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MATHEMATICAL APPROACHES TO EVALUATING AIRCRAFT VERTICAL SEPARATION STANDARDS

INTERIM REPORT



MAY 1976



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16. Abstract Above Flight Level 290, current regulations require aircraft to be separated vertically by at least 2000 feet. Because of increased traffic desiring to fly at these altitudes, the possibility of reducing the required separation (while maintaining acceptable safety levels) is under study. This report details many of the components of vertical position error and classifies them into three major categories: static pressure system error, altimeter instrument error, and pilot response error. Two models for use in evaluating separation standards, the root sum of squares (RSS) approach and the Reich collision risk model, are described together with their respective advantages and disadvantages. A final section includes recommendations for a carefully designed data collection effort and discusses potentially important considerations for such a design.		
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TABLE OF CONTENTS

	<u>Page</u>
1. Introduction.....	1
2. Component Errors.....	7
2.1 Static Pressure System Errors.....	7
2.2 Altimeter Instrument Errors.....	9
2.3 Pilot Response.....	11
2.4 Additional Factors.....	12
2.5 Estimates of Error Size.....	13
3. Modeling Approaches.....	19
3.1 The Root Sum of Squares (RSS) Approach.....	19
3.2 The Reich Approach.....	22
3.3 Analysis of the Tails of Distributions.....	24
3.4 Convolution of Distributions.....	25
3.5 Examination of the Model Assumptions.....	28
3.6 Choice of Model.....	29
4. Data Requirements.....	31
4.1 Avoiding Possible Problems.....	31
4.2 Consideration of Factors Causing Systematic Errors.....	32
4.3 Testing Model Assumptions.....	36
5. Conclusion.....	37
6. References.....	39
Appendix A. Comparisons of Tail Lengths of Distributions.....	42

LIST OF TABLES

	<u>Page</u>
1. Ranges of Values (in Feet) of Static Pressure System Errors at FL300.....	15
2. Ranges of Values (in Feet) of Altimeter Instrument Errors at FL300.....	16
3. Ranges of Values (in Feet) of Pilot Response Errors at FL300.....	17
4. Ranges of Values (in Feet) of Additional Error Factors at FL300...	17
5. Factors Which Can Cause Systematic Errors.....	33

LIST OF FIGURES

	<u>Page</u>
1. Diagram of Aircraft Height-keeping System.....	4
2. Subsystem Errors Involved in Vertical Position Error.....	5
3. Possible Distributions for Component Errors.....	14
4. Two Distributions Having the Same Mean and Standard Deviation.....	21
5. Convolution of Two Rectangular Distributions.....	26

1. INTRODUCTION

Safety of aircraft flight is of great concern to all those connected with aviation. The Department of Transportation's Federal Aviation Administration (FAA) has a major responsibility for the maintenance and improvement of flying safety through, for example, certification of pilots and equipment, the establishment of an air traffic control system, and the dissemination of rules and regulations to ensure orderly flow of traffic. This report will be concerned with aspects of the latter function: specifically, rules pertaining to the safe separation of aircraft and, more particularly, separation of aircraft in the vertical dimension.

The scope of the present study includes only level flight -- above Flight Level (FL) 290. At and above 29,000 feet internationally and 18,000 feet¹ in the Eastern United States, "altitude" is measured not by actual elevation above sea level but rather in terms of pressure altitude based on a standard sea level pressure of 29.92 inches of mercury (1013.25 mb.) and a standard temperature gradient. Pressure altitude in hundreds of feet is then referred to as Flight Level. Thus Flight Level 290 is approximately 29,000 feet above sea level, depending on the actual barometric pressure at sea level and other factors. We initially focus on altitudes at and above FL290 since at these altitudes terrain considerations can be ignored; Mount Everest rises 29,028 feet above sea level, but apart from the Himalayas no mountains are this high. Moreover, current regulations require 1000-foot separation between aircraft below FL290 and require 2000-foot separation above FL290. We consider only level flight, excluding ascents and descents, both because the separation rules in question address this portion of flight and because level flight permits simpler analytical treatment than do other maneuvers.

Separation of aircraft laterally, longitudinally and vertically is designed to enhance safety by providing enough airspace surrounding each aircraft to allow for errors in its nominal position. The separation standards are established in such a manner that separation in any one of the three dimensions itself provides a measure of safety. This is required because in order to use airspace efficiently it may frequently be necessary to assign aircraft to parallel tracks (where only lateral separation applies), to the same track (where only longitudinal separation applies) or to adjacent flight levels on the same route (where only vertical separation applies). The present report will be concerned primarily with this latter case, but it must always be kept in mind that any measure of safety must take into account all three dimensions and the relative frequency with which separation in each will provide the sole safety margin.

"Safety" is a concept which is very difficult to define with sufficient precision to allow its quantification. Nevertheless it is essential to have such a measure in order to evaluate the effects of proposed system changes on safety as a basis for justifying (or rejecting) those changes. As parts

¹Units customarily used in aviation -- feet, nautical miles, knots and Mach number -- will be used in this report for ease of assimilation by an aviation reader.

of the system become saturated and changes in rules are proposed which would alleviate congestion, the probable effects on safety must be evaluated using some numerical measure of the respective risks under the original and modified rules. On the one hand, the flying public wants maximal safety guaranteed by the procedures governing air traffic control. On the other hand, airline operators are not only concerned with safety, but also want procedures to allow efficient use of their aircraft. Since aircraft are designed to operate most efficiently within a rather narrow altitude range, this results in a large number of aircraft desiring to fly at the same altitude. Both passengers and airline operators want reduced delays. Some measure which can be used to quantify the risks in flying, as related to the characteristics of aircraft equipment and flying procedures, is needed to aid in rule-setting. An "ideal" measure may be impossible in principle and is certainly beyond present abilities to quantify, but some surrogate measure, recognized as not wholly adequate but designed to reflect those properties of safety which can be quantified, may well be attainable.

It is therefore desirable to quantify the risk of collision between two aircraft resulting from a loss in vertical separation between those aircraft, and to do so in a manner that permits evaluating the impact upon safety of changes in the rules or equipment of the system. Above FL290 accidents have three primary causes: collision between two aircraft, equipment failure, and weather effects. The first of these is of most interest in evaluating separation standards, but the effects of the latter two must also be considered.

In designing a safety measure for flight at or above FL290, it is necessary to resolve several questions:

- . Do we simply count the aircraft involved or should the number of passengers in the aircraft be reflected in the measure?
- . Does one consider collisions only, or should near-misses also affect the measure?
- . Should the measure concern number of incidents per flight, per flying period (hour, day, week, or year?), per distance flown, per passenger flying period or per passenger distance flown?

The safety measure chosen deals with aircraft rather than passengers, primarily because aircraft are elements over which the present air traffic control system (or its likely successors) has some control. System improvements will affect aircraft directly or will affect the monitoring and navigation equipment which in turn affects aircraft. At the altitudes of interest here (FL290 and above), most of the traffic is commercial jet aircraft and any collision is likely to result in death for all persons on board, so that aircraft collisions are the most relevant factor. Near-misses certainly contribute to a perceived degradation of safety, but it is difficult to obtain reliable information about them, since only some are actually reported and what was viewed as a near-miss by one pilot may not have appeared a hazardous situation to the other.

Since flights differ greatly in length, the length of exposure to collision varies from flight to flight. A better measure of the risk of collision is the number of collisions per time period or per distance flown. Most of the aircraft flying at an altitude of 29,000 feet or more are in

en route airspace and fly at a speed of about 0.8 Mach or greater, so that time and distance are directly related; but since airline crew staffing and aircraft maintenance procedures rely on cumulative flying time, time-related figures are more readily available than those on the number of aircraft miles flown.² Thus the unit chosen in this report (as well as elsewhere) for measuring the safety of aircraft flight is the number of collisions per flying hour. This measure has been called [36] the collision risk to which an aircraft is exposed.

