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Accident-Precipitating Factors for Crashes in Turbine-Powered General Aviation Aircraft

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Short Title- accidents in turbine engine aircraft.

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18 **ABSTRACT**

19 General aviation (14CFR Part 91) accounts for 83% of civil aviation fatalities. While
20 much research has focused on accident causes/pilot demographics in this aviation sector,
21 studies to identify factors leading up to the crash (accident-precipitating factors) are few.
22 Such information could inform on pre-emptive remedial action. With this in mind and
23 considering the paucity of research on turbine-powered aircraft accidents the study
24 objectives were to identify accident-precipitating factors and determine if the accident rate
25 has changed over time for such aircraft operating under 14CFR Part 91.

26 The NTSB Access database was queried for accidents in airplanes (<12,501 lb)
27 powered by 1-2 turbine engines and occurring between 1989 and 2013. We developed and
28 utilized an accident-precipitating factor taxonomy. Statistical analyses employed logistic
29 regression, contingency tables and a generalized linear model with Poisson distribution.

30 The “Checklist/Flight Manual Not Followed” was the most frequent accident-
31 precipitating factor category and carried an excess risk (OR 2.34) for an accident with a fatal
32 and/or serious occupant injury. This elevated risk reflected an over-representation of
33 accidents with fatal and/or serious injury outcomes ($p < 0.001$) in the “non-adherence to V
34 Speeds” sub-category. For accidents grouped in the “Inadequate Pre-Flight
35 Planning/Inspection/Procedure” the “inadequate weather planning” sub-category accounted
36 ($p = 0.036$) for the elevated risk (OR 2.22) of an accident involving fatal and/or serious
37 injuries. The “Violation FARs/AIM Deviation” category was also associated with a greater risk
38 for fatal and/or serious injury (OR 2.59) with “Descent below the MDA/failure to execute the
39 missed approach” representing the largest sub-category. Accidents in multi-engine aircraft
40 are more frequent than their single engine counterparts and the decline (50%) in the turbine
41 aircraft accident rate over the study period was likely due, in part, to a 6 fold increased
42 representation of single engine airplanes.

43 In conclusion, our study is the first to identify novel precursive factors for accidents
44 involving turbine aircraft operating under 14CFR Part 91. This research highlights areas that

45 should receive further emphasis in training/recurrency in a pre-emptive attempt to nullify
46 candidate accident-precipitating factor(s).

47

48 KEYWORDS: general aviation accidents, accident-precipitating factors, turbine aircraft,
49 injury severity.

50

51 **1.0 INTRODUCTION**

52 General aviation is inclusive of all civilian aviation operations apart from those
53 involving paid passenger transport. 14CFR Part 91 represents a set of FAA regulations
54 governing the operation of light, non-commercial aircraft under the general aviation umbrella
55 within the United States (<http://www.ecfr.gov/cgi-bin/text-idx?node=14:2.0.1.3.10>). In
56 contrast, the corresponding 14CFR Part 121 and 135 regulations, apply to airlines and air-
57 taxi operations respectively, and are more stringent. While accidents for the airlines have
58 dramatically declined over the last 20 years (DeJohn et al., 2013; Li and Baker, 2007), such
59 a decrease has not been evident for general aviation although preliminary NTSB aviation
60 data (www.nts.gov/news/2014/140915b.html) show a decline in the accident rate for the
61 most recent year (2013). Nevertheless, general aviation still accounts for the overwhelming
62 majority (83%) of civil aviation fatalities across the United States (Bazargan and Guzhva,
63 2011). Furthermore, accidents in this sector carry an associated annual cost of \$1.6-4.6
64 billion to individuals and institutions affected (e.g. family and non-family incurring injury
65 and/or loss of life, insurance companies, accident investigation costs) inclusive of hospital
66 costs, loss of pay with a fatal accident and loss of the aircraft (Sobieralski, 2013). It should
67 be emphasized that these costs do not include litigation expenditures.

68 Clearly, there is a need to reduce the high accident rate evident for general aviation.
69 In this regard, the NTSB, as part of its investigative process, assigns a probable cause to
70 every general aviation accident, for example; controlled flight into terrain (CFIT), spatial
71 disorientation, loss of control and pilot error (Li et al., 2001; Shkrum et al., 1996).
72 Noteworthy, loss of control tops the NTSB 2015 “most wanted list” for general aviation
73 (http://www.nts.gov/safety-/mwl/Documents/MWL_2015_brochure.pdf). Nevertheless, it is
74 equally important to recognize that accidents are the culmination of one, or more, precursive
75 factor(s). In fact, across the aviation industry, including airline operations and maintenance
76 (Rankin et al., 2000), there has been an increasing shift towards identifying precursive
77 elements by way of programs such as the flight operational quality assurance safety
78 program (http://www.faa.gov/about/initiatives-/atos/air_carrier/foqa/). However, for general

79 aviation, studies of pre-accident factors have tended to focus on a limited set of variables
80 such as weather and light conditions (Ballard et al., 2013; Bazargan and Guzhva, 2007).
81 Rather, greater emphasis has been placed on determining: (a) the accident cause (Boyd,
82 2015a; Shao et al., 2014a) (b) pilot flight history/experience/demographics (Bazargan and
83 Guzhva, 2011; Bennett and Schwirzke, 1992; Groff and Price, 2006; Li et al., 2001; Li et al.,
84 2005; Li and Baker, 1999) and (c) post-accident circumstances (e.g. whether the accident
85 was on or off-airport (Ballard et al., 2013; Li and Baker, 1999; Rostykus et al., 1998) or
86 involved a post-impact fire (Ballard et al., 2013; Handel and Yackel, 2011; Li and Baker,
87 1999)).

88 General aviation is comprised mainly of piston-driven aircraft with turbine (inclusive of
89 turboprop and turbojet) aircraft representing the minority. However, in terms of operations,
90 annual flight hours for turboprop aircraft represent 17% of the total flight hours for the
91 combined piston/turboprop fleet operating under Part 91 (2013 General Aviation
92 Manufacturer's Association (GAMA) Statistical Databook). Since turbine engine aircraft
93 represent the minority, it is not surprising that most studies on general aviation accidents
94 either aggregate aircraft, irrespective of their type of power plant, or focus exclusively on
95 piston-engine aircraft (Boyd, 2015a; Boyd, 2015b; Shao et al., 2014a; Shao et al., 2014b).
96 However, caution should be exercised in using findings from such studies to inform on
97 accidents involving gas-turbine-powered aircraft for several reasons. First, turbine-powered
98 aircraft are able to fly at higher altitude where there is less control authority of the flight
99 control surfaces due to the thinner air (Brown and Holt, 2012). Second, at higher altitudes,
100 there is a greater potential for icing, high level wind shear (associated with jet stream)
101 ([http://www.faa.gov/other_visit/aviation- industry/airline_operators/training/media-
102 /Appendix_3-E_HighAlt-Operations.pdf](http://www.faa.gov/other_visit/aviation-industry/airline_operators/training/media-
102 /Appendix_3-E_HighAlt-Operations.pdf)) and hypoxia. Indeed, 14CFR§61.31 mandate that
103 airmen flying aircraft at altitudes in excess of 25,000 feet (FL250) in pressurized aircraft
104 receive training in the critical factors relating to safe flight operations. Finally, turbine engines
105 have longer engine response (spool up) times compared with their piston-counterparts - an
106 issue important for balked landings and or missed approaches.

