



# **Risk-Hedged Approach for Re-routing Air Traffic Under Weather Uncertainty**

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# Outline

- Background on route planning
- Re-routing options for weather avoidance
- Risk-hedged approach for re-routing
- Example results
- Conclusion

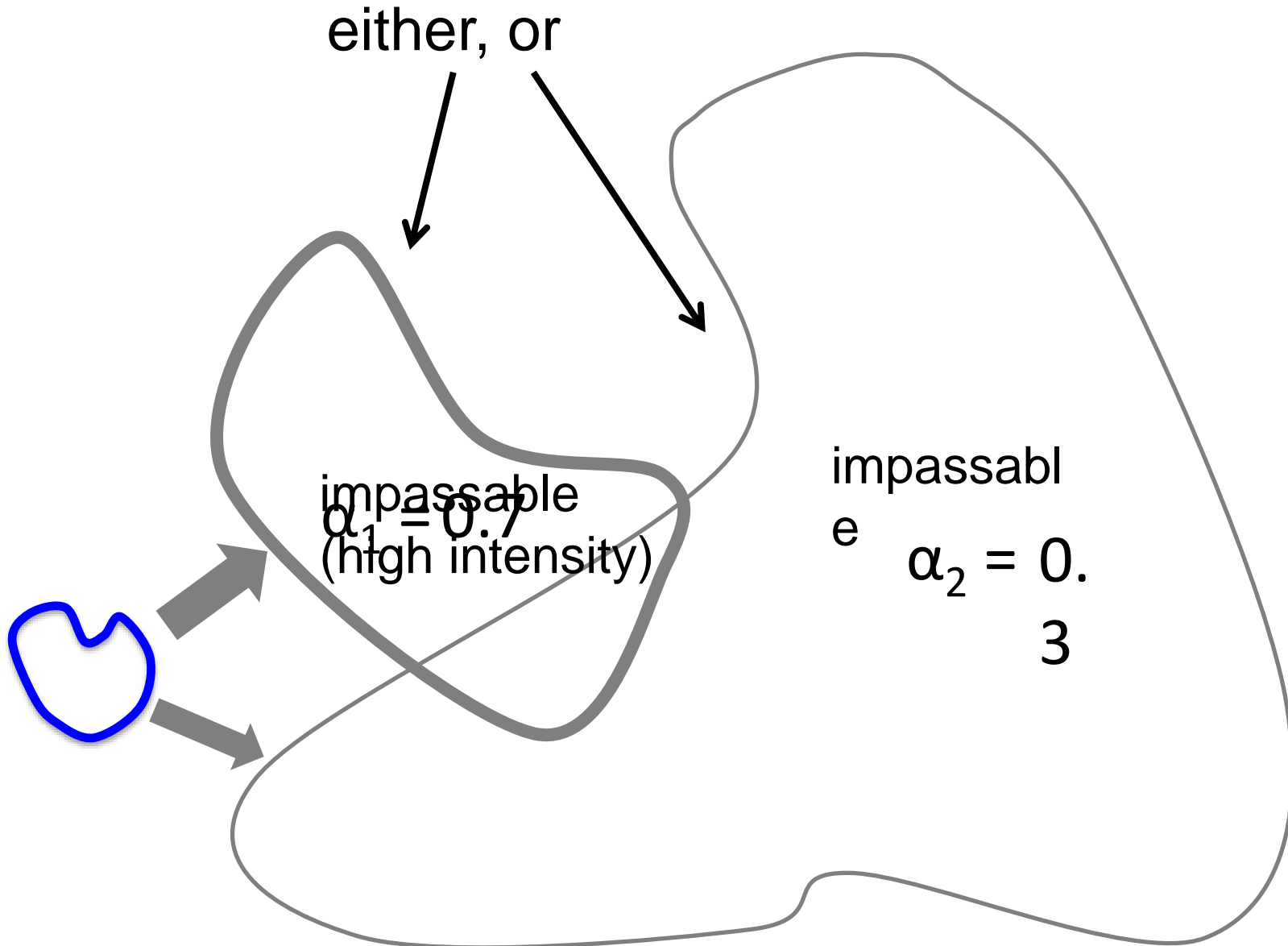


# Background

- Flight operators design the routes they wish to fly
- Air traffic service provider designs and implements re-routing around bad weather
- Strategic planning for re-routes around large weather systems is based on multi-hour weather forecasts
- Multi-hour weather forecasts have high uncertainty, but current products typically provide only the most likely instantiation of future weather