Loss of vertical separation results from a discrepancy between the assigned flight level and the actual altitude flown (or possibly from an improperly assigned flight level, but this contingency will not be included in the error analysis below). The discrepancy between assigned and actual altitude will be called "total vertical position error". Figure 1 contains a diagram of the height-keeping system: the subsystems subject to error are designated by hexagonal boxes and the relevant outputs of these subsystems are displayed in rectangular boxes. As indicated by the figure, the three main subsystems contributing to vertical position error are:

- 1) the static pressure system, which senses the ambient air pressure,
- 2) the altimeter instrument system, which translates (mechanically and possibly electronically) the pressure sensed by the pitot-static system into a flight level indicated on a gauge in the cockpit (for a more complete description of the operation of an altimeter, the reader is referred to [13] and [16]), and
- 3) the pilot response, which reflects the ability of the pilot to maintain a desired gauge reading.

We also consider a fourth category, that of "miscellaneous" error sources. Included in this category are errors in the Mode C transponder system by which the altimeter reading is automatically transmitted to the air traffic controller; these become especially important if controller decisions rely on the erroneous data. It is important, in this regard, to realize that total failure of the altimetry system can be readily identified and appropriate safety precautions applied by cooperation between pilot and the controller. Problems arise with less readily noticed system failure.

Errors in the three major subsystems listed above would appear to have relatively little effect upon one another, since such errors result from physically separate processes. With reference to Figure 2, the static pressure system error is represented by the difference between the actual pressure altitude flown and the pressure measured by that system. The

²The use of accidents per miles flown may be misleading, as noted by G. Raisbeck, B. O. Koopman, S. F. Lister and A. S. Kapadia, A Study of Air Traffic Control System Capacity, Report Number FAA-RD-70-70, Authur D. Little, Inc. Cambridge, Mass. 02140, Oct. 1970, pp.57-58.

FIGURE 1

Diagram of Aircraft Height-keeping System

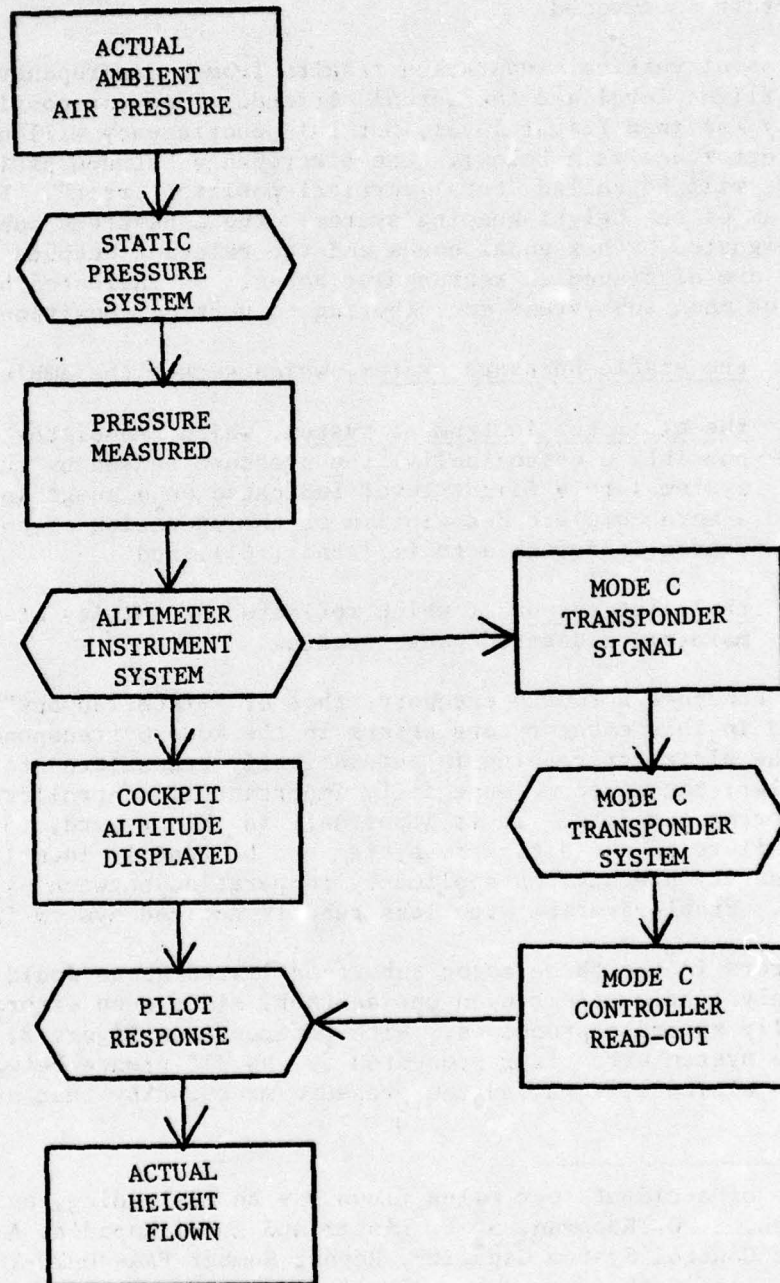
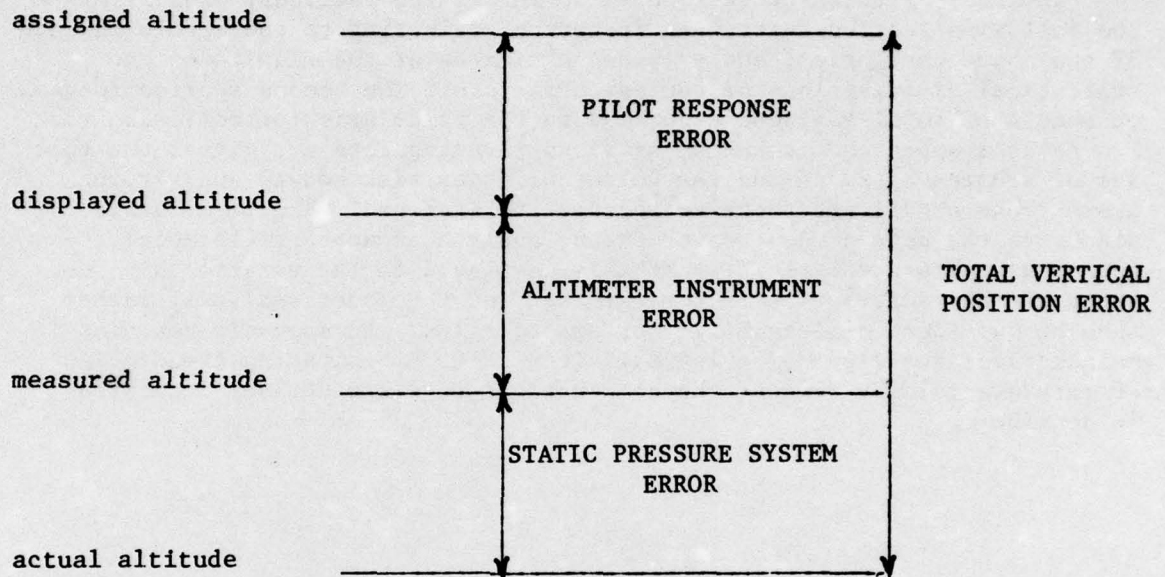


FIGURE 2

Subsystem Errors Involved in Vertical Position Error



altimeter instrument error corresponds to the difference between the measured pressure altitude and the altitude displayed in the cockpit, while the pilot response error corresponds to the difference between the displayed altitude and the altitude assigned to the aircraft. Total vertical error is the algebraic sum of the errors in the three subsystems, and these latter errors are expected to be relatively uncorrelated with one another. The assumptions involved in this simple model of total vertical error are discussed in Section 3.5.