107 Considering these gaps in knowledge, the objectives of our study were two-fold (a)
108 identify the accident-precipitating (also referred herein to as accident-precursive) factors
109 leading to fatal accidents in turbine aircraft operating under 14CFR Part 91 and (b)
110 determine if the fatal and all accident rate for turbine aircraft operating under these
111 regulations has changed over the past 25 years.

112 **2.0 MATERIALS AND METHODS**

113 2.1. Database and Query

114 The NTSB (2015 March release) Access database was downloaded
115 (<http://www.nts.gov/avdata/Access/>) and queried for accidents (operating under 14CFR
116 Part 091) involving aircraft (<12,501 lb) (airplane category) powered by 1-2 turbine engines
117 (horsepower 250-2501) and occurring across the 1989-2013 period. Accidents for which the
118 following type of operations were being conducted were deleted: flights involving ferry
119 operations, flight instruction, skydiving, flight tests, public utility, aerial observation and air
120 shows. Additionally the following types of accidents were also excluded: ground personnel
121 handling of aircraft, a motor vehicle collision with aircraft; during taxiing, injuries external to
122 the aircraft, preliminary accident reports, stationary aircraft, illegal/criminal flights, aerobatics,
123 aerial applications, accidents outside of the U.S. for which a NTSB report was not issued,
124 and where there was lack of agreement by NTSB members as to the final report.

125 Data were exported to Excel and, where applicable, de-duplicated in that program.
126 This strategy returned 551 accidents. A fatal accident was defined as any in which one, or
127 more, occupants perished within 30 days of the accident (Code of Federal Regulations-
128 49CFR830.2). Serious injuries were defined as per NTSB Form 6120.1
129 (http://www.nts.gov/doclib/forms/6120_1web_nopwx.pdf). Minor injuries are defined as any
130 injury that does not meet the criteria for another injury category per the aforementioned
131 NTSB form 6120. Of 551 accidents, 313 involved accidents for which occupants sustained
132 no and/or minor injuries while 238 involved occupants who sustained fatal and/or serious
133 injuries.

134 2.2 Taxonomy

135 We initially considered using the Human Factors and Classification System (HFACS)
136 (Shappell and Wiegmann, 2001) for our analysis. However, this application is best suited to
137 enterprises that have a strong organizational component such as Part 135 or Part 121
138 operations. Moreover, HFACS requires review of the primary unpublished data for which we
139 had no access to. Accordingly we developed our own taxonomy based on an analysis of the
140 NTSB synopsis and factual report corresponding to approximately 100 records. Accident-
141 precipitating factors included, but were not limited to, the subset of contributing factors that
142 temporally preceded the accident cited by the NTSB in its current synopsis. In this way, a
143 schema of 17 individual or grouped accident-precipitating factors was developed by the co-
144 authors (both subject matter experts). All 551 accidents were subsequently classified per the
145 aforementioned taxonomy. Disagreements as to the assignment of a particular accident-
146 precipitating factor or category for an event were discussed until consensus was reached.

147 2.3 Statistics

148 All statistical analyses were performed using the SPSS (version 22) software
149 package. Multi-variable logistic regression was used to identify accident-precipitating factors
150 for crashes with fatal and/or serious injury outcomes. Backward elimination, based on a
151 likelihood ratio test, was first used to eliminate non-contributing variables ($p > 0.05$) to
152 produce the most parsimonious model but still satisfying the criterion of 10 or more events
153 per variable (Peduzzi et al., 1996). A check for the biasing effect of collinearity in the
154 reduced, multi-variable model revealed variance inflation factor values of less than 10
155 mitigating this concern (Myers, 1990).

156 Contingency tables employed Pearson Chi-Square to determine if there was an
157 overall difference in proportions. P values for cells in multinomial tables were derived from
158 adjusted standardized residuals (Z-scores) in post-hoc testing.

159 To determine if accident rates differed from the earliest period (1989-1993), a
160 generalized linear model with Poisson Distribution was employed adjusting for differences in
161 annual turbine fleet flight times for 14CFR Part 91 operations. Sources of fleet activity were:

162 for post-1999, the FAA (https://www.faa.gov/data_research/-
163 [aviation_data_statistics/general_aviation/](https://www.faa.gov/data_research/-aviation_data_statistics/general_aviation/)) and the 1989-1999 period, GAMA Statistical
164 Guides ([http://www.gama.-aero/media-center/industry-facts-and-statistics/statistical-](http://www.gama.-aero/media-center/industry-facts-and-statistics/statistical-databook-and-industry-outlook)
165 [databook-and-industry-outlook](http://www.gama.-aero/media-center/industry-facts-and-statistics/statistical-databook-and-industry-outlook)).

166 **3.0 RESULTS**

167 3.1 Accident-Precipitating Factor Categories.

168 The NTSB Access database was queried for accidents in aircraft (<12,501 lb)
169 powered by 1-2 turbine engines and operating under 14CFR Part 91 rules for the period
170 spanning 1989-2013. This search returned 551 accidents of which 87% involved turbo-prop;
171 the remaining were comprised of turbojet-powered aircraft. Of the 551 accidents 313 and
172 238 involved no/minor injuries and fatal/serious injuries respectively. Based on an analysis of
173 the NTSB synopsis and factual report for approximately 100 records, a total of 17 accident-
174 precipitating factor/categories were derived (Table 1) and used subsequently to categorize
175 all 551 crashes.

176 We then sought to identify which of these accident-precipitating factors/categories
177 carried an increased risk for an accident with a fatal and/or serious injury outcome. As a first
178 step in this direction, all 17 accident-precipitating factors/categories were subjected to
179 backward elimination (based on a likelihood ratio test) in logistic regression to eliminate non-
180 contributing variables (Field, 2009) ($p>0.05$). Using this approach, 11 accident-precipitating
181 factor/categories meeting this criterion were selected (Table 2). This reduced model was
182 used to quantify the increased risk (odds ratio or OR) of each variable for an accident with
183 fatal and/or serious injury outcome (Table 2) while adjusting for the effects of the other
184 variables. The reduced model predicted 74.8% correct compared with an overall percentage
185 of 56.8% by chance.

186 The “Checklist/Flight Manual Not Followed”, was the most frequent accident-
187 precipitating factor category (n=132) and carried an elevated risk (OR 2.34) for an accident
188 with a fatal and/or serious occupant injury. For accidents grouped in the “Inadequate Pre-

189 Flight Planning/Inspection/Procedure” or “Violation FARs/AIM Deviation” categories,
190 occupants were also at greater risk for fatal and/or serious injury (OR 2.22 and 2.59
191 respectively). While the “Lack of Experience/Systems Knowledge” and “Air Traffic
192 Control/Flight Service Station Deficiency” categories were implicated in fewer accidents,
193 nevertheless they also carried an increased risk of a fatal/and or serious injury outcome (OR
194 5.01 and 6.24 respectively).