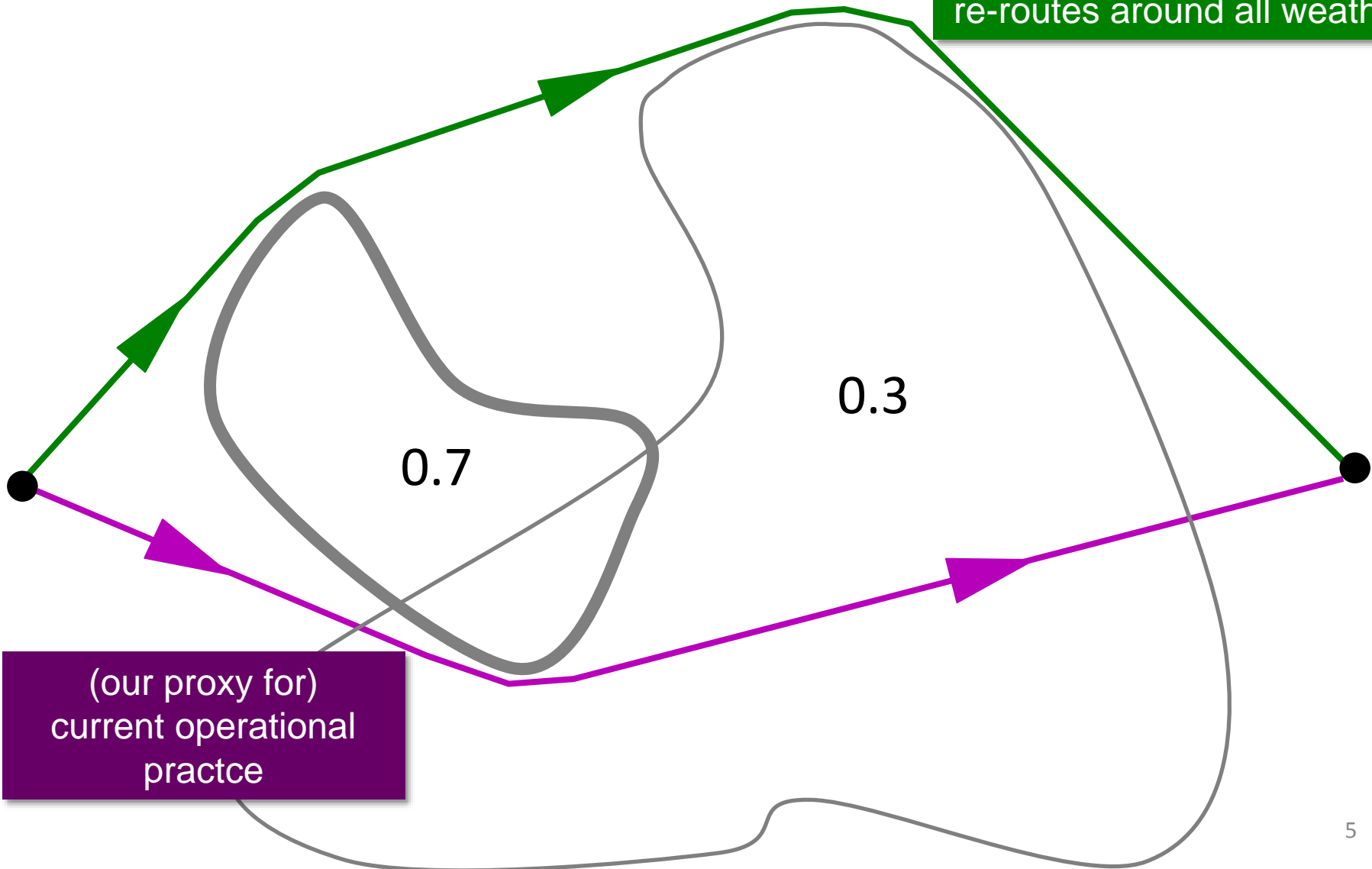
# Re-routing for Weather Avoidance





# Re-routing for Weather Avoidance

“deterministically safe”:  
re-routes around all weather



(our proxy for)  
current operational  
practice

# Motivation for Risk-Hedging



can incur high flight operation cost

can incur high cost for disruption of traffic operations

## Risk-hedged approach:

minimize a combination of these two costs (later slide)