The body of this report is divided into three sections. The first of the following sections discusses factors contributing to the errors in each of the above categories, and provides estimates of the magnitudes and statistical distributions of the error factors. The second section focuses on models of total vertical error and on the calculation of collision risk. Two notable approaches taken by previous investigators are given, the root sum of squares approach and the Reich collision risk model, and various assumptions underlying those approaches are examined. The final section discusses the data needed to verify and analyze an appropriate model together with its assumptions. Emphasis is placed on the relationship between the characteristics of the data set and the model analysis, rather than on questions of feasibility or practicality. An appendix contains mathematical analyses comparing tail lengths (i.e. comparing frequencies of rare events) for some of the combinations of distributions discussed in Section 3.

2. COMPONENT ERRORS

In this section we will examine various factors and errors contributing to the three major error categories: static pressure system error, altimeter instrument error, and errors in pilot actions. A miscellaneous category will also be included to cover factors not falling naturally under one of the other three headings.

2.1 Static Pressure System Errors

An altimeter is essentially a device for sensing the ambient air pressure outside the aircraft and translating the pressure measurement into an equivalent altitude, using physical relations such as that equating pressure with the weight of the column of air above. The pitot-static system embodies the air pressure sensing devices; it consists of various orifices and tubes which allow air (at pressure) outside the aircraft's skin to be transmitted to the altimeter diaphragm within the aircraft. Clearly, since the aircraft itself disturbs the air surrounding it, the location of the static pressure source on the aircraft skin is critical [13]. In addition, the attitude or angle of attack of the aircraft affects the direction of the airstream flowing past or into the static pressure source, influencing the measured air pressure. The speed of the aircraft (measured as Mach number) also affects the airstream passing the static pressure sensor, as does local deformation of the aircraft skin near the sensor. Factors affecting static pressure system error -- the discrepancy between the ambient atmospheric pressure and the pressure measured by the pitot-static system -- are listed and described below.

A. Factors varying during flight

1. Altitude: The relationship between pressure and altitude is quite nonlinear, so that an exact correspondence between pressure and altitude may not be possible using existing equipment. Therefore, errors in the altitude measurement may depend on the altitude itself.
2. Mach number: Aircraft speed affects the speed of the airstream moving past the static pressure source and thus the pressure measurement.
3. Angle of attack: The attitude of the aircraft can affect the movement of the airstream past the static pressure opening and thus influence the measured air pressure.

B. Factors varying among aircraft

1. Location of sensor: The airstream flow in the neighborhood of the static pressure source differs depending on where the source is located on the aircraft's hull. Different locations react differently to flying maneuvers and thus entail different pressure measurement characteristics.

2. Skin deformation: Any dent in the aircraft skin near the static pressure source affects the local airstream characteristics. In addition, normal skin deformation in the region near the sensor location changes during flight and consequently affects the pressure measurement.
3. Leaks in the pitot-static system: If there are any leaks in the pitot-static system, an incorrect pressure will be transmitted to the altimeter diaphragm.
4. Aircraft type: Different aircraft have different shapes and weights, thus disturbing the atmosphere in different ways. Different aircraft types also may be equipped with different altimeters and have different sensor locations, as well as different pitot-static configurations (separate pilot and co-pilot sensors versus a common one, for example). All of these variations may lead to differences in measurement capability.
5. Calibration test procedures: Initial static pressure system performance is verified by trailing cone tests during aircraft certification and is subsequently tested for leaks only at two year intervals. Actual tolerances and test intervals (less than the two year minimum) may vary from operator to operator.

C. Time-varying factors

1. Calibration test interval: Since the calibration procedures are set up separately by each airline or owner, the interval between tests may vary up to a maximum interval set by the certifying authority. If the performance of the instrument typically degrades over the interval between calibrations, then the time since the last test will affect the accuracy of the measurements.
2. Age of the pitot-static system: The pitot-static system may deteriorate with time, thus affecting the accuracy of pressure measurement.

D. Meteorological effects

1. Density and temperature: The density and temperature of the atmosphere may differ from those assumed for the standard atmosphere, so that the actual relationship between pressure and altitude may differ from that assumed. This may cause the actual distance between flight levels to be less than (or greater than) the separation standard.
2. Turbulence, wind and other weather conditions: The measurement of air pressure in turbulent air is difficult because of the unstable conditions. Strong winds may also affect the pressure readings.

2.2 Altimeter Instrument Errors

The altimeter instrument measures the pressure transmitted by the pitot-static system and translates that pressure into an equivalent altitude displayed to the pilot. The altimeter instrument errors listed below contribute to discrepancy between the pressure measured by the pitot-static system and the equivalent flight level indicated on the pilot's altimeter gauge.

A. Mechanical

1. Diaphragm error: Equal changes in atmospheric pressure at different heights can produce different diaphragm deflections, as a result of the physical properties and construction of the aneroid-linkage system.
2. Hysteresis error: Hysteresis is the phenomenon in which the reaction of a system to changes is dependent upon its past reactions to change. In the altimeter, the diaphragm deflection depends upon whether the current altitude was reached from above or from below.
3. Drift error: There is a tendency to deviate from a constant altitude reading over long (1 to 4 hours) exposure to that altitude.
4. Friction error: Friction occurs in transmission of diaphragm movement to the pointers and in the temperature compensating pins. This can cause small deviations in altitude to go unrecorded, contributing to a loss in precision of the instrument.
5. Backlash error: Motion is lost in the gear transmission between the pressure and altitude scales.
6. Instability error: Changes occur in the altimeter indication following consecutive ascents and descents.
7. Temperature error: Temperature in the instrument panel can affect the altimeter indication.
8. Scale error: This error is due to the inability to match exactly the movement of the altitude pointer with the deflection of the aneroid-linkage mechanism.

B. Readability

1. Pressure setting error: The pressure scale can only be set to an accuracy determined by its graduation interval, so that the altitude readings are accurate only to an equivalent precision.
2. Altitude reading error: The height scale of the altimeter can only be read to a precision determined by its graduation interval.

C. Errors Arising From Nonstandard Setting, (i.e. Using Other than the Standard Atmosphere Reference Pressure)

1. Coordination error: A complete coordination between the graduations of pressure and height scales becomes impossible.
2. Balance error: The state of balance of all moving parts of the altimeter changes when rotated from the calibration position.
3. Zero-setting error: The calibration correction at certain heights should be different if a nonstandard reference pressure datum is used.
4. Incorrect local barometric pressure: The pilot receives ground-level barometric pressure information from ground stations and resets his pressure gauge accordingly. If an incorrect pressure is transmitted or the value garbled, the pilot may be using an erroneous local barometric pressure setting.

D. Calibration procedures

1. Installation error: The altimeter may register incorrectly if the instrument is installed in the aircraft improperly, or if irregularly standardized reference equipment or inappropriate procedures are used during calibration.
2. Calibration frequency: The frequency of calibration tests is to some extent under the control of the owner and will thus vary among owners.
3. Procedural error: When an altimeter without automatic compensation for calibration discrepancies is used, the pilot must apply calibration corrections (primarily to adjust for scale error) listed on a cockpit card. Clearly this is a source for error, particularly if the pilot has a Mode C transponder, since the transponder will transmit the uncorrected flight level to the controller who will then perceive the aircraft at a slightly "improper" altitude.
4. Calibration adjustment error: A residual error may remain after the calibration corrections have been applied to the altimeter system, since the instrumentation may be unable to account for all nonlinearities.