195 3.2 Sub-Classification of Accident-Precipitating Factor Categories.

196 Due to the breadth of some of the accident-precursive factor categories, we sub-
197 classified three that carried an elevated risk of an accident with a fatal and/or serious injury
198 outcome: (a) Checklist/Flight Manual Not Followed” (b) “Inadequate Pre-Flight
199 Planning/Inspection/Procedure” and (c) FARs Violation/AIM Deviation. Note that the sum of
200 accidents across the sub-categories (Figures 1-3) is less than that cited for the
201 corresponding parent category (Table 2) as sub-groups with few accidents were excluded
202 from the former.

203 Regarding the “Checklist/Flight Manual Not Followed” category (OR 2.34), four sub-
204 groups were identified (Figure 1). Of these, the “non-adherence to V Speeds” was the most
205 prevalent sub-category (n=51). Accidents in this sub-group contributed significantly
206 ($p<0.001$) to the increased risk (OR 2.34) of accidents involving fatal and/or seriously injured
207 occupants for the parent category (“Checklist/Flight Manual Not Followed”). Conversely, and
208 perhaps not surprisingly, accidents grouped in the “landing gear non-extension/premature
209 retraction” sub-category carried a disproportionate fraction ($p<0.001$) of occupants
210 sustaining no and/or minor injuries.

211 The “Inadequate Pre-Flight Planning/Inspection/Procedure category” (OR 2.22) was
212 also sub-grouped (Figure 2). For both the “Fuel-Related” and the “Aircraft Pre-flight
213 Condition” sub-categories, accidents were evenly divided between those in which occupants
214 incurred fatal and/or serious injuries and those for which occupants sustained no and/or
215 minor injuries. On the other hand, post-hoc analysis of the sub-categories indicated that the
216 elevated risk of a fatal and/or serious injury outcome of the parent category was largely

217 accounted for by “inadequate weather planning” ($p=0.036$). This sub-category was
218 associated with a more than 3 fold increase in accidents with fatal and/or serious injury
219 outcomes.

220 We also sub-classified the FARs Violation/AIM Deviation (OR 2.59) category (Figure
221 3). The “Descent below the MDA/failure to execute the missed approach” represented the
222 largest sub-category of accidents ($n=27$) the majority (78%) of which resulted in fatal and/or
223 serious injuries. Not surprisingly, as this problem is well recognized in general aviation
224 (Kenny, 2012), flight from visual to instrument meteorological conditions constituted the
225 second most common sub-category and again most (91%) of these accidents yielded fatal
226 and/or serious injuries. In contrast, the overwhelming number (7 of 8) accidents grouped as
227 “failure to comply with scheduled Inspections/AD/SB,” involved no and/or minor injuries.

228 3.3 Other Accident-Precipitating Factors.

229 Several other accident-precursive factor categories were also associated with an
230 elevated risk for an accident involving fatal and/or serious injuries (Table 2). “Lack
231 Experience/Systems Knowledge,” an accident-precipitating factor category for 26 accidents
232 carried an Odds Ratio of 5.01 for a fatal and/or serious injury outcome. Similarly, deficiencies
233 on the part of Air Traffic Control or the Flight Service Station was cited as an accident-
234 precursive factor for only 14 accidents but nevertheless carried a high risk of an accident
235 with fatal and/or serious injuries (OR 6.24). Half of the accidents in this category involved the
236 lack of enroute advisories on adverse weather (convective or icing) or low-terrain alerts. Pilot
237 Physical/Drug Impairment/Incapacitation (OR 25.07) was also infrequent ($n=14$) and only 4
238 of these accidents were due to pilot incapacitation similar to the 1% rate (Li and Baker,
239 2007) reported elsewhere. Not surprisingly (Bazargan and Guzhva, 2007; Li and Baker,
240 1999), instrument meteorological conditions/convective weather (OR 5.28) and deficient
241 lighting conditions (OR 3.89) both carried an excess risk of an accident with fatal and/or
242 serious occupant injury.

243 On the other hand, the “Contaminated Runway” (OR 0.10), “Pilot Skill Deficiency”
244 (0.30) and “Aircraft Malfunction” (OR 0.49) categories all showed reduced risk of an accident

245 with a fatal and/or serious injury outcome. Alternatively stated, these accident-precipitating
246 factor categories were associated with an elevated chance for an outcome with no and/or
247 minor occupant injury. The findings with the first two accident-precursive factors were not
248 unexpected since accidents involving the landing and take-off roll rarely carry fatal injuries
249 (Kenny, 2012) and because we defined “Pilot Skill Deficiency” in context of this phase of
250 flight (see Table 1). The “Aircraft Malfunction” category comprised 127 events with landing
251 gear/brake system representing the largest subgroup (n=35) none of which culminated in
252 fatal and/or serious outcomes. Loss of engine power contributed 30 events with only a
253 minority (n= 10) resulting in fatal and/or serious injuries. These data parallel the general
254 aviation fleet, independent of powerplant, showing that the vast majority of accidents
255 involving a malfunction are non-fatal (Kenny, 2012).

256 3.4 Temporal Change in Turbine-Powered Aircraft Accident Rate and the Fraction of 257 Accidents with Fatal/Serious Injuries.

258 We then determined if accident rates in turbine aircraft operating under 14CFR Part
259 91 rules have changed over the 1989-2013 period of the current study. Indeed, adjusting for
260 the variations in annual turbine fleet activity conducted under 14CFR Part 91, a steady
261 decline in the accident rate was evident over the 25 year period (Figure 4-line graph).
262 Specifically, the accident rate for the 1989-1993 period was 4.3 (per million flight hours), but
263 declined by over 50% for the most recent (2009-2013) period. A generalized linear model
264 with Poisson distribution revealed that the difference between the first (1989-1993) and last
265 (2009-2013) periods was statistically significant ($p < 0.001$).

266 In contrast, the fraction of accidents corresponding to fatal and/or serious occupant
267 injury outcome was largely unchanged between the 1980-1993 (49%) and 1999-2003 (48%)
268 periods after which a decline was evident. For the most recent period (2009-2013) 29.7% of
269 accidents resulted in fatal and/or serious occupant injury. Post-hoc analysis indicated that for
270 the most recent time period the reduced fraction of accidents with fatal and/or serious injury
271 was statistically significant ($p = 0.005$).

272 3.5 Temporal Decrease in the Fraction of Accidents in Twin-Engine Turbine Aircraft.

273 We were curious as to the reason(s) underlying the decrease in all and fatal/serious
274 accident rates. Since we, and others (Boyd, 2015a; Kenny, 2012), have previously reported
275 both a higher all accident and fatal accident rate for multi-engine aircraft (albeit piston-
276 powered aircraft) we hypothesized that the aforementioned decrease may reflect a shift in
277 the proportion of accident aircraft from a twin to single engine configuration over time.
278 Indeed this proved to be the case (Figure 6). The percentage of accidents in single engine
279 turbine aircraft operating under 14CFR Part 91 steadily increased from 7% for the 1989-
280 1993 time frame to 46% for the most recent period (2009-2013). A Chi-Square test showed
281 that this shift in the overall distribution of twin/single engine aircraft accidents was statistically
282 significant (Pearson Chi-Square $p < 0.001$). We entertained the notion that the increased
283 representation of single engine aircraft accidents over time had the consequence of a lower
284 stall speed and hence a lesser impact force on occupants in an accident (impact force is a
285 function of the square of velocity (Freitas, 2014)). However our data (not shown) indicated
286 no statistical difference in stall speeds (V_{SO}) across the time periods.

