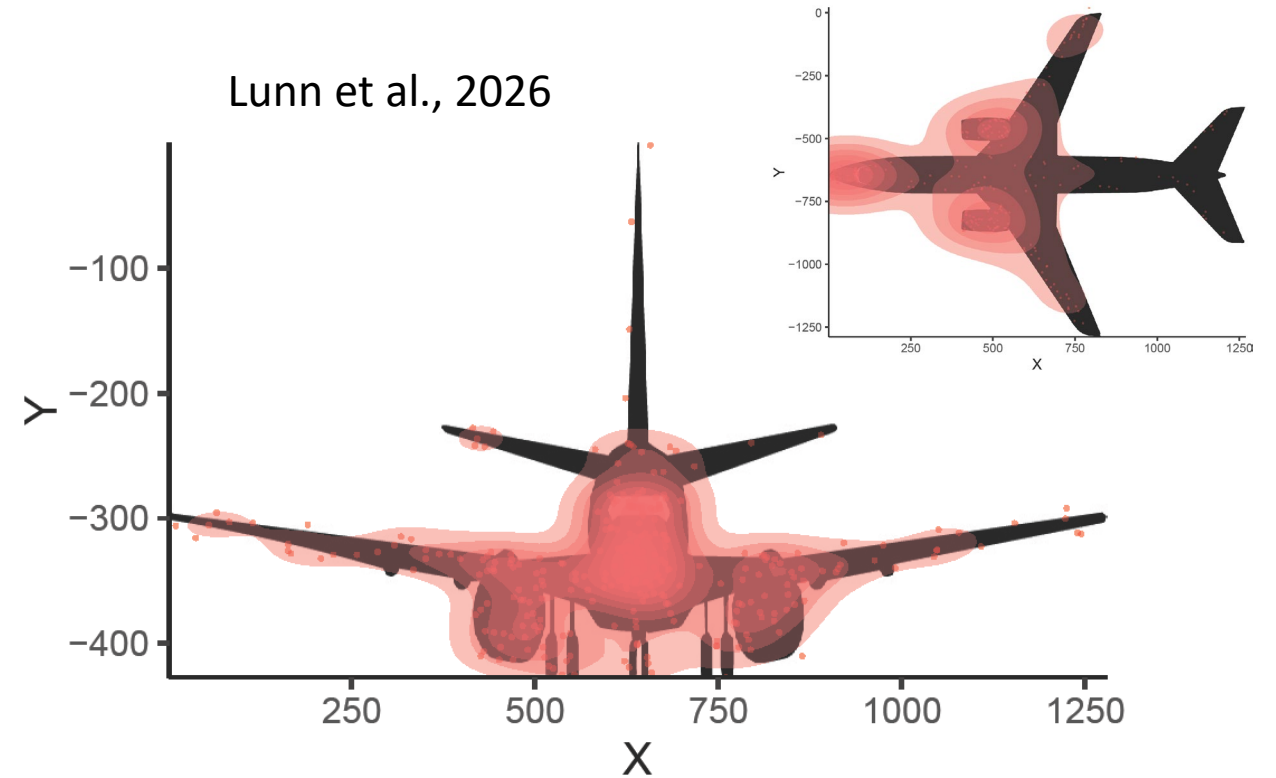


Pepin et al., 2012



Next Research Steps:

4. Develop an accessible system for the probability of bird strike estimates to aid stakeholder decision making (i.e., flight planning, material use)