E. Other

1. Altimeter type: There are three categories of altimeters:

Type I - a mechanical instrument ("pressure sensitive" altimeter)

Type II - an improved mechanical instrument ("precision pressure" altimeter)

Type III - an altimeter with servo-correction facilities

³ These errors do not apply to flight above FL290, since the standard atmospheric setting of 29.92 inches of mercury is used in this altitude range.

Types II and III are the ones of greatest interest, because they are probably the only ones found in aircraft flying above FL290.

Differences in mechanical and calibration errors exist among the three types.

2. Aging: Since mechanical components are subject to wear and deterioration, altimeters can develop a systematic deterioration in accuracy between overhauls.

2.3 Pilot Response

The pilot reads the altitude displayed on the altimeter gauge in the cockpit, and uses that information to guide the aircraft relative to the assigned flight level. This task may be performed well or poorly. Different pilots may perceive the necessity of adhering to assigned altitude as more or less important, and may allow different margins for error.

Human errors in the assignment of altitude, the setting of the value of the standard atmosphere on the altimeter pressure gauge, or the reading of the altimeter gauge may also contribute to altitude error. Sloppy and inattentive flying may to some extent be corrected through the use of altitude-hold equipment whereby the autopilot attempts to maintain altitude, but even here there may be errors in initiating the correct altitude. Also, the altitude-hold feature is usually disengaged under turbulent weather conditions. Human errors leading to discrepancy between the altitude displayed on the pilot's altimeter gauge and the altitude to which he was assigned are described below.

- A. Flight technical error. This term usually applies to a collection of human errors which manifest themselves in altitude variations during supposedly level flight. Several causes are given below.

1. Sloppy flying: Pilots have many duties to perform and thus attention cannot be focused solely on altitude maintenance. In addition, pilots perceive some variation from the assigned altitude as acceptable without degrading safety, because of inherent errors in the altimeter system.
2. "Blunders": Several outright errors in procedure may contribute to altitude errors. They include
 - failure to apply the calibration corrections when required,
 - misreading the altimeter gauge,
 - missetting the standard atmosphere on the pilot's pressure gauge,
3. Altimeter discrepancy: Differences in the readings of the pilot's and co-pilot's altimeter displays contribute to the pilot's perception of allowable altitude variation and thus may be a source of error.

B. Altitude-hold equipment

1. Malfunction of altitude-hold equipment: As with any device, the altitude-hold mechanism may malfunction, causing an altitude error which may or may not be caught and corrected by the pilot.
2. Turbulence: Turbulence involves sharp pressure changes. During such situations the altitude-hold mechanism, which seeks to maintain a given altitude (that is, to follow an equal-pressure contour), will tend to move the aircraft rapidly up or down -- clearly an undesirable practice. Therefore altitude-hold is usually disengaged during turbulent weather conditions.

2.4 Additional Factors

Several additional factors not appearing in the above lists also contribute to errors in the vertical separation of aircraft.

- A. Size of aircraft. Since aircraft occupy space, two aircraft whose centers are 2000 feet apart are actually separated by less than 2000 feet, when the distance between the top of the lower aircraft and the bottom of the upper one is measured. Thus the separation between aircraft is reduced by the height of an aircraft itself.
- B. Different reference pressures. In lower altitudes and at the interface of FL290, aircraft at adjacent altitude levels or in the same area may be using different reference pressure data. The use of different reference pressures leads to differences in altitude measurement which may reduce the separation between the aircraft.
- C. Mode C altitude. A discrepancy between the flight level indicated on the altimeter gauge in the aircraft and that read by the controller on the ground may result from defects in any of several procedures, including
 - encoding of the Mode C altitude in the aircraft,
 - transmission of the Mode C response (garbling),
 - decoding of the Mode C response on the ground.

In addition, as noted above, since some altimeters require calibration corrections to be applied by the pilot and the display does not reflect these corrections, the Mode C altitude indicated to the controller may show the pilot to be at an improper flight level when in fact the aircraft is actually flying the assigned level. It has been suggested that some pilots fly without applying the corrections in order to maintain the appropriate Mode C readout rather than the correct altitude. Controllers are required to verify on initial contact that the Mode C reported altitude is within ± 300 feet of the cockpit altimeter altitude. If that correspondence is not established the pilot is requested to turn off the Mode C report. After verification is made, if the controller observes a discrepancy of ± 300 feet from assigned altitude he is required to notify the pilot. Smaller errors need not be reported. Thus large errors, such as those that might result from total failure of the altimetry system, can be readily identified and appropriate safety precaution applied by

cooperation between the pilot and controller. Less than complete failure may be more difficult to recognize.

2.5 Estimates of Error Sizes

The errors described above have been discussed in several publications [23, 25, 36, 41], and estimates have also been made for the error magnitudes and their statistical distributions.

Four probability distributions, representative examples of which appear in Figure 3, have been used to describe the errors. They are the normal (Gaussian), the rectangular (uniform), the limit (2-point discrete uniform), and the constant (degenerate point) distributions. Any component error following a constant distribution is simply a variable that takes a single fixed value. Such errors (e.g. aircraft size) can be considered to reduce directly the effective nominal spacing between aircraft; once the appropriate adjustment has been made, these errors can be ignored.

The other distributions are all generally assumed to have a mean of 0, corresponding to the notion that positive and negative error deviations in some sense balance one another. With one parameter (namely, the mean) fixed in value, only one other parameter must be known before the distributions of Figure 3 are completely specified. The standard deviation of an error distribution having finite limits (rectangular, limit or constant) is easily expressed in terms of the maximum possible deviation or "tolerance"⁴, as shown in Figure 3. By making an estimate of this maximum deviation, a procedure followed in [25], an estimate can thus be found for the standard deviation of any of these three distribution types. In the case of a normal distribution, however, there are no finite limits to the values possible. Accordingly, it is usually assumed that \pm three standard deviations adequately delimits the maximum deviation, since for a normal distribution 99.7% of the observations fall within three standard deviations of the mean.

Tables 1 through 4 below contain observed values, or estimates, taken from these publications for many of the error components. The tables provide, for each component or combination of components, the source reference of the data, the distribution assumed for that component, the standard deviation of the distribution and a maximum deviation. Some error components described above do not appear below because we found no reference to quantitative estimates for them. The values in these tables are included mainly as an indication of the relative magnitude of errors, and no endorsement of validity or usefulness is implied.

Values in parentheses in Tables 1 to 4 refer to a Type III altimeter, while the others refer to a Type II altimeter. The numbers under "Source of Data" refer to the references in Section 6 of this document. These sources range from one as early as 1956 to several only a few months old, and many of the larger error values are found in the older sources. Some of the documents use slightly different data categorizations from those used here and

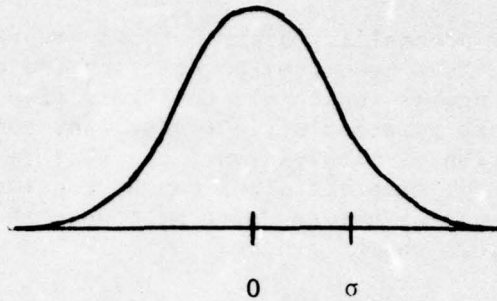
⁴The term "maximum tolerance", which has been used [25] in discussing the numerical magnitude of error components, is not intended to convey the meaning of "permissible" or "allowable". Rather, this usage denotes the maximum possible magnitude of an error which can be expected to be observed.