287 **4.0 CONCLUSIONS**

288 Although there has been an increased focus on identifying accident-precursive
289 events for airline operations ((http://www.faa.gov/about/initiatives/atos-/air_carrier/foqa/) and
290 (Rankin et al., 2000)) there has been little corresponding effort for the general aviation
291 sector. Herein, in a study of crashes involving turbine-powered aircraft operating under
292 14CFR part 91 we have identified several novel accident-precipitating factors associated
293 with fatal and/or serious injury outcomes.

294 “Non-adherence to V speeds” was the most frequent accident-precipitating factor
295 within the “Checklist/Flight Manual Not Followed” category and carried the highest fraction of
296 accidents with a fatal and/or serious injury outcome. Operating at an inappropriate airspeed
297 could be due to either (a) intended/inadvertent deviation from published values or (b) not
298 recognizing that many of these specified values vary under a range of loading/configuration
299 and/or ambient conditions (e.g. increased bank angle results in an increased stall speed).

300 However, NTSB reports lack data that would allow us to determine which of these two
301 scenarios were applicable to the airman involved in a particular accident.

302 The limitations of V speeds and importantly pilot knowledge (or lack thereof) on this
303 topic deserve discussion. In context of aerodynamic stalls, V speeds are surrogates for
304 angle of attack and stalls can occur at any speed. Installation of angle of attack indicators, as
305 advocated by the NTSB (http://www.nts.gov/safety/-mwl/Pages/mwl7_2015.aspx), is one
306 strategy that should mitigate accidents caused by aerodynamic stalls. For operations in
307 turbulence, while reducing speed to prevent over-stress of the airframe is well recognized,
308 again, the target speed to be achieved warrants comment. A common practice, at least for
309 light aircraft (<12,500 lbs), is to reduce airspeed to maneuvering speed (V_A) a value
310 specified in the flight manual (only a subset of aircraft flight manuals reference a turbulence-
311 penetration speed $-V_B$). However this approach is fraught with limitations since (a) airspeed
312 fluctuates in turbulence (Schiff, 2001) and any attempt to achieve V_A will result in an over-
313 speed condition and (b) V_A decreases with lower aircraft weight and flight manuals may
314 specify only that speed corresponding to maximum weight. Equally important for flight in
315 turbulence, adherence to the appropriate V speed may still not protect against structural
316 failure in the event of simultaneous control inputs in different axes
317 ([http://www.faa.gov/regulations_policies/-](http://www.faa.gov/regulations_policies/-handbooks_manuals/aviation/pilot_handbook/media/PHAK-Errata-Sheet.pdf)
318 [handbooks_manuals/aviation/pilot_handbook/media/PHAK-Errata-Sheet.pdf](http://www.faa.gov/regulations_policies/-handbooks_manuals/aviation/pilot_handbook/media/PHAK-Errata-Sheet.pdf)). Another V
319 speed meriting discussion is minimum controllable speed (V_{MC}) in the event of engine failure
320 in a multi-engine aircraft. Airmen need to be particularly cognizant as to the offsets of the
321 published V_{MC} values by aircraft weight, ambient conditions and flap/landing gear
322 configuration. This is of particular importance since, too often, accidents in multi-engine
323 aircraft occur as a consequence of poor single engine procedures inclusive of inappropriate
324 speed selection (Boyd, 2015a). Taken together, discussions with pilots should include
325 greater emphasis on the importance of appropriate V speed selection corresponding to a
326 phase of flight but nevertheless, the limitations of such speeds (especially in context of
327 aerodynamic stalls) and finally the fact that published values are rarely constant.

328 Adverse weather (instrument meteorological conditions or convective activity) is a
329 well-documented risk factor for fatal general aviation accidents (Bazargan and Guzhva,
330 2007; Li and Baker, 1999). Moreover, pilots are more likely to continue a planned flight
331 without diverting or returning to the departure airport after the mid-way point of the trip (Batt
332 and O'Hare, 2005; O'Hare and Owen, 2002) a phenomenon referred to as "plan continuation
333 bias." Thus, pre-departure weather planning can be crucial for a successful flight outcome.
334 However, the disproportionate number of accidents with fatal and/or serious injury outcomes
335 involving inadequate weather planning (no evidence of an official weather briefing) argues
336 that a subset of airmen operating turbine-powered aircraft are placing insufficient emphasis
337 on such planning. Of course we cannot exclude the possibility that some of these pilots did
338 receive weather information from sources other than official FAA sources (Flight Service
339 Station or the internet-based DUATS). Nevertheless, these findings would argue for the
340 importance of comprehensive pre-flight planning in context of weather evaluation. That said,
341 weather can change rapidly and current conditions may deviate from those forecast. In this
342 regard, a long well-recognized problem plaguing general aviation (Kenny, 2012) is the
343 continued flight from visual to instrument meteorological conditions also evidenced in our
344 study. Typically such events are fatal- in our study 90% of accidents in which this accident-
345 precipitating factor was cited involved fatal and/or seriously injured occupants. Interestingly
346 of the 11 accidents, the pilots for all but one of the aircraft were instrument-certified. This
347 finding suggests that in the face of deteriorating weather airmen should be strongly
348 encouraged to request an enroute clearance.

349 We found that the largest number of accidents in the "FAR Violation/AIM Deviation"
350 category was attributed to a "Descent below MDA/failure to execute the Missed" the majority
351 (78%) of which resulted in fatal and/or serious injuries. This problem may be rooted in two
352 different causes. First, turbine aircraft are often faster than piston-powered aircraft
353 comparable in terms of passenger capacity. Second, turbine engines are characterized by
354 longer response (spool up) times compared with piston-powered aircraft (Brown and Holt,
355 2012). Thus, decision-making as to whether to break off an approach in degraded visibility

356 has to be expeditious even more so for turbine aircraft requiring only one pilot. Moreover,
357 current regulations allow airmen operating under 14CFR Part 91 to do a “look see” even if
358 the current broadcast visibility is below minimums. Taken together, due consideration should
359 be given to modifying the regulations for turbine operators operating under 14CFR Part 91 to
360 prohibit instrument approaches when the automated weather broadcast indicates below
361 minimums. Indeed, for operations conducted under 14CFR Part 135/121 an instrument
362 approach cannot be commenced under such weather conditions.

363 As an accident-precursive factor, “Deficiencies on part of Air Traffic Control or the
364 Flight Service Station” were rare (n=14) but nevertheless carried a high risk of a fatal and/or
365 serious injury outcome. Half of the accidents in this category involved the lack of enroute
366 advisories on adverse weather (convective or icing) or low-terrain alerts. We speculate that
367 the growing presence of on-board data-linked weather and terrain-alerting systems may
368 prove efficacious in nullifying this accident-precursive factor in the future.

