

# Developing a Risk Index for Predicting Fatality in Aviation Crashes

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# Collaborators

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# Background

- **Most aviation crashes survivable**
- **Risk factors for fatality**
  - Fire
  - Adverse weather
  - Location
  - Time of day
  - Type of aircraft (plane vs. copter, # of engines)
  - Not wearing safety restraints
  - Older age, male, less than 1000 total flight hours

**Li & Baker 1993; 1999; Krebs et al 1995; Rostykus et al 1998;  
Grabowski et al 2002; O'Hare et al 2003; Ozdogan et al 2005; Baker et al 2006**

# Objective

- To assess the validity of a simple risk index for predicting fatality in aviation crashes.

# WHY a Risk Index for Aviation Crash Fatality?

- Tool for aviation safety research
- Risk management
- Informing safety practice and policy

# FIA Score

**Fire** (1, yes; 0, no)

**Instrument meteorological conditions** (1, IMC; 0, VMC)

**Away from airport** (1, off-airport; 0, on-airport)

# DCA06MA064

08/27/2006, Part 121 flight crashed in KY at 6:07 am outside of the airport, post-crash fire, visual weather condition, 49 fatalities and 1 serious injury.

**FIA Score = 2**

# NYC99MA178

07/16/1999, GA crashed at 9:41pm over water 40 miles from Martha's Vineyard; VMC, no fire, 3 fatalities.

**FIA Score = 1**



# Methods – Data Source

- National Transportation Safety Board (NTSB) aviation crash surveillance system
  - Recorded 53, 687 Aviation crashes (1983-2005)
  - Excluded aviation crashes
    - 1, 896 crashes involving gliders, balloons, blimps/dirigibles, ultra lights, gyroplanes.
    - 4, 735 crashes involving flight operations other than major airlines (14 CFR Part 121), commuters and air taxis (14 CFR Part 135), and general aviation (14 CFR Part 91).
    - 2, 228 crashes (5%) missing values on fire, IMC, crash location.
    - 11 crashes for other reasons (e.g., terrorist attacks and bomb threats)

**Final study sample → 44, 828 crashes**

# Methods - Analysis

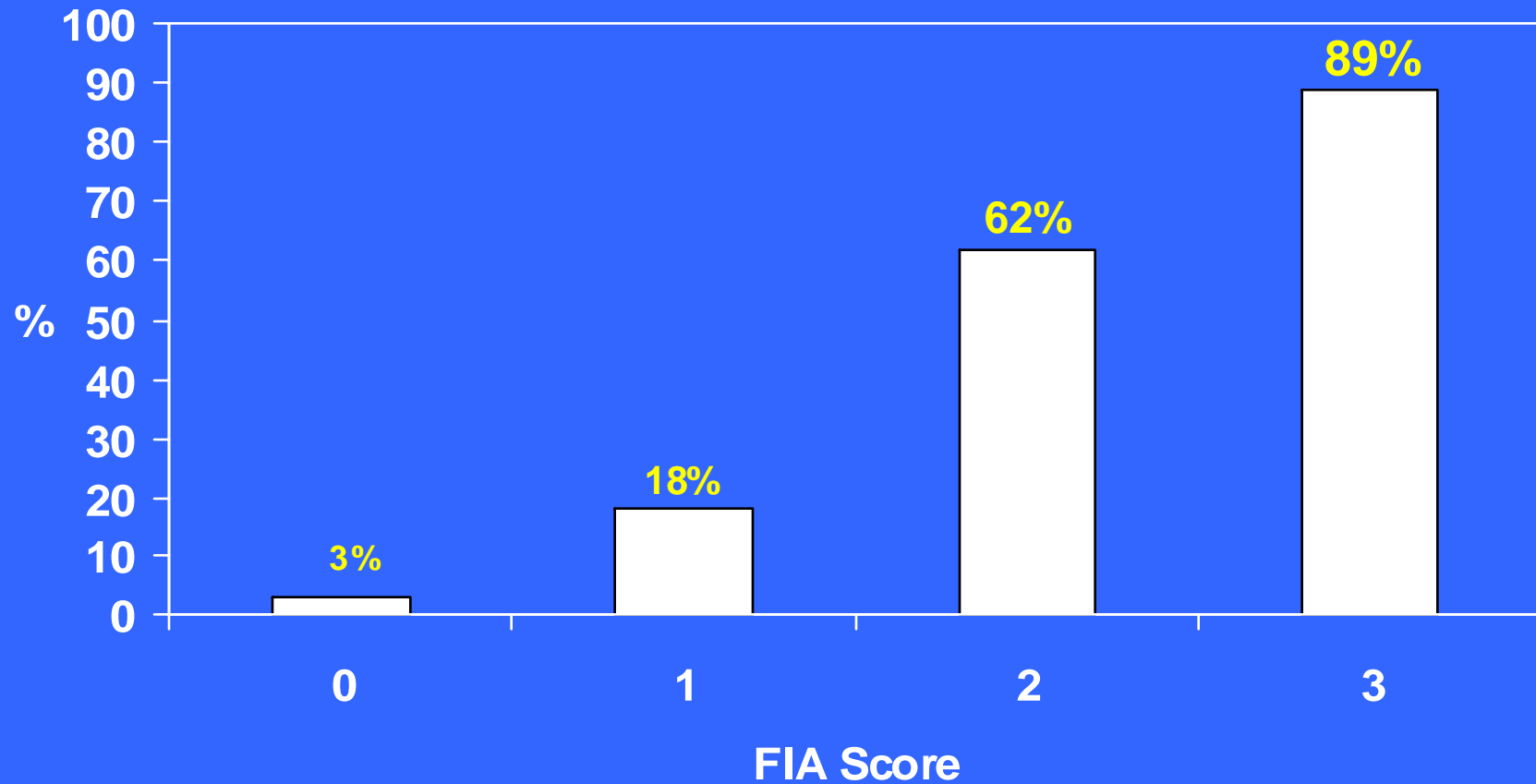
- Risk factors verification
- FIA Score
- Sensitivity & Specificity
- Area under the Receiver operating characteristics (ROC) curve
- Pilot Fatality and Any Fatality
- Different types of flight