FIGURE 3

Possible Distributions for Component Errors

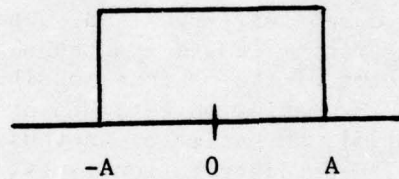
NORMAL

Standard
Deviation
 σ



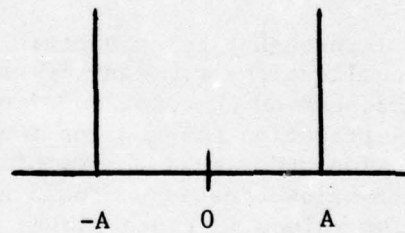
RECTANGULAR

Standard
Deviation
 $A/\sqrt{3}$



LIMIT

Standard
Deviation
A



CONSTANT

Standard
Deviation
0

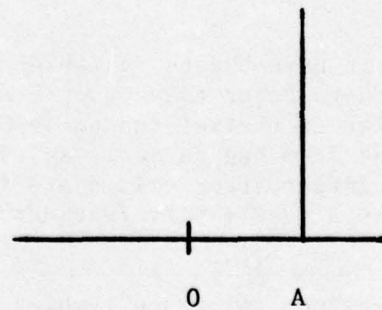


TABLE 1
Ranges of Values (in Feet) of Static Pressure System Errors
at FL 300

	<u>Component</u>	<u>Maximum Deviation</u>	<u>Standard Deviation</u>	<u>Assumed Distribution</u>	<u>Source of Data</u>
I.	<u>Fixed</u> (A.1, A.2, A.3, B.1*)	50 (15)	29 (9)	RECTANGULAR	23,41
II.	<u>Variable</u> (B.2, B.4, B.5, C.1, C.2)	250 (250)	83 (83)	GAUSSIAN	23,41
	TOTAL: I + II	330 (110)	--- ---	CONSTANT ---	25 42
III.	<u>Density</u> (D.1)	200 ---	--- 21	CONSTANT ---	25 42

* A.1 etc. refer to the listing of the component errors in Section 2.1. The categorization used here, which differs from that used in the text in Section 2.1, follows that found in those sources reporting values for the error components.

TABLE 2

Ranges of Values (in Feet) of Altimeter Instrument Errorsat FL 300

	<u>Component</u>	<u>Maximum Deviation</u>	<u>Standard Deviation</u>	<u>Assumed Distribution</u>	<u>Source of Data</u>
I.	<u>Mechanical</u>				
	DIAPHRAGM (A.1)	180-510 (70)	60 (23)	CONSTANT [25] GAUSSIAN [23]	23,25
	HYSTERESIS (A.2)				
	DRIFT (A.3)				
	FRICTION (A.4)	20-75 (20)	7-25 (7)	GAUSSIAN	23,25
	BACKLASH (A.5)	10 (10)	10 (10)	LIMIT	23,25
	INSTABILITY (A.6)	35-75 (35)	12-25 (12)	GAUSSIAN	23,25
	TEMPERATURE (A.7)	10-35 (35)	3-12 (12)	GAUSSIAN	23,25
II.	<u>Readability</u>				
	PRESSURE (B.1)	15 (15)	9 (9)	RECTANGULAR	23,25
	ALTITUDE (B.2)	20 (20)	12 (12)	RECTANGULAR	23,25
	TOTAL: I + II		64		41
III.	<u>Nonstandard Setting</u>				
	COORDINATION (C.1)	25	8	GAUSSIAN	25
	BALANCE (C.2)	20	7	GAUSSIAN	25
	ZERO-SETTING (C.3)	30	-	CONSTANT	25
IV.	<u>Calibration ADJUSTMENT</u>				
	(D.4)	-180 to +80 (120)			8

TABLE 3

Ranges of Values (in Feet) of Pilot Response Errorsat FL 300

	<u>Component</u>	<u>Maximum Deviation</u>	<u>Standard Deviation</u>	<u>Assumed Distribution</u>	<u>Source of Data</u>
I.	<u>Sloppy Flying</u> (A.1) }	---	47	---	42
II.	<u>Blunders</u> (A.2) }				
III.	<u>Altimeter Discrepancy</u> (A.3)	---	42	---	42
TOTAL: I + II + III		200-270	90	GAUSSIAN [23, 41]	7,23,41
IV.	<u>Altitude-Hold</u> (B.1, B.2)	50	29	RECTANGULAR	41
TOTAL: I + II + III + IV		360-750	120-250	GAUSSIAN	1,23,25,41

TABLE 4

Ranges of Values (in Feet) of Additional Error Factorsat FL 300

	<u>Component</u>	<u>Maximum Deviation</u>	<u>Standard Deviation</u>	<u>Assumed Distribution</u>	<u>Source of Data</u>
I.	<u>Aircraft Size</u> (A)	50-75	---	CONSTANT	23,25,41
II.	<u>Pressure Datum</u> (B)	200	---	CONSTANT	25
III.	<u>Mode C</u> (C)	100	---	---	10

supply estimates only for the total group; such grouped values are also indicated in the tables.

3. MODELING APPROACHES

Several different methods for evaluating vertical separation standards have been used in the past. The two most notable approaches taken in previous studies to the evaluation of safe vertical separation standards for use above FL290 are described below. The first is a procedure in which information about component errors is combined to produce a probability distribution for total errors. Assumptions about the shape of that distribution and an acceptable frequency of rare events are then used in evaluating a separation standard. The second approach is a method in which the collision risk is related to the frequencies of planes being less than an aircraft dimension apart (in any of the three directions) and to the probability of simultaneously overlapping in the other two directions. These frequencies and probabilities are, in turn, based on the distributions of total error in each direction. A collision risk equation is then used to determine a separation standard which meets an acceptable level of risk determined by historically calculated collision risk factors. This section will also contain a discussion of other possible approaches and the assumptions upon which the models are based.

3.1 The Root Sum of Squares (RSS) Approach

This method [42] arrives at a total vertical error distribution by combining the distributions of certain component errors believed to make up the total error. In particular, each component is assumed to follow some distribution, usually taken to be symmetric and with mean 0. Generally, in the past, the distributions of individual component errors have been chosen from among the four given in Figure 3 of Section 2.5. However, the RSS procedure will work equally well if other distributions are used.

The problem now is to describe the distribution of total error, given the distributions for the individual component errors. Assume that the individual errors can be considered as simultaneous contributions that add to one another independently in producing the total error. Then the combined error distribution will have a standard deviation equal to the square root of the sum of the squared component standard deviations. Accordingly, this method is called the root sum of squares (RSS) method. More precisely, if X_1, X_2, \dots, X_n are independent random variables with mean 0 and standard deviations $\sigma_1, \sigma_2, \dots, \sigma_n$ then the variable $X = X_1 + X_2 + \dots + X_n$ will have mean 0 and standard deviation

$$\sigma = \sqrt{\sigma_1^2 + \sigma_2^2 + \dots + \sigma_n^2}.$$

This method for finding the standard deviation of the total error distribution will be valid as long as the following assumptions are met:

- (1) The individual errors are independent.
- (2) The individual errors combine simultaneously and additively to produce the total error.
- (3) All of the individual errors that comprise the total error have been included.
- (4) The standard deviation of each individual error is known.

Note that no assumptions have to be made concerning the particular shapes of the distributions for the individual errors.

At this point certain information about the total error distribution has been obtained: namely its mean ($=0$) and its standard deviation (σ). Knowledge of these two parameters is sufficient for many statistical purposes, but it is not sufficient for the analysis of collision risk. Indeed, there are a multitude of distributions (Figure 4 shows just two of them) that possess the same mean and the same standard deviation. These alternative distributions will in general provide quite different answers to questions about collision risk; for collision risk analysis by its very definition deals with events that are infrequent and altitude deviations that are extreme (i.e. far removed from the mean). As can be seen from Figure 4, the proportion of times a deviation greater than D is observed can be quite different for the two distributions, even though they possess the same mean and the same standard deviation.