- “Risk” refers to risk of disruption caused by tactical re-routing; hence a path has high risk if a large segment lies within a weather instantiation of high likelihood
- Research is far term: assumes ensemble weather forecast with multiple (instantiations + likelihoods)
- CDM (Collaborative Decision Making) Convective Forecast Planning (CCFP) currently provides a rudimentary version of the desired capability

# Example CCFP Advisory

EXPERIMENTAL CDM CONVECTIVE FORECAST PLANNING GUIDANCE

VALID: 2100 UTC THU 19 MAY 2016



AVIATION WEATHER CENTER (NOAA/NWS/NCEP)

ISSUED: 1900 UTC THU 19 MAY 2016

		<b>CONFIDENCE:</b>		<b>HEIGHT</b>	
		LOW	HIGH	<b>TOPS: 100's OF FEET MSL</b>	
		25-49%	50-100%	25000 - 29000	<b>290</b>
<b>CONVECTIVE COVERAGE:</b>	SPARSE			30000 - 34000	<b>340</b>
	25-39%			35000 - 39000	<b>390</b>
	MEDIUM+			40000+	<b>&gt;400</b>
	40-100%				



# Risk-Adjusted Field

$$P = 1 / (1 - \Sigma \alpha_i)$$

$$P = \frac{1}{1 - 0.6}$$

$$\alpha_1 = 0.6$$

$$P = \frac{1}{1 - (0.6 + 0.1)}$$

$$P = \frac{1}{1 - 0.1}$$

$$\alpha_2 = 0.1$$

$$P = \frac{1}{1 - 0.3}$$

$$\alpha_3 = 0.3$$

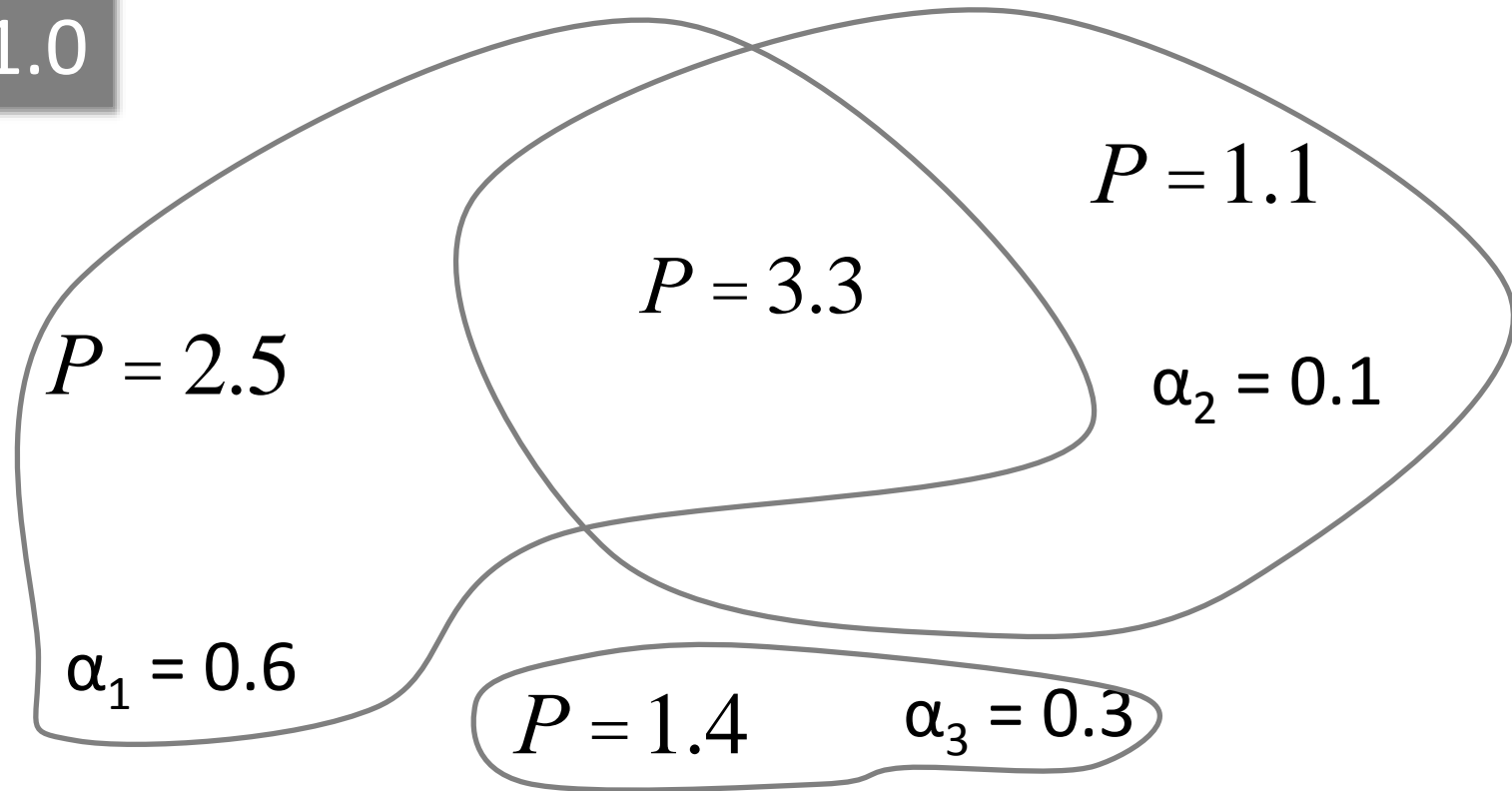