# RESULTS

# Pilot Crash Fatality Rate by Flight Category

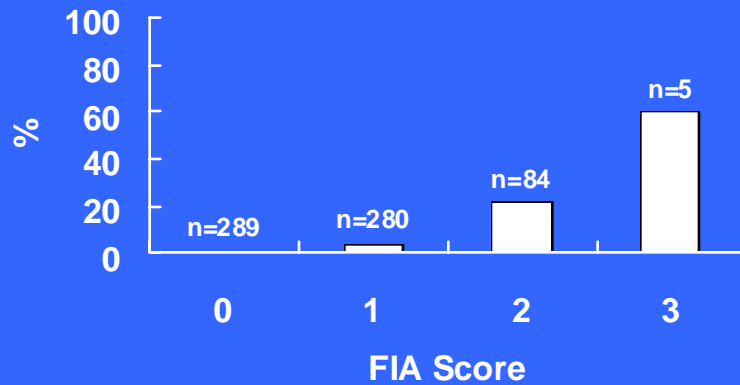
Part 121	5%
Part 135	20%
Part 91	18%
<b>Total</b>	<b>18%</b>

# Pilot Crash Fatality Rate by FIA Score

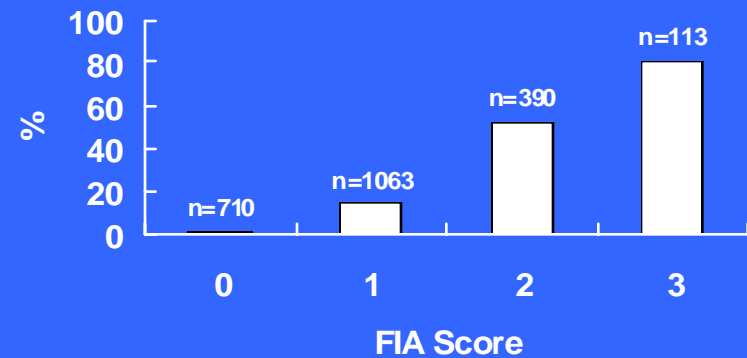


# Pilot crash fatality rates by FIA score United States, 1983-2005

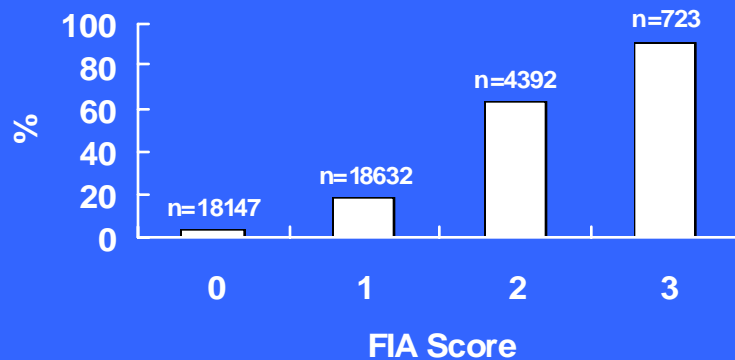