In the RSS method, this problem is resolved by making the additional assumption that

- (5) The total error is normally distributed.

This assumption is not unreasonable in light of the Central Limit Theorem, which essentially states that under fairly general conditions the sum of a sufficiently large number of independent random variables is closely approximated by a normal random variable. With this assumption, the total error distribution is now completely specified, since a normal distribution is determined by its mean (0) and its standard deviation (σ).

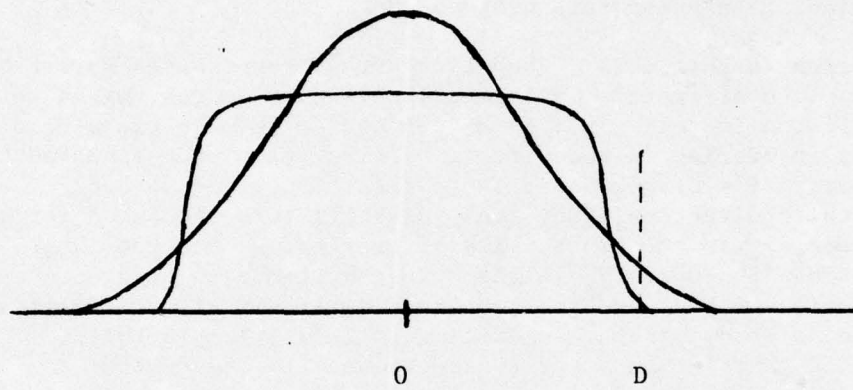
A rather crude idea of "safe separation" can now be found using the probabilities of extreme deviations for normal variables. (A more detailed analysis would need to include effects related to the traffic pattern and density of a given airspace.) Consider two aircraft whose nominal altitudes are separated by a distance S and both of which have a normally distributed vertical position error with standard deviation σ . Then actual separation between the two aircraft follows a normal distribution having mean S and variance $2\sigma^2$ (or standard deviation $\sqrt{2}\sigma$). Since we are interested in situations for which this altitude difference becomes small, we are concerned only with the left-hand tail of this distribution. To assume that three standard deviations provide adequate safety is equivalent to assuming for this case that the risk of collision will be acceptably low when the probability is less than 0.135 percent⁴ that vertical separation between aircraft, nominally separated by S , is reduced to zero.

Thus the RSS method per se does not directly lead to a collision risk measure as defined above. However the assumption of normality of the error distribution can readily be combined with analyses such as that described below to give such a measure. The correctness of the normality assumption

⁴This numerical value derives from the fact that .00135 is the probability that a normal random variable is smaller than its mean by more than three standard deviations. This value applies only if the standard deviation σ is known.

FIGURE 4

Two Distributions Having the Same Mean and
Standard Deviation



is critical, and must be validated against actual data.

3.2 The Reich Approach

A detailed collision risk model for analyzing the effects of separation standards was proposed in 1966 by Reich [32, 33, 34] and has been subsequently modified by others for use in the parallel tracking system over the North Atlantic [15, 43]. This model requires, as input, estimates of such parameters as the physical dimensions of the aircraft, the average relative speeds between aircraft in the three directions and the amount of congestion within the traffic region. In addition, the model requires the probabilities of overlap in the vertical, lateral and longitudinal directions, such values being related to the appropriate separation standard under consideration. As output, the model produces a value for the collision risk, measured as the expected number of fatal accidents per flying hour (where each collision is counted as two fatal accidents). It is the variation of collision risk, as a function of the separation standard being studied, that is of major interest in the evaluation of safe separation standards.

As considered in this model, each aircraft is represented as a rectangular box having the given aircraft's maximum dimensions of length, width and height. A collision is considered to have occurred between two aircraft when they are flying in overlap in two directions (i.e. they are separated by less than an aircraft's dimension in those directions) and an overlap then occurs in the third direction. One such possibility is accounted for by the term $N_x P_{yz}$, where P_{yz} is the probability of overlap in both the lateral and vertical directions and where N_x is the number of times an overlap occurs in some time period with regard to the longitudinal direction. Implicit in this expression, already, is the assumption that position in the x direction is independent of that in the y and z directions. If one further assumes that all three coordinates of position are independent, then the above expression simply becomes $N_x P_y P_z$, where P_r indicates the probability of overlap in the r direction. Because there are two other possibilities that result in a collision, the collision risk between a pair of aircraft is given by the sum of three terms:

$$(1) \text{ Collision Risk} = N_x P_y P_z + N_y P_x P_z + N_z P_x P_y .$$

Each P_r needs to be estimated from the observed distributions of positions in the r direction. What further complicates the matter is the fact that the N_r values depend not only on the flying errors in direction r, but also on their rates of change. This added dependence is intuitively reasonable since the number of overlaps depends on both the probability that an overlap occurs and the average duration of an overlap. Under the assumption that the velocity \dot{r} in direction r follows a distribution which is symmetric about 0, and that position and velocity are independent, Reich derives the approximation

$$(2) N_r \approx \frac{|\dot{r}| P_r}{2\lambda_r} ,$$

where $|\dot{r}|$ is the average relative speed between two aircraft in direction r,

and λ_r is the dimension of the aircraft in direction r . For simplicity, it is assumed here that all aircraft have the same dimension λ ; one could also interpret λ_r as an average aircraft dimension. By virtue of (2), equation (1) becomes

$$(3) \text{ Collision Risk} \approx P_x P_y P_z \left(\frac{|\dot{\bar{x}}|}{2\lambda_x} + \frac{|\dot{\bar{y}}|}{2\lambda_y} + \frac{|\dot{\bar{z}}|}{2\lambda_z} \right).$$

If estimates for the average relative velocities $|\dot{\bar{r}}|$ and the aircraft dimensions λ_r are given, then all that remains to be estimated are the overlap probabilities P_r . These probabilities are in turn derived from the total error distributions for each of the three directions. Just as in the RSS method, the value of P_r (especially the overlap probability in the direction corresponding to the separation standard being considered) depends crucially upon the form assumed for the total error distribution. That is to say, observations in the "tails" of the total error distribution (extreme deviations) are overwhelmingly important in the calculation of these overlap probabilities. The approach taken by Reich proceeds by first making a conservative estimate of the tail area of the distribution. Reich then models the shape of the tails in three alternative ways:

- (a) The pessimistic spike, which places the entire tail area at a single point corresponding to the intended flight path of the neighboring aircraft,
- (b) The (conservative) level tails, in which large errors are assumed to be uniformly distributed (all equally likely from some point on), with the limits of the uniform distribution chosen to maximize the probability of overlap,
- (c) The exponential decay, in which the relative frequencies of large errors are assumed to decrease exponentially with magnitude.

These assumptions about the shape of the tails (together with a fixed assumption about the distribution of small errors) then allow overlap probabilities, and thereby collision risk, to be calculated for each of the three alternative models. (An example of how such probabilities can be derived from the total error distribution is given in Section 3.3) The estimates obtained under assumptions (a)-(c) then provide a range of values for the collision risk. In common with the RSS approach, knowledge about the precise shape of the total error distribution, and in particular, the shape of the tails, is required before confident statements can be made about the actual magnitude of the collision risk.

As it stands, the expression (3) for collision risk is appropriate only for a pair of aircraft, whose respective flying errors are assumed to be independent of one another. Reich also extended the analysis from a pair of aircraft to an entire traffic region, using assumptions about the air-space configuration and traffic densities. The result of this extension turns out to be the adjunction of another multiplicative factor to the expression in (3).