# Risk-Adjusted Field

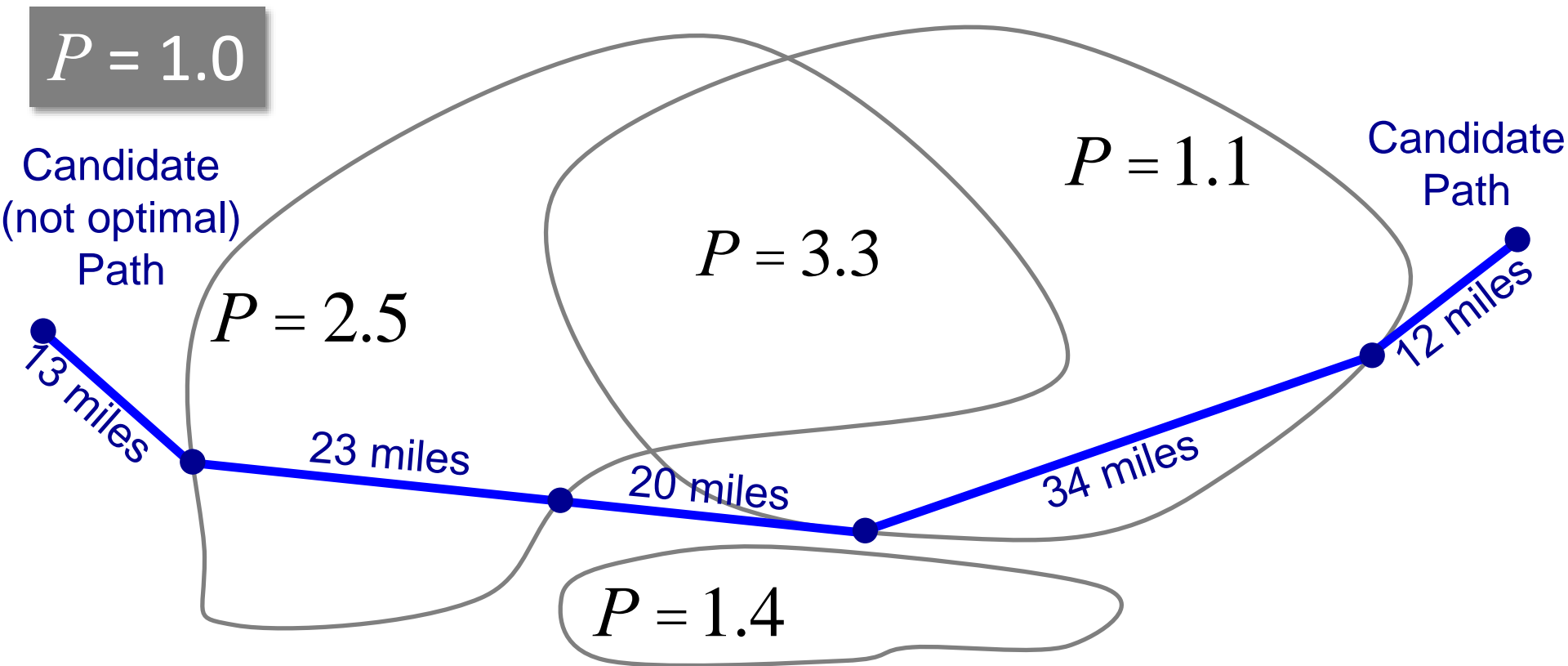
$$P = 1 / (1 - \sum \alpha_i)$$

$$P = 1.0$$





# Risk-Adjusted Path Length: the minimization objective



Risk-adjusted path length =  
 $(1 \times 13 + 2.5 \times 23 + 1 \times 20 + 1.1 \times 34 + 1 \times 12) = 130.9$  miles



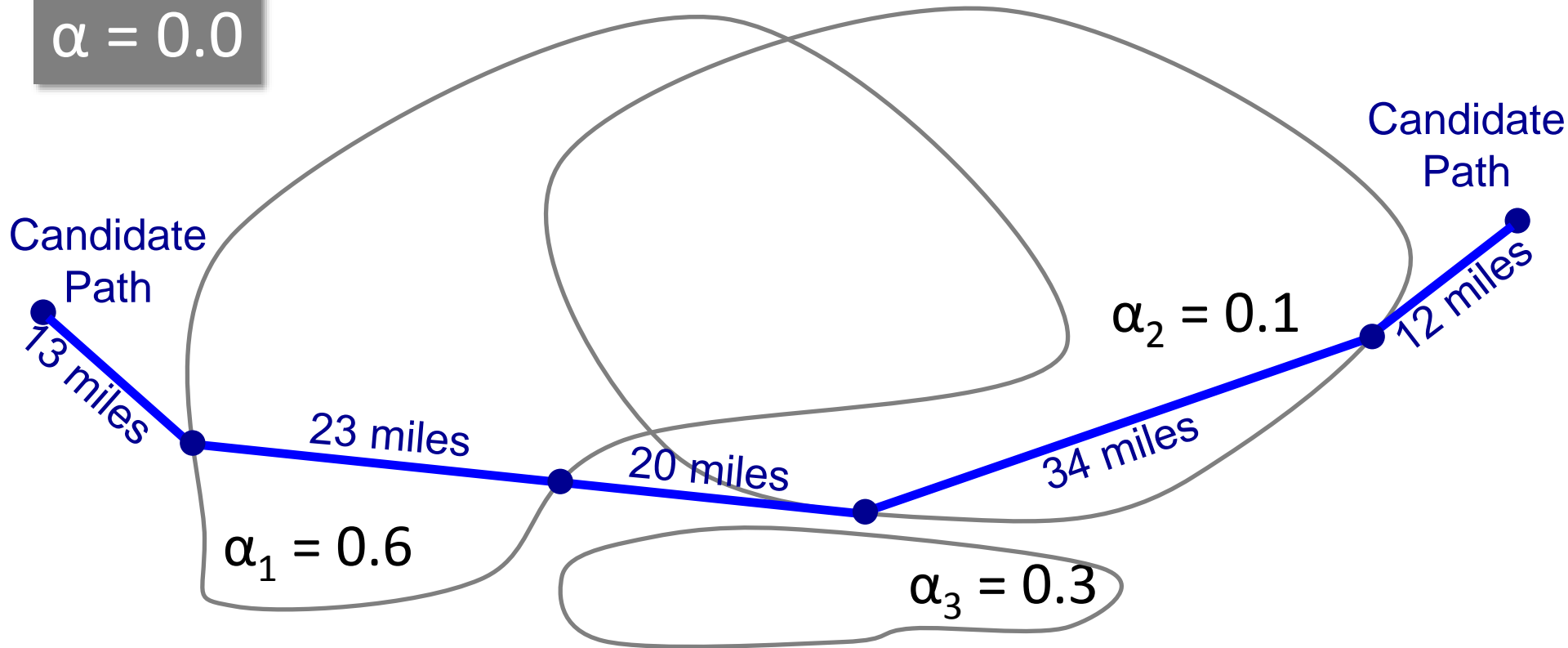
# Risk-Hedged Re-routing

- Compute re-routes by minimizing risk-adjusted path length
- Evaluate the computed re-routing using these metrics:
  - Path length (proxy for flight operation cost)
  - Path risk (defined on next slide)