## Major Airline Crashes



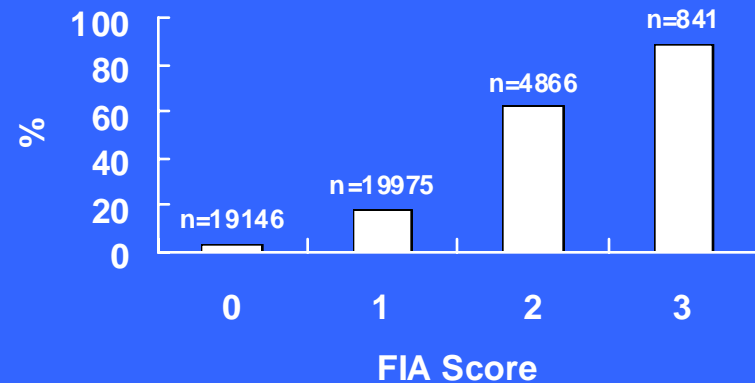
## Commuter Air Taxi Crashes



## General Aviation Crashes

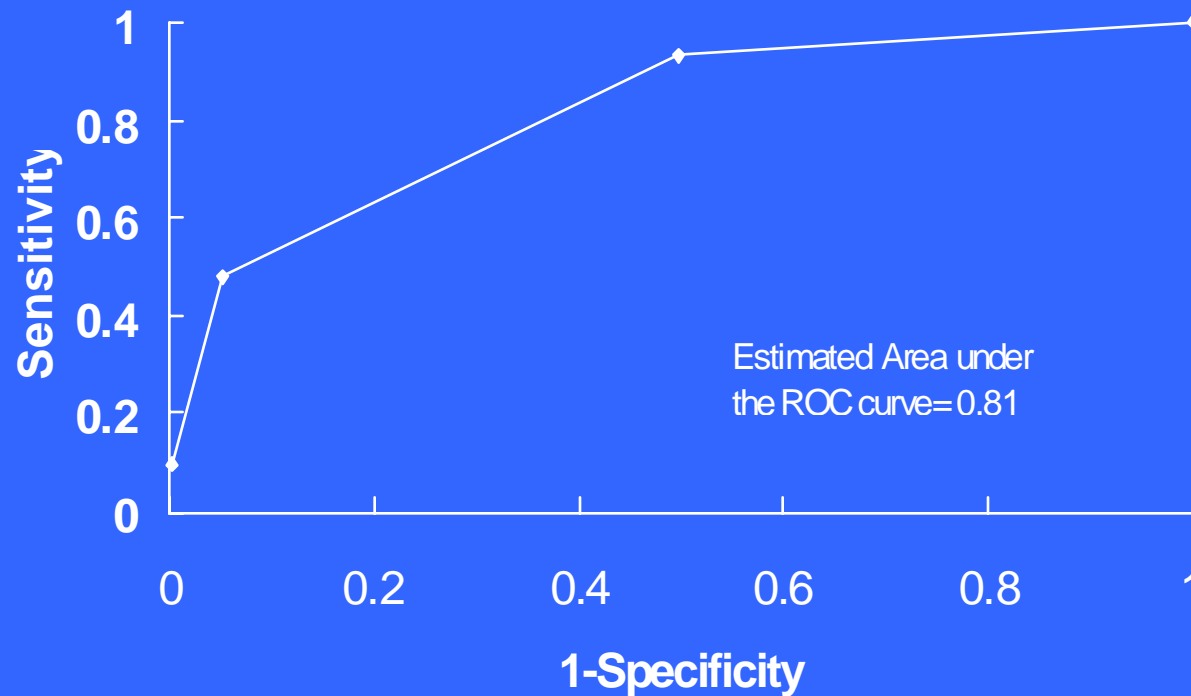


## All Aviation Crashes



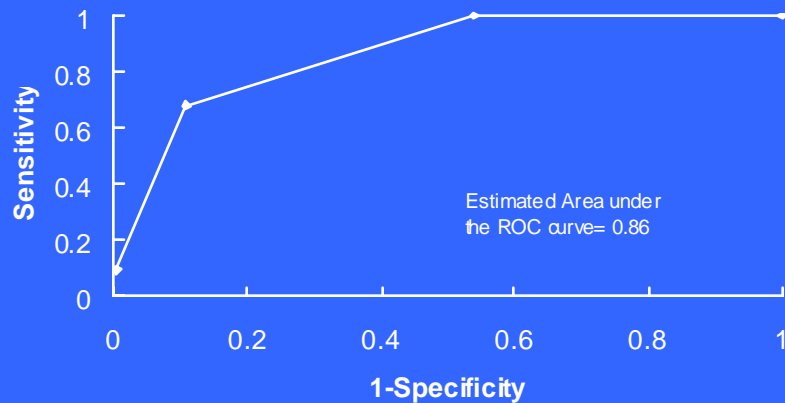
# Receiver Operating Characteristic Curve