Although the RSS and Reich methods seem to be two entirely different and separate approaches, they are not necessarily inconsistent. In fact some combination of the best features of both methods may be possible, since they address different parts of the problem. The RSS method focuses on the calculation of the distribution of total vertical error from component errors. The Reich model focuses on the evaluation of collision risk from knowledge of the distributions of errors in each of the three directions. One could therefore use the RSS method (or some other method of combining individual component errors) to calculate the vertical error distribution, and then use that distribution as input to the Reich collision risk analysis. Such a procedure capitalizes on advantages inherent in both methods: namely, it relates the risk of collision to component errors, thus allowing the evaluation of changes in the performance of components, and it contains a direct and specific analysis leading to the calculation of collision risk (unlike the RSS method). This hybrid approach also tends to avoid the failings of the two individual methods, and is therefore a strong candidate for further investigation once data concerning the error distributions are available.

3.3 Analysis of the Tails of Distributions

As noted previously, the RSS and Reich approaches are actually complementary. The first attempts to synthesize a total error distribution from component errors. The second approach requires as input the total error distribution and produces information about the risk of aircraft collision. In both cases it becomes apparent that it is the extreme deviations (out in the tails of the distribution) that are important, and not the small or moderate-sized deviations.

Another way to see that the effect of the tail shape can be crucial is by considering two aircraft over the same geographic point on the earth and nominally separated by S feet in the vertical direction. Suppose further, as seems reasonable, that both aircraft are subject to the same total vertical error distribution $f(x)$. Then the probability of vertical overlap (i.e. the probability that the separation between the two aircraft is less than h , the vertical dimension of an average aircraft) is given by

$$P(h) = \int_{-\infty}^{\infty} f(t) \left[\int_{t-h}^{t+h} f(y-S) dy \right] dt,$$

which upon using the substitution $v = -y+t+S$ becomes

$$P(h) = \int_{-\infty}^{\infty} f(t) \left[\int_{S-h}^{S+h} f(t-v) dv \right] dt.$$

Since h is small relative to S , the term in brackets above can be approximated by $2h f(t-S)$ and so

$$P(h) \approx 2h \int_{-\infty}^{\infty} f(t) f(t-S) dt.$$

If the distribution f is only moderately spread out relative to S , then at least one of the values of t and $t-S$ which appear in the product will be out

in a tail of the distribution. In other words, the shape defined by the tails of the distribution will have a considerable effect on the value of $P(h)$, the overlap probability.

It has been reported by several sources [29], [30] that the observed tails appear to be fatter than one would expect from a normal distribution. If this is the case, assumption (5) of Section 3.1 does not hold and the 3 standard deviations used by the RSS method may contain significantly less of the total distribution than the 99.7 percent contained within 3 standard deviations from the mean of a normal distribution. To obtain an equivalent proportion of a fatter-tailed distribution, it would be necessary to include more than 3 standard deviations, thus increasing (perhaps critically) the acceptable separation standard. However, in order to assess the appropriate factor by which to multiply the standard deviation in order to include 99.7 percent of the distribution, it is necessary to know what the distribution is. This negates one of the advantages claimed for the RSS approach, namely not having to know the actual distribution. A more thorough study of the tails of the error distribution is clearly necessary since so much of the analysis depends on this critical information.

3.4 Convolution of Distributions

In describing the RSS method, it was noted that the precise shapes or forms of the component distributions are not required. Rather, only the values of the component error standard deviations are needed, together with the requirement that there be "enough" component errors for the Central Limit Theorem to apply. The result is that the total error distribution is approximately normal, with a calculable mean and standard deviation.

There has been some concern that the total error is not in practice normally distributed. Therefore it is appropriate to consider, as an alternative, combining known component distributions to give an analytic description of the total error distribution. The statistical method for doing this is termed the method of convolution [18, pp. 187-188].

This procedure makes use of the precise (assumed) forms of the component distributions in producing an exact expression for the total error distribution. Again, certain assumptions must obtain before the method can be used; namely, assumptions (1) through (3) of Section 3.1 are presumed to hold, and in place of assumption (4) the following stronger assertion is made:

(4*) The distribution of each individual error is known.

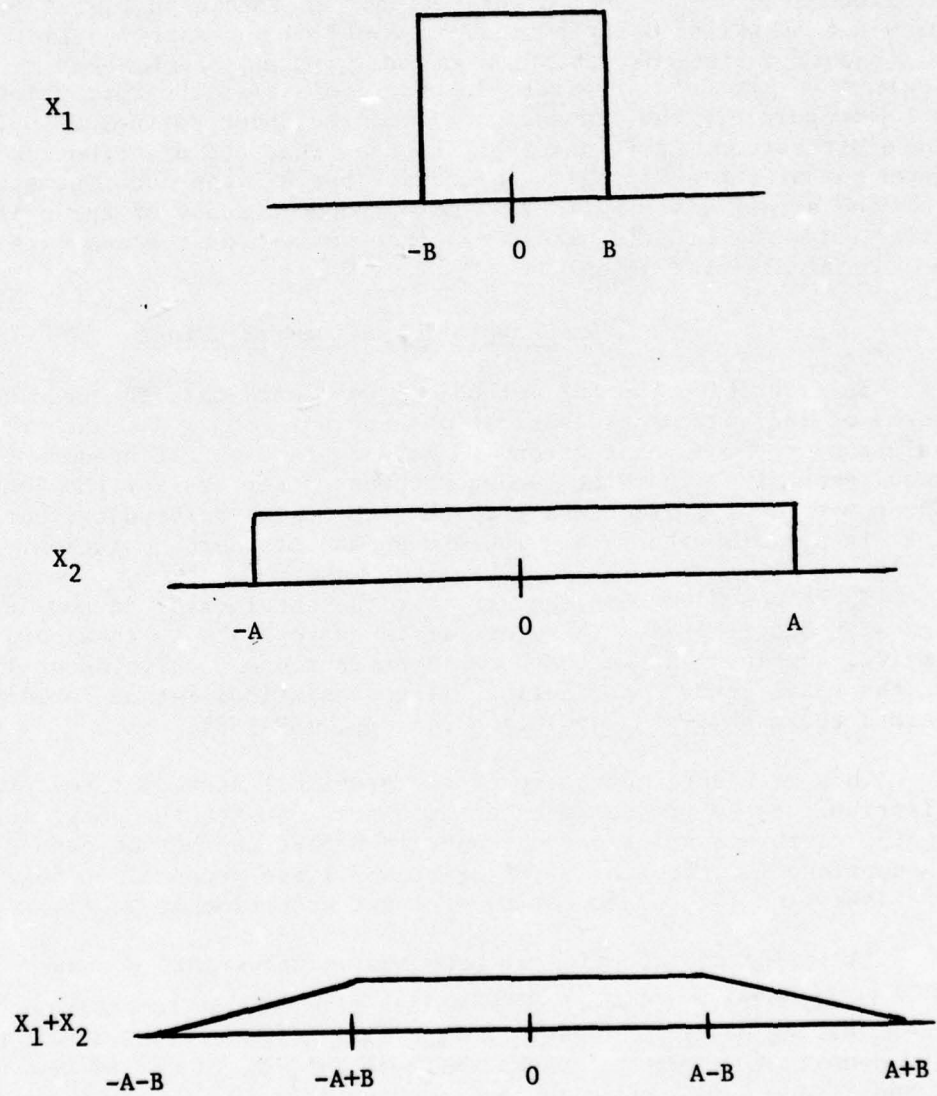
To illustrate the method, consider the case of two component errors X_1 and X_2 having distributions $f_1(x)$ and $f_2(x)$, respectively. Then the probability density function f for the variable $X = X_1 + X_2$ is called the convolution of f_1 and f_2 and is given (assuming independence) by

$$f(x) = \int_{-\infty}^{\infty} f_1(t) f_2(x-t) dt.$$

This relation can be generalized so that the distribution for $X = X_1 + X_2 + \dots + X_n$ will be found using repeated convolution operations. For example, the convolution of two rectangular distributions is found to be in general a trapezoidal distribution (see Figure 5). Also, the convolution of two normal

FIGURE 5

Convolution of Two Rectangular Distributions



distributions is again a normal distribution.