# Path Risk: an evaluation metric

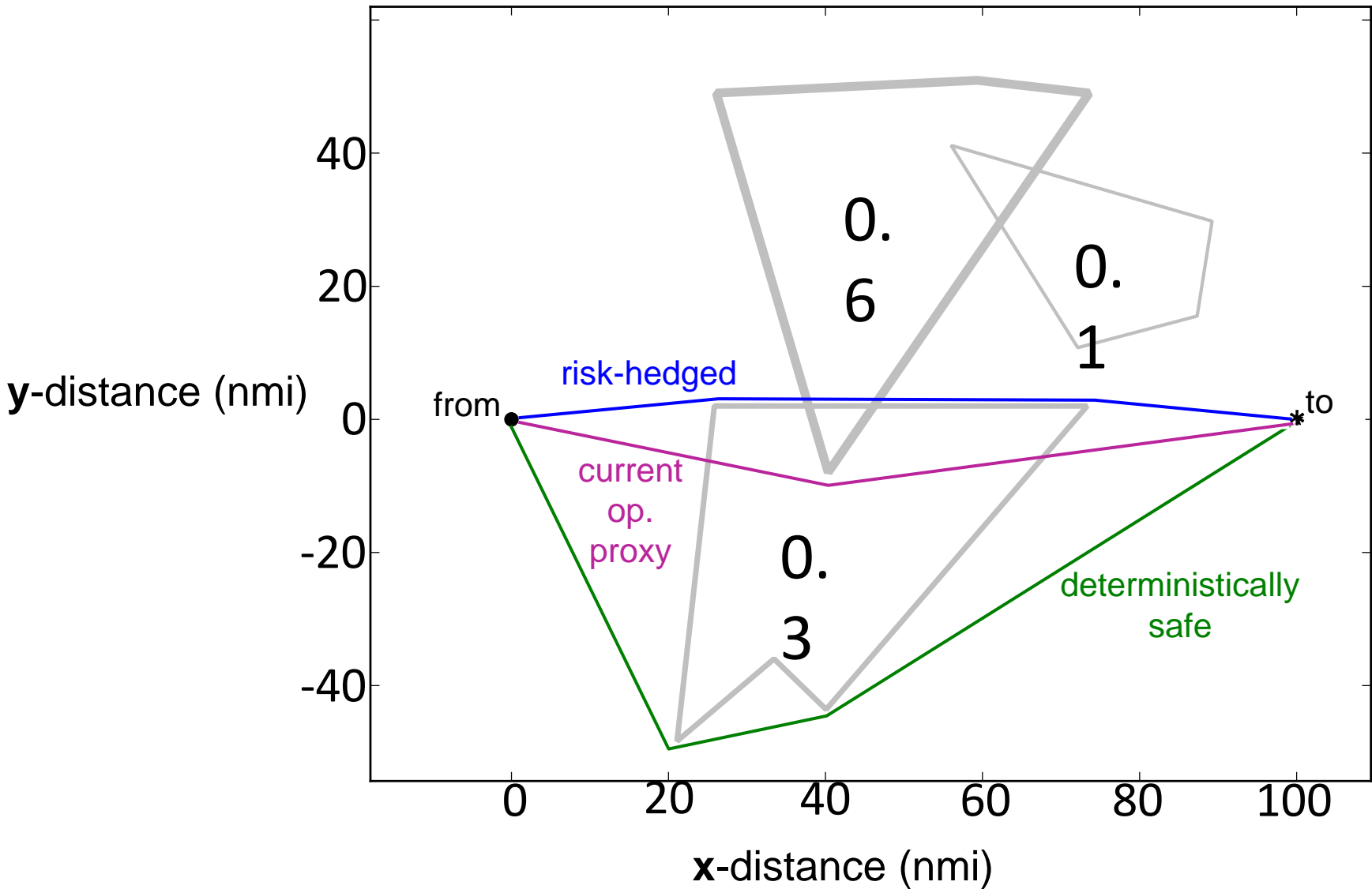
$\alpha = 0.0$



Path Risk =

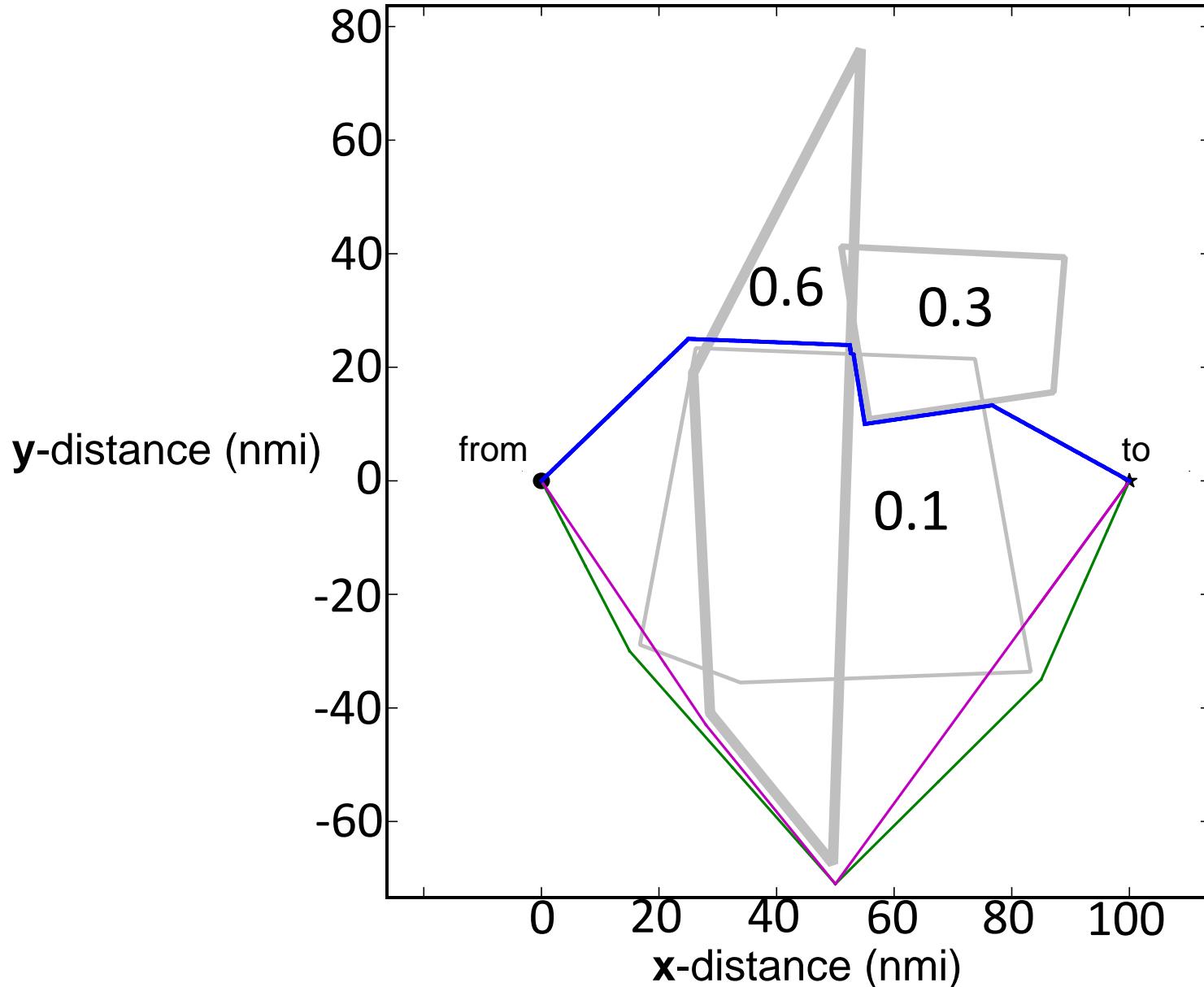
$$(0 \times 13 + 0.6 \times 23 + 0 \times 20 + 0.1 \times 34 + 0 \times 12) / (13 + 23 + 20 + 34 + 12) = 0.17$$