369 We were initially surprised that pilot fatigue was not identified as a candidate
370 accident-precipitating factor. That said, it is likely that the role of fatigue is grossly
371 underestimated for several reasons. First, 14CFR Part 91 operations lack regulations
372 pertaining to pilot rest unlike 14CFR Part 121 where rest requirements are mandatory.
373 Airmen operating under 14CFR Part 91 must therefore exercise self-discipline and should be
374 made aware of technologies available for monitoring sleep. Further, in a non-fatal accident
375 investigation pilots are unlikely to admit fatigue as a factor for fear of punitive action by
376 aviation authorities and/or civil litigation.

377 The finding of a steady decline in the accident rate of turbine-powered aircraft over
378 the 25 year period was surprising and in contrast to an unchanged rate for the aggregated
379 general aviation fleet (Kenny, 2012). One possible explanation for the decline is that aviation
380 safety in this sector is improving. Alternatively, the reduction in fatal accident rate for turbine-
381 powered aircraft operating under 14CFR Part 91 may be related, in part, to an increasing
382 proportion of single engine accident aircraft over time. Certainly, based on prior studies with
383 piston aircraft (Kenny, 2012), both the all-accident and fatal accident rates for multi-engine

384 aircraft is higher than the corresponding rate for single engine aircraft. Our data are
385 consistent with the latter notion which clearly demonstrated an increased representation of
386 single engine turbine aircraft over the study period. Nevertheless, we recognize that other
387 co-variates, not captured in the present study, could also contribute to the decline in the
388 accident rate reported herein.

389 Notwithstanding our findings, our study had limitations. First and foremost, this was a
390 retrospective study. Also, assigning an accident-precipitating factor or category to an
391 accident was not always clear-cut. Another limitation is that we made the assumption that
392 the increased fraction of accidents in single turbine engine aircraft evident over time reflects
393 a proportionate increase in fleet activity by these aircraft. Also, we recognize that a low
394 number of events, especially where accident-precipitating factor categories were sub-
395 classified, would have resulted in a loss of statistical power. Finally, since the FAA lacked
396 fleet flight time for the 2011 year, denominator data for the 2009-2013 period represents an
397 average of these years with the exclusion of the corresponding data for 2011.

398 In conclusion, our study is the first to identify novel precursive factors for accidents
399 involving turbine aircraft operating under 14CFR Part 91. Our findings point to areas that
400 should receive increased emphasis in training/recurrency in a pre-emptive attempt to nullify
401 the effect of candidate accident-precipitating factor(s). Increased attention should be given
402 by airmen to adherence to checklists/flight manuals and in particular recommended V
403 speeds, their limitations and the need to adjust for modifying variables. In a similar vein,
404 airmen should exercise greater diligence in pre-flight weather planning especially when
405 convective weather and instrument meteorological conditions are forecast. Further, with
406 typically higher aircraft speeds and longer engine spool up times (Brown and Holt, 2012) (a)
407 airmen should receive training as to decision-making with reference to decision height for
408 instrument approaches under minimum weather conditions and (b) aviation authorities
409 should consider whether conducting approaches under conditions below broadcast
410 minimums should be prohibited for turbine operations.

411 **5.0 LEGENDS**

412 **FIGURES**

413 Figure 1. Sub-Classification of Non-Adherence to Checklist/Flight Manual Category.

414 The number of accidents (n) is specified above each column.

415 Figure 2. Inadequate Pre-Flight Planning/Inspection/Procedure Sub-Categorization.

416 Accidents in the “Inadequate Pre-Flight Planning/Inspection/Procedure” category
417 (Table 2) was sub-grouped. The number of accidents (n) is indicated above each column.

418 Figure 3. Sub-Classification of the FARs Violation/AIM Deviation Category.

419 The number of accidents (n) is indicated above each column. Abbreviations: MDA,
420 minimum descent altitude; AD, airworthiness directive; SB, service bulletin.

421 Figure 4. Temporal change in Turbine-Powered Aircraft Accident Rates and the Fraction of
422 Accidents with Fatal/Serious Injuries.

423 Accidents (n) for turbine-powered aircraft for the indicated time period were
424 normalized to turbine fleet activity operating under 14CFR Part 91 for the corresponding
425 period and depicted as accident rate (line graph). The bar graph represents the fraction of
426 accidents with fatal and/or serious injuries for the indicated period is shown. A fraction of 0.4
427 means that of 40% of the accidents for the specified time period involved occupants with
428 fatal/and or serious injuries. The number (n) of accidents with fatal and/or serious injury
429 outcomes is included above each column.

430 Figure 5. Accidents of Turbine-Powered Aircraft Segregated by Single and Twin-Engine
431 Configuration.

432 The number (n) of accidents by turbine-powered aircraft operating under 14CFR Part
433 91 separated by single and twin-engine aircraft for the indicated time period is shown.

434

435 **TABLES**

436 Table 1. Taxonomy and Explanation of Accident-Precipitating Factor Categories.

437 Abbreviations: Wx-weather, FBO, fixed base operator; FARs, federal aviation
438 regulations; AIM, Airman Information Manual; FOD, foreign object damage; ATC, air traffic
439 control; FSS, flight service station; IFR, instrument flight rules.

440 Table 2. Risk Assessment of the Accident-Precipitating Factors for a Crash with a Fatal
441 and/or Serious Injury Outcome.

442 Variables from Table 1, which in backward elimination using Log Likelihood ratio test
443 reached a statistical level of ($p < 0.05$), were then analysed by logistic regression for risk of an
444 accident with a fatal and/or serious injury outcome.