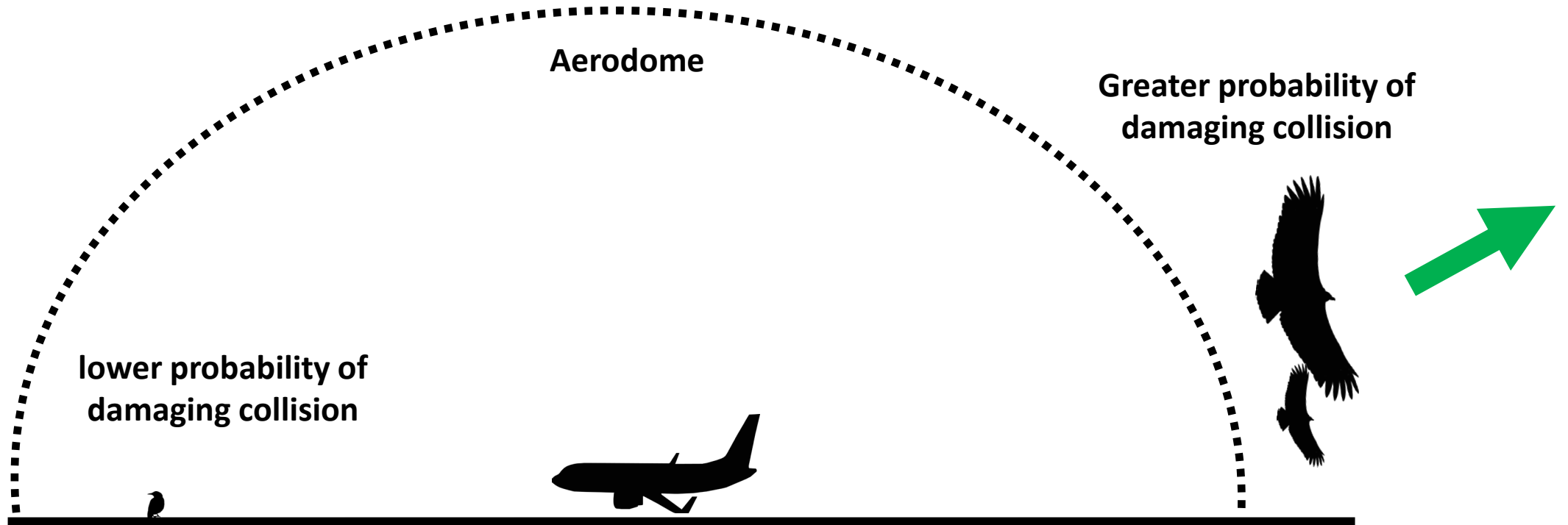
Management Implications:

1. **Flight Planning & Safety:** providing estimates of the probability of a damaging bird aircraft collision for specific flight paths & locations



Management Implications:

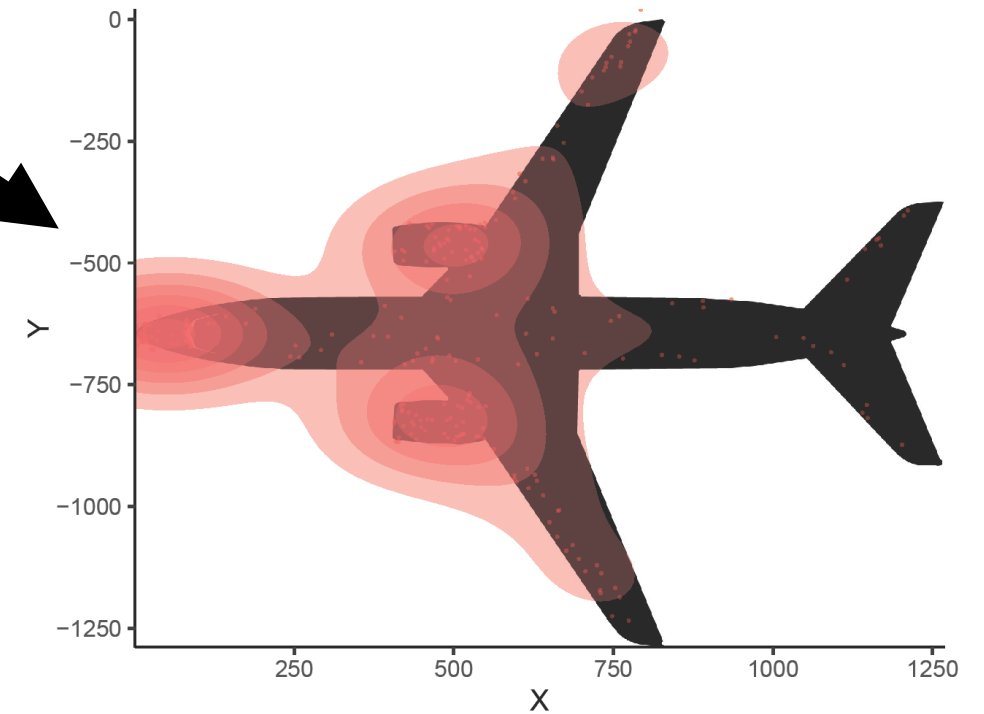
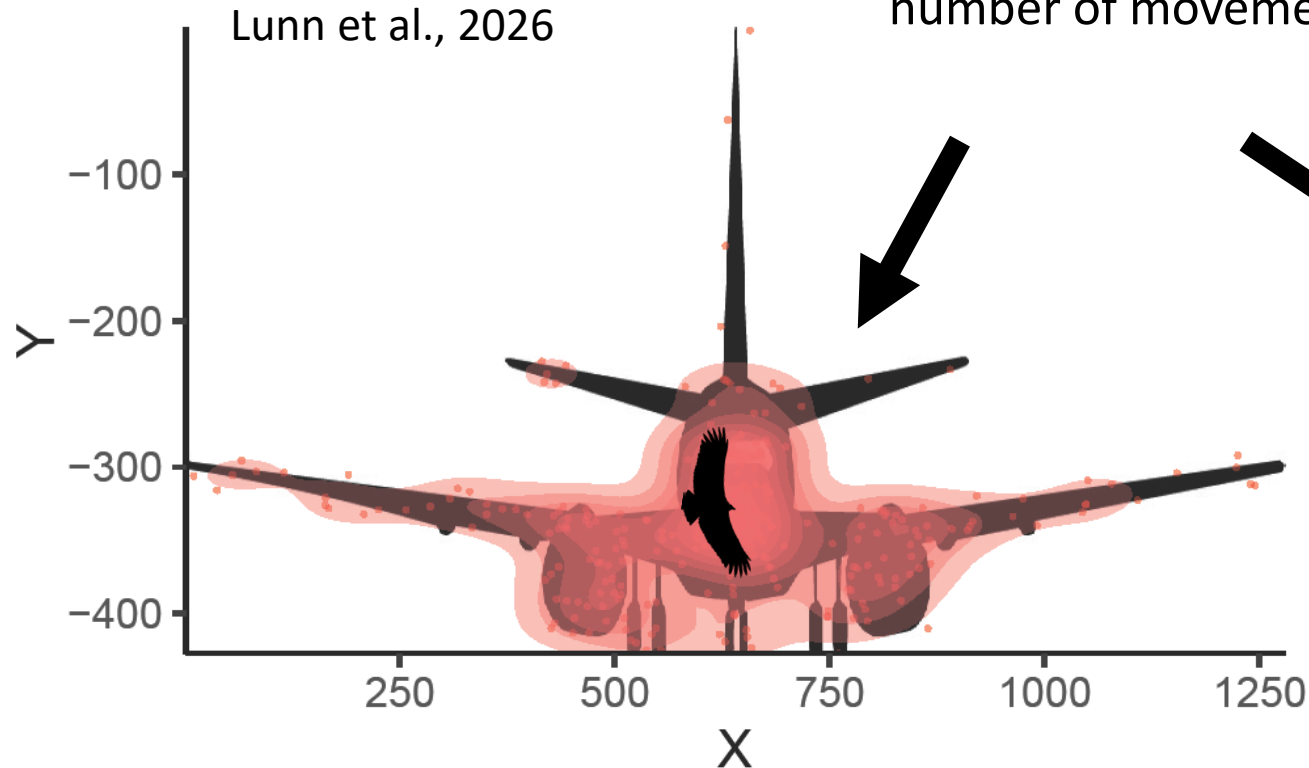
2. Management Operations: Prioritizing management practices on the airfield to target species of concern. (i.e., Wildlife Hazard Management Plans)



Management Implications:

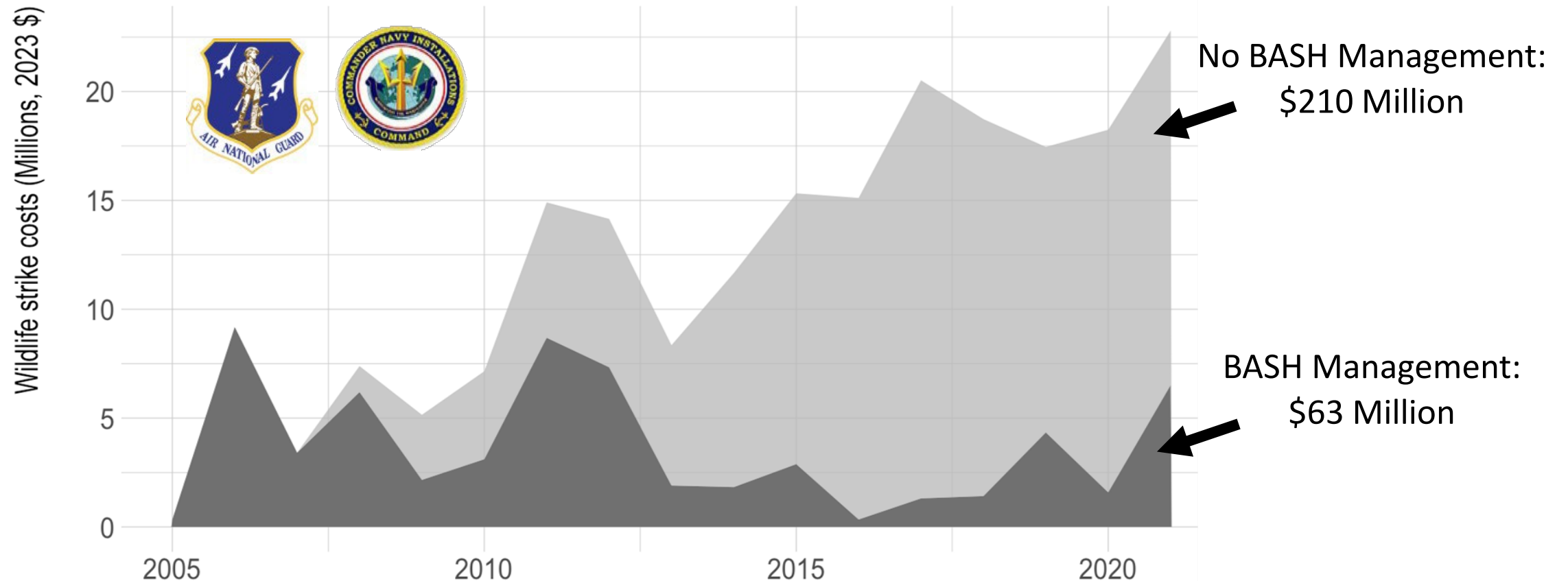
3. Informing decision making regarding aircraft repairs and components

E.g., Radome is likely to sustain
X amount of damage over Y
number of movements



The economic benefits of a BASH program (2005-2021)

BASH Management Programs averted 147 million in costs





United States Department of Agriculture

A large commercial airplane, likely a Boeing 747, is shown from a low angle, flying directly towards the viewer. The plane's landing gear is deployed, and its wings are spread wide. Below the plane, a large flock of geese is gathered on a grassy field. In the background, there is a runway with yellow and blue markers, and a tall, lattice-structured tower. The sky is clear and blue.