# Re-routing Options – Example #1



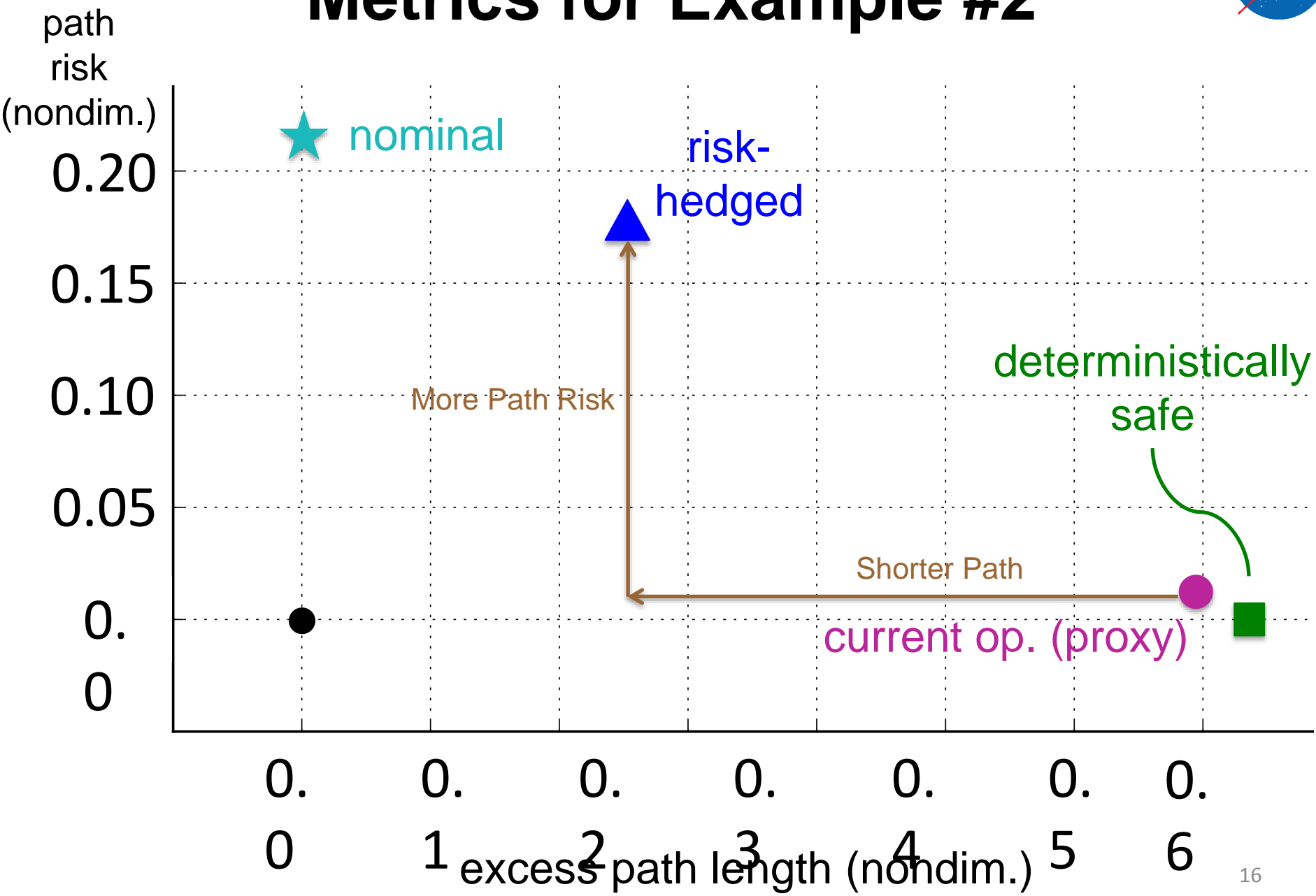


# Re-routing Options – Example #2





# Metrics for Example #2







# Conclusion

- In some weather avoidance scenarios, the risk-hedged re-routing is shorter and less risky than operational practice
- In other scenarios, risk-hedged re-routing can be:
  - Less risky, but has a longer path
  - More risky, but has a shorter path
- Potential application to re-routing for weather avoidance:
  - Compute risk-hedged path
  - Compare with operational-practice path for risk and path length
  - Choose risk-hedged path if both safer and shorter



# Backup Slides



# Minimization problem: the Eikonal equation

$$\frac{1}{P(x)} \left| \text{grad} \left( \text{min. cost to endpoint from } x \right) \right| = 1$$

# Example Playbook Re-routing

## Play: LEV EAST 1

East-bound flows from ZLA, ZAB, ZFW, ZHU are merged and then split into two flows going to DC and NYC airports