## All Aviation Crashes 1983-2005

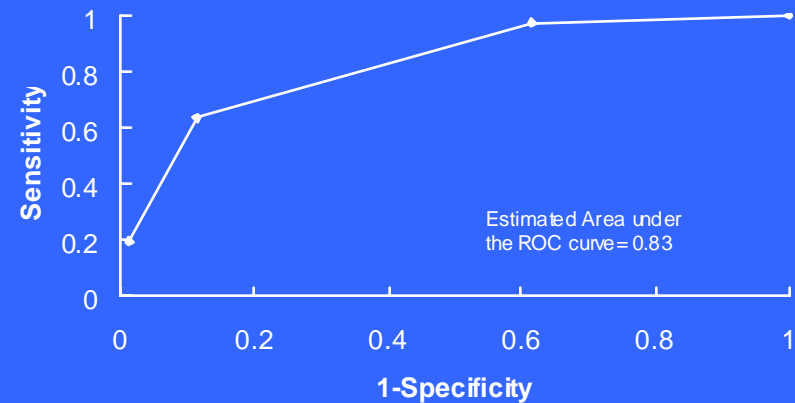


# Area under the ROC curve of FIA score for predicting pilot fatality in aviation crashes

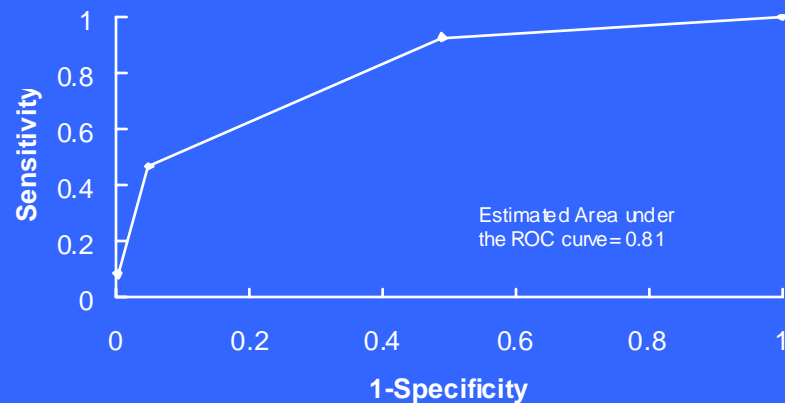
## Major Airline Crashes



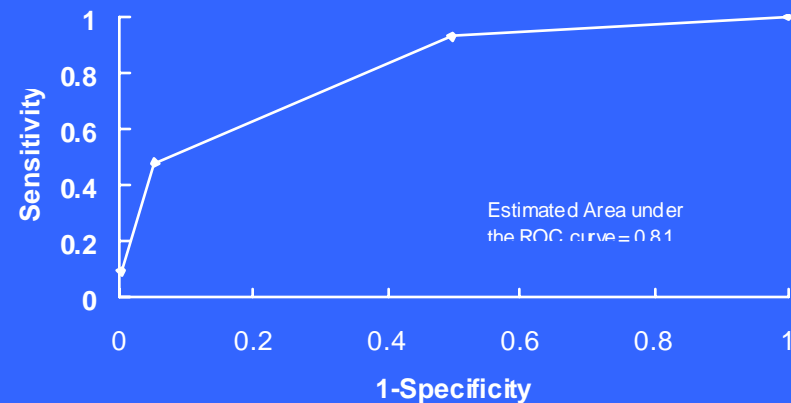
## Commuter Air Taxis Crashes



## General Aviation Crashes



## All Aviation Crashes





## Area under the ROC curve of FIA Score for predicting aviation crash fatality

Flight Operation	Pilot Fatality	Any Fatality
Marjor Airlines	0.86 (0.78, 0.95 )	0.82 (0.75, 0.90)
Commuter and Air Taxis	0.83 (0.80, 0.85)	0.82 (0.79, 0.84)
General Aviation	0.82 (0.81, 0.82 )	0.81 (0.81, 0.82)
Total (all parts)	0.81 (0.81, 0.82 )	0.81 (0.81, 0.82)