Questions ?

mike.begier@usda.gov

202-341-7377

Bird Aircraft Collisions & the P-8 Poseidon Aircraft

Total Repair Cost: \$8.3 million (2814 Incidents, 125 Aircraft, 2012-2026)

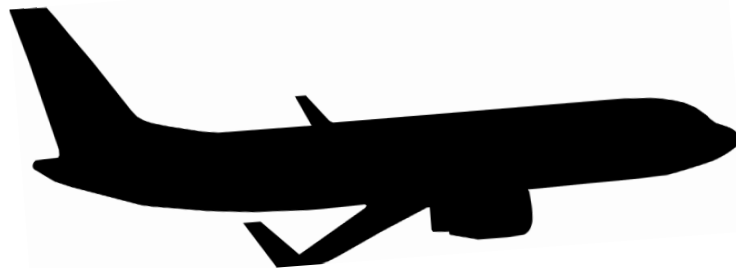
- Birds Reported: \$7.54 million (1576 Incidents, 46 Mishaps)
- Birds Not Reported: \$757,774 (1153 Incidents, 18 Mishaps)



Bird Aircraft Collisions & the P-8 Poseidon Aircraft

Birds Reported: \$7.54 million (1576 Incidents, 46 Mishaps)

- Severe: \$0 (7 Incidents, 0 Mishaps)
- Moderate: \$179,386 (229 Incidents, 8 Mishaps)
- Low: \$5.86 million (1274 Incidents, 34 Mishaps)
- Unknown: \$1.49 million (66 incidents, 4 Mishaps)



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The ability to identify the risk or predict the probability of economic damage is limited

Next Research Steps:

1. Review Methodologies of Bird Strike Risk Estimation & Build upon existing theoretical frameworks

Literature

172

RANKING WILDLIFE HAZARDS TO AVIATION

Ranking the hazard level of wildlife species to aviation

Richard A. Dolbeer, Sandra E. Wright, and Edward C. Cleary

Research on spatiotemporal risk assessment model of bird strike at airports and precise prevention and control strategies

[Yueya Shi](#), [Jingwen Jia](#) , [Ruijun Lin](#), [Jintao Chen](#), [Xuedong Fang](#) & [Yun Sheng](#)

[Scientific Reports](#) 16, Article number: 6449 (2026) | [Cite this article](#)

921 Accesses | [Metrics](#)

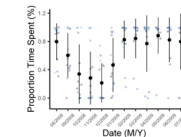
Human–Wildlife Interactions 5(2):249–268, Fall 2011

Using avian radar to examine relationships among avian activity, bird strikes, and meteorological factors

PETER S. COATES, U.S. Geological Survey, Western Ecological Research Center, Dixon, CA 95620, USA pcoates@usgs.gov

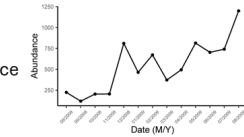
Theory

Probability of Interaction



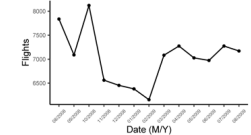
Spatial Ecology

Population Ecology/Abundance



$$P(\text{Interaction}) = \frac{\left(\frac{t_i}{T}\right) * A}{F_{\text{num}}}$$

Flight Data

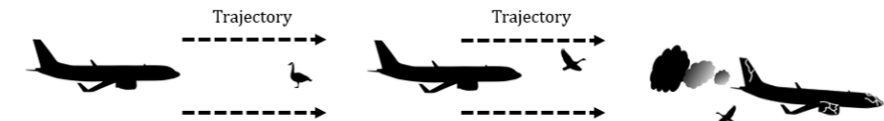


a)

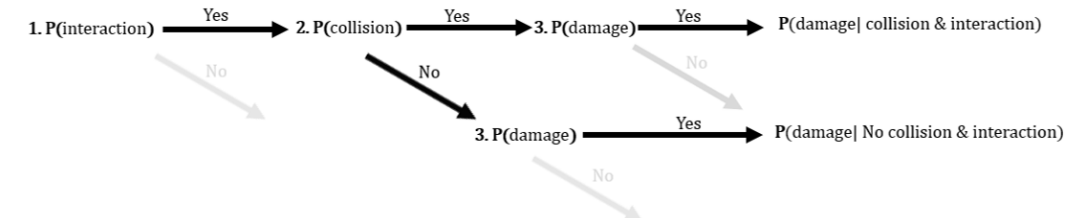
1. Probability of Interaction

2. Probability of Collision

3. Probability of Damage



b)



Defining wildlife-aircraft strike risk as a conditional probability