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Figure 1

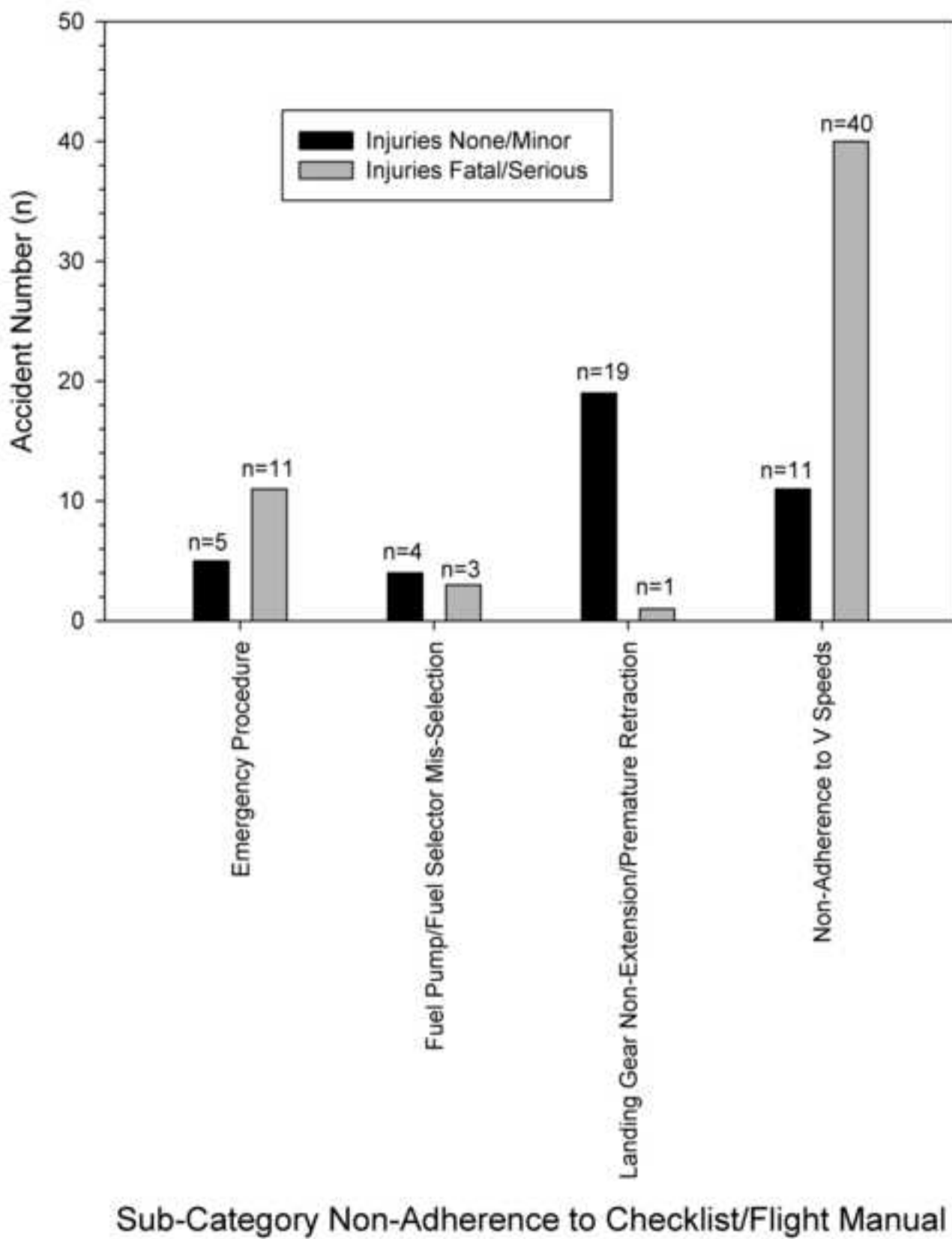
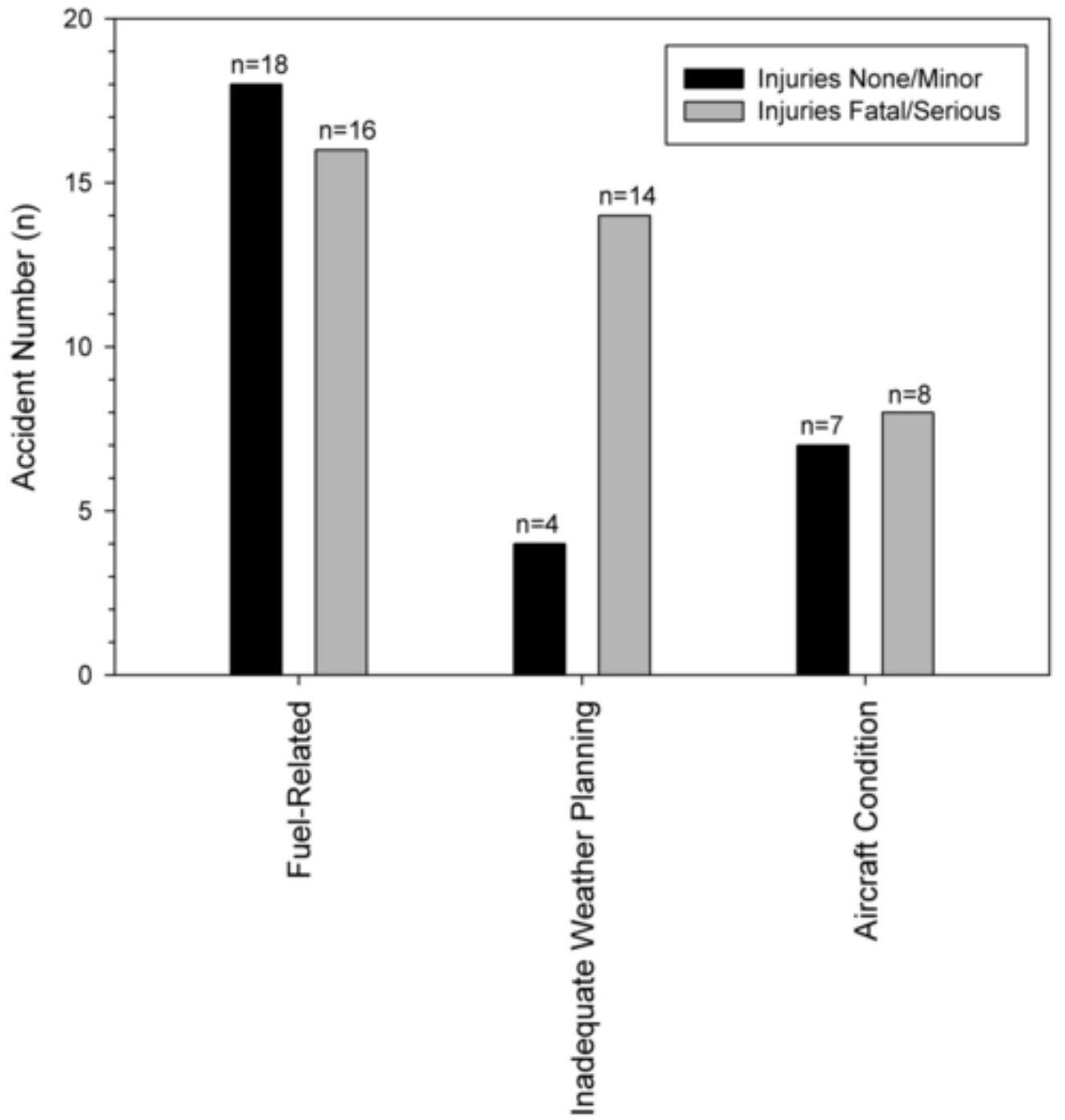