# Limitations

- Other risk factors not included
- Risk factors may change over time
- Prospective validation needed

# Conclusion

- FIA score is a valid tool for measuring aviation crash fatality risk across different flight operations

# Area under the ROC curve for alternative FIA scoring schemes in predicting pilot-in-command fatality

Flight Operation	4-point FIA	5-point FIA	6-point FIA
Major Airlines	0.86 (0.78, 0.95 )	0.92 ( 0.85, 0.83 )	0.93 ( 0.86, 0.99)
Commuter and Air Taxis	0.83 (0.80, 0.85)	0.84 ( 0.82, 0.86)	0.84 ( 0.82, 0.86)
General Aviation	0.82 (0.81, 0.82 )	0.82 ( 0.81, 0.83)	0.82 ( 0.81, 0.82)
Total (all parts)	0.81 (0.81, 0.82 )	0.82 ( 0.81, 0.83)	0.82 (0.81, 0.82)

# How could FIA be used?

- Measure of crash severity
- Proxy of impact force
- Tool for safety program development and evaluation

# Comparison of pilot-in-command and any fatality by risk factors

Risk Factors	Pilot-in-command Fatality				Any Fatality				
		Number of Crashes	Pilots Killed	CFR (%)	P-value	Number of Crashes	Persons Killed	CFR (%)	P-value
Aircraft Fire	Yes	4675	2880	61.6		4675	3024	64.7	
	No	40153	5009	12.5	<0.0001	40153	5508	13.7	<0.0001
Basic Weather Condition	Instrument	3804	2173	57.1		3804	2265	59.5	
	Visual	41024	5716	13.9	<0.0001	41024	6267	15.3	<0.0001
Location of crash	Away from airport	23751	6828	28.7	<0.0001	23751	7349	30.9	<0.0001
	On airport	21077	1061	5.0		21077	1183	5.6	
Total		44828	7889	17.6		44828	7889	17.6	

# Pilot crash fatality rate by alternative FIA scoring schemes

FIA Score	Major Airlines			Commuters and air taxis			General Aviation			Total		
	4 Point	5 Point	6 Point	4 Point	5 Point	6 Point	4 Point	5 Point	6 Point	4 Point	5 Point	6 Point
0	0.0	0.0	0.0	1.8	1.8	1.8	2.9	2.9	2.9	2.8	2.8	2.8
1	3.6	1.7	1.7	14.6	13.1	13.1	18.2	17.2	17.2	17.8	16.8	16.8
2	21.4	7.8	3.6	52.1	38.8	40.8	64.0	52.6	62.2	62.3	50.1	58.8
3	60.0	55.2	12.8	81.4	65.4	33.3	89.6	65.4	35.0	89.3	50.2	34.0
4	na	60.0	55.2	na	81.4	65.4	na	90.7	65.4	na	89.3	65.3
5	na	na	60.0	na	na	81.4	na	na	90.7	na	na	89.3

# FIA Score

- Simple composite score of aviation fatality risk factors

— **F**<sub>ire</sub>

— **I**<sub>MC</sub>

— **N**<sub>ight (??)</sub>

— **A**<sub>way from Airport</sub>



# METHODS-Development of FIA Score

	Death	Total Pilot in Command	Crash Events	CFR (%)
	Absence of ALL risk factors			
	617	19857		3.11
	Presence of ONE key risk factor			
Fire	423	1233		34.31
Instrument	62	635		9.76
Airport	3501	21200		16.51
	Presence of TWO key risk factors			
FI	51	98		52.04
FA	1845	3025		60.99
IA	1323	2201		60.11
	Presence of THREE key risk factors			
FIA	755	828		91.18
	Presence of FOUR key risk factors			
FINA	289	335		86.27

# Sensitivity and specificity of FIA score for predicting pilot crash fatality

FIA Score	Major Airlines		Commuters and air taxis		General Aviation		Total	
	Sensitivity	Specificity	Sensitivity	Specificity	Sensitivity	Specificity	Sensitivity	Specificity
0	1	0	1	0	1	0	1	0
1	1	0.44	0.97	0.31	0.92	0.43	0.93	0.42
2	0.68	0.87	0.64	0.78	0.45	0.88	0.47	0.87
3	0.1	0.99	0.2	0.95	0.09	0.98	0.09	0.98