Figure 2



Sub-Categories Inadequate Pre-Flight Planning/Inspection/Procedure

Figure 3

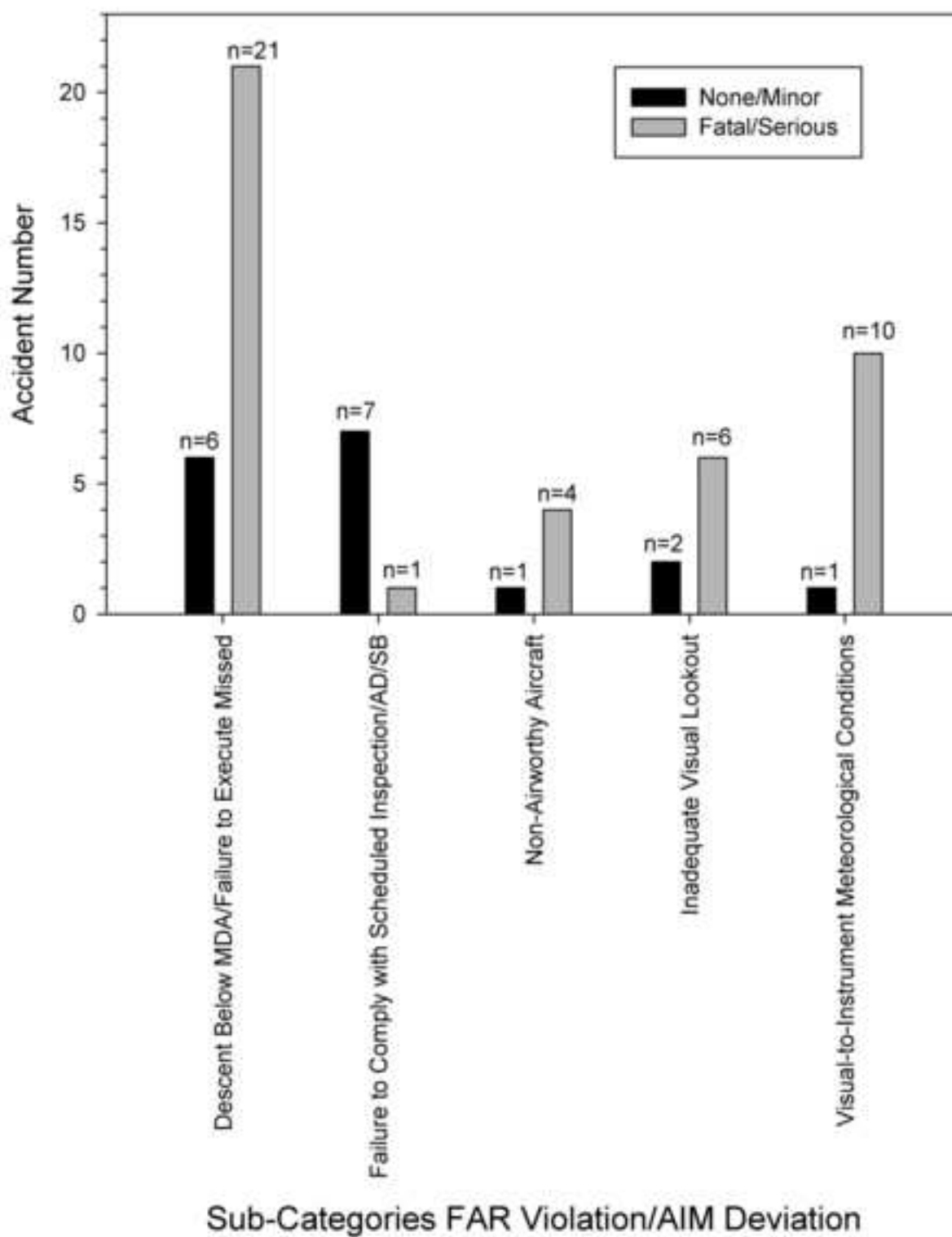
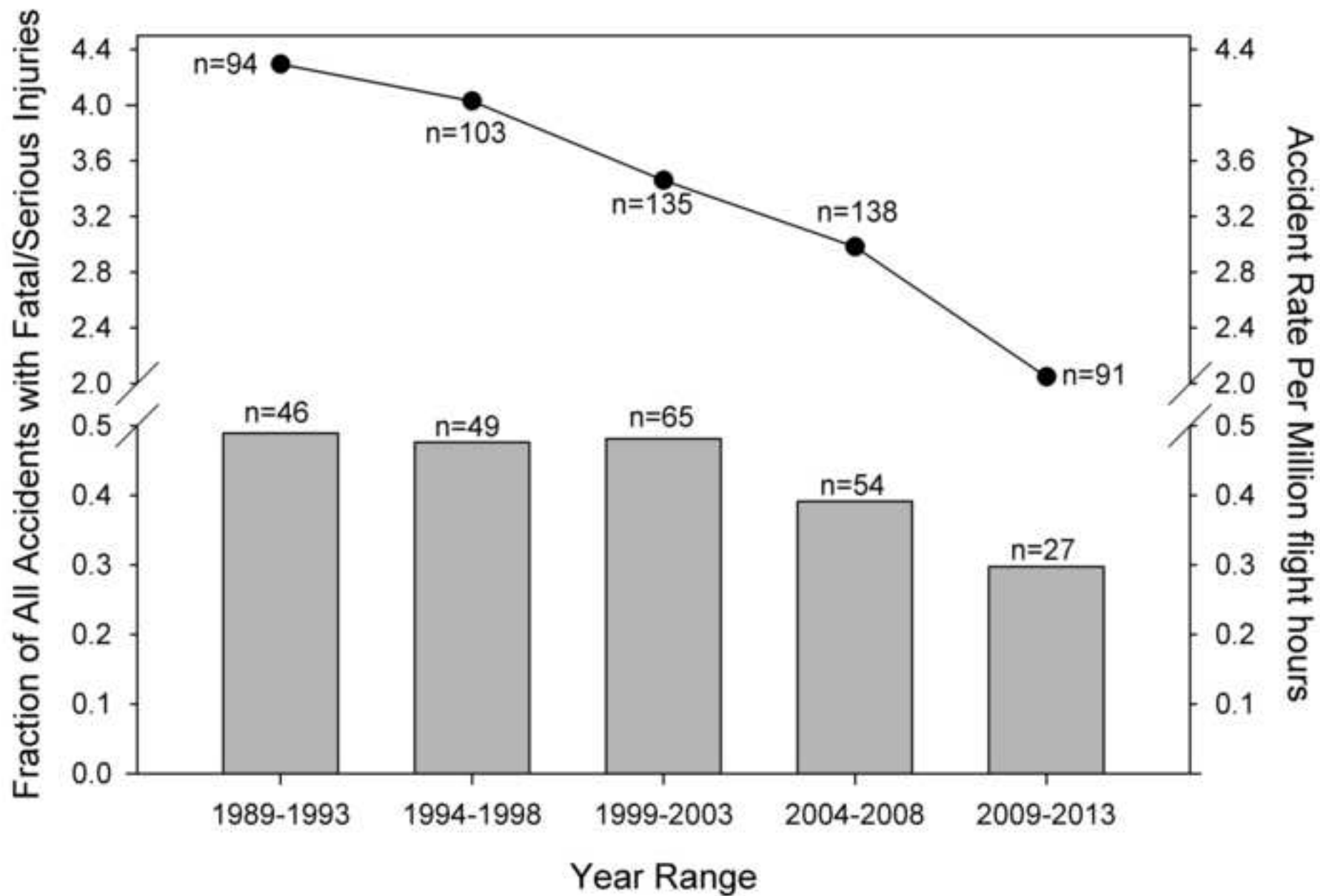


Figure 4



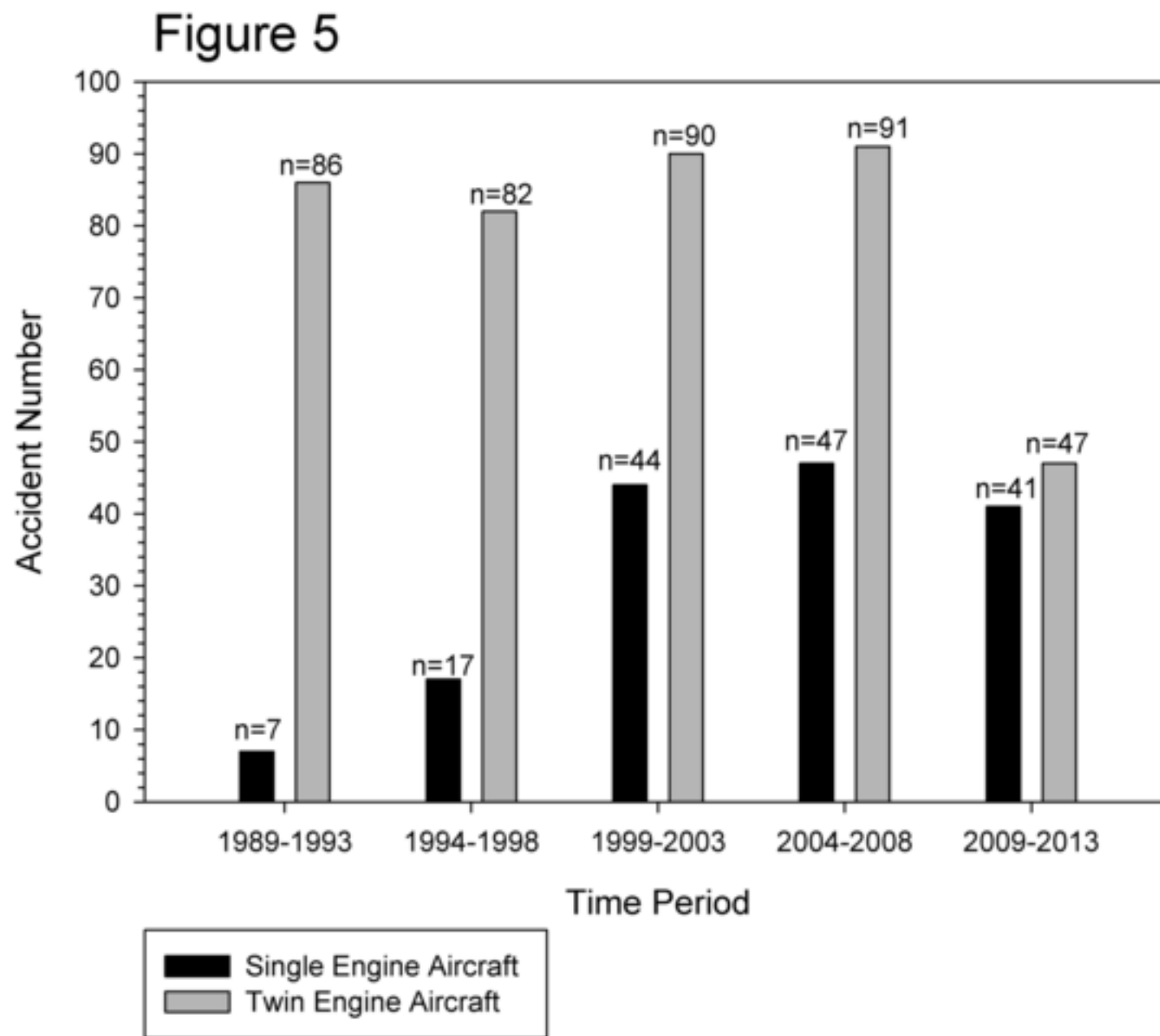


Table 1

ACCIDENT-PRECIPIATING FACTOR CATEGORY	ACCIDENT-PRECIPIATING FACTOR/ CATEGORY	EXPLANATION
1	Checklist/Flight Manual Not Followed	self-explanatory and includes non-adherence to V speeds
2	Contaminated Runway	Runway contaminated with water, snow or ice
3	WX/Aircraft Icing/Frost/Snow	Weather conditions included icing, frost or snow or aircraft was contaminated by these elements
4	Improper/inadequate maintenance/Inadequate Inspection	improper or inadequate maintenance or inadequate Inspection by maintenance facility
5	Inadequate Inflight Planning/Decision Making	Inadequate inflight planning or inadequate decision making by pilot
6	Inadequate Pre-flight Planning/Inspection/Procedure	Failure to undertake comprehensive pre-flight planning or aircraft pre-flight inspection or a procedure associated with the latter
7	Instrument meteorological conditions or Convective Weather	instrument meteorological conditions or thunderstorms
8	Deficient Lighting	ambient lighting that is anything but daylight
9	Deficiency by Operator/Owner/FBO	deficiency on part of the operator or owner or fixed base operator
10	Violation Federal Airman Regulations (FARs)/Airman Information Manual (AIM) Deviation	Inclusive of: a descent below minimum altitude of an instrument procedure, weather below minimums than those prescribed in the approach chart, continued flight from visual to instrument meteorological conditions in the absence of an IFR flight plan, flight into known icing, outdated aeronautical charts, pilot flying was non-instrument certified pilot, aircraft was modified in an unapproved fashion, non-compliance with an airworthiness directive or service bulletin, under visual conditions an aircraft did not give right of way to converging aircraft, aircraft was unairworthy
11	Diverted Attention	Pilot was distracted
12	Malfunction (includes FOD)	Aircraft malfunction including damage caused by foreign object
13	Lack Experience/Systems Knowledge	Lack of experience or lack of systems knowledge on part of the pilot for the accident aircraft
14	Fatigue	crew member fatigue
15	ATC/FSS Deficiency	Deficiency on part of Air Traffic Control or the Flight Service Station
16	Pilot Physical/Drug Impairment/Incapacitation	Pilot impairment physically or by medications or pilot incapacitation
17	Pilot Skill Deficiency	Pilot skill in context of hand/foot-eye coordination in context of landing or take-offs

Table 2

Accident Precipitating Factor/Category	n	Wald	p Value	Odds Ratio	95% Confidence Intervals	
					Lower	Upper
Checklist/Flight Manual Not Followed	132	13.97	<0.001	2.34	1.48	3.69
Contaminated Runway	22	8.39	0.004	0.10	0.02	0.48
Inadequate Pre-flight Planning/Inspection/Procedure	68	7.13	0.008	2.22	1.24	3.98
Instrument meteorological conditions or Convective Weather	90	27.12	<0.001	5.28	2.82	9.88
Deficient Lighting	50	11.91	0.001	3.89	1.80	8.43
Violation FARs/AIM deviation	64	6.96	0.008	2.59	1.28	5.24
Malfunction	127	7.54	0.006	0.49	0.30	0.82
Lack Experience/Systems Knowledge	26	9.63	0.002	5.01	1.81	13.87
Air Traffic Control/Flight Service Station Deficiency	14	4.92	0.026	6.24	1.24	31.43
Pilot Physical/Drug Impairment/Incapacitation	14	9.26	0.002	25.07	3.15	199.74
Pilot Skill Deficiency	39	5.23	0.022	0.30	0.11	0.84