When the component distributions are more complex and when a number of component distributions must be combined by convolution, it is difficult to find an exact analytical form for the composite error. An alternative procedure is to use Monte Carlo methods to sample from the individual distributions and thus generate an approximation to the total error distribution. We did this using representative values for the parameters of the component distributions (with shapes as specified by the Panel on Vertical Separation of Aircraft [25]). The resulting combined distribution appeared for all purposes to be normal. In fact, a number of statistical tests for normality were applied⁶ and none of these gave any reason to reject the hypothesis of normality. Moreover, the total error was fitted by a normal distribution better than any other chosen from a large family of possible symmetric distributions (including the logistic, double exponential and Cauchy distributions). These observations remained true for different choices of parameter values, taken from the ranges given in Tables 1-4 of Section 2.5.

To explore by Monte Carlo methods the effects of convoluting distributions of the types shown in Figure 3, several computer runs were made convoluting a single normal distribution with a single rectangular distribution, varying the ratio of the standard deviations of the two distributions. As long as the standard deviation of the rectangular distribution was approximately equal to or less than that of the normal distribution (ratios of 1, 1/2, 1/4, 1/8, 1/164 were tried), then the resulting distribution was essentially normal. When the standard deviation of the rectangular was increased to be significantly greater than that of the normal (ratios of 2 and 4 were run), the convolution was not normal but had shorter tails than a normal distribution.

More emphatically, it is shown in Appendix A that, according to the definition used there for comparing tail lengths, the convolution of a normal and a rectangular distribution must have shorter tails than normal. Moreover, the general result given in Appendix A guarantees that the convolution of a normal distribution with any bounded probability density function having a finite range also must have shorter tails than normal. In particular, this result implies that if the distributions to be convoluted consist primarily of normal and rectangular distributions (as is assumed in most of the ICAO documentation), then the resulting distribution will either be approximately normal or have shorter tails than a normal distribution (with the same standard deviation).

The processes most likely to introduce distributions with longer tails than normal are the human actions in which large blunders might occur, including

⁶ The statistical computer programs used are more fully described in James J. Filliben, "DATAPAC: A Data Analysis Package", to appear in Proceedings of Computer Science and Statistics (9th Symposium on Interface), April 1976, Harvard University, Cambridge, Mass.

inattentive flying procedures by the pilot and missetting of the standard atmosphere by the pilot. The first of these, usually called "flight technical error", refers to the pilot's ability and inclination to maintain the assigned altitude. This error is decreased when altitude-hold equipment is used, since pilot inattentiveness is no longer a factor. As already noted, however, there may be errors when altitude-hold is initiated, and altitude-hold is usually disengaged during turbulent conditions. The second factor, missetting the standard atmosphere, is often considered part of pitot-static error, but is included here because it too is a human failure which can result in gross position error.

3.5 Examination of the Model Assumptions

From the previous section it can be seen that the assumption of normality used in the RSS method appears to be consistent with the Monte Carlo results based on parameter values from Tables 1-4, if the other assumptions on which this convolution approach is based --- namely (1), (2), (3), (4*) --- are correct. Since some evidence exists [29, 30] to suggest that the total error distribution is not in practice normally distributed (especially in the tail areas), it is necessary to examine the validity of these assumptions and see whether alternative ones are more reasonable.

Assumption (1), the assumption that the component errors are distributed independently of one another, may not necessarily hold. In fact, it does not seem unlikely that some of the errors referring to the more detailed components of the height-keeping system are dependent --- e.g. the friction and backlash errors. It would be quite difficult, without much more information, to model mathematically the effects of such possible dependencies. Accordingly, a more reasonable approach is to combine together certain groups of errors in order to obtain a collection of errors that are for the most part independent. For example, aggregation into the broad categories of static pressure system error, altimeter error and pilot response error would achieve a fairly high degree of independence. Moreover, it is probable that data on height-keeping errors could for the most part be obtained at roughly this level of aggregation, rather than a finer one.

Assumption (2) reflects the belief that individual errors combine simultaneously and additively. While such an assumption about the errors appears to be a good initial approximation to the truth, there are alternative approaches to modeling the combination of errors. Several of these are mentioned below:

- (a) Errors may vary from aircraft to aircraft and crew to crew. For example, any individual aircraft may experience a total error which is distributed normally with mean 0 and standard deviation

σ . Yet the parameter σ may vary from one aircraft/crew configuration to another, and so it may be reasonable to assume that σ itself follows a probability distribution [5, 27]. The resulting observed error distribution, based on a sample of different aircraft, may not resemble the error distribution of any individual aircraft.

- (b) The total error may in fact be a mixture of several parts. For example, total error might be considered as normally distributed under usual conditions. Furthermore, suppose there is some probability of a blunder occurring, where the magnitude of the blunder follows some other distribution. Then the distribution of total error will be determined by a weighted average of the two given distributions [11, 26].
- (c) It is possible that certain error components are in fact time-varying quantities. For example, some of the errors may occur only during certain phases of flight or may be applicable only while certain equipment is operating (or not operating).

Assumptions (3) and (4*) are also important, requiring that all reasonable sources of error have been identified and that knowledge about their probabilistic behavior is available. A carefully designed data collection effort (especially one geared toward the measurement of somewhat aggregated error components) can help to ensure that these assumptions hold, at least approximately.

3.6 Choice of Model

It is clear from the discussion above that further modeling awaits a structured planned data collection effort designed to permit fuller understanding of the actual shapes of the tails of the vertical error distribution and the tail distributions of the larger error components, particularly flight technical and other human errors. A review of previous attempts at gathering data for this purpose shows many pitfalls, among them the difficulty in identifying (after the fact) the assigned altitude and when an aircraft is actually in level flight, the problem of identifying actual pressure altitude, and the need for collecting a large sample of data which covers a variety of aircraft types and crews.

Once such a data sample is available, choice of model may in part be determined by measures of fit to these data. One might, for example, choose the total error distribution based on one of the following families of distributions: Johnson S_U , Pearson Type VII, Tukey λ or generalized exponential. All of these families include a variety of individual distributions, with differing characteristics obtained by varying parameters in the distribution [17, 18]. In each case, the particular member of the family represented by the observations may be found by estimating the values of those parameters best fitting the data.

Two other modeling approaches, also involving data fitting, have been proposed. The first involves imagining two types of flights, having two distinct error distributions. One is the usual flight where some errors occur but nothing untoward happens, and whose error distribution is normal. The other is a "blunder flight" whose error distribution is totally different, perhaps bimodal, and has a much greater standard deviation. Blunder flights occur a certain (determined from observed data) fraction of the time. The total distribution becomes a weighted average of the two types of distributions (weighted by the fraction of flights falling into each category).

In the second approach, it is assumed that all aircraft errors follow the same type distribution, usually the normal, but that one of the parameters, say the standard deviation, varies from aircraft to aircraft following a second distribution. For example, the Burgerhout distribution results when the individual aircraft errors are normal with mean 0 and standard deviation σ and when σ itself varies according to a folded normal distribution [17] with mean μ and standard deviation σ_1 . Other combinations of distributions are possible, and if the data were available one might determine the most desirable distribution type, again by applying data fitting techniques to select a "best" member from some general family of distributions.

4. DATA REQUIREMENTS

In order to test model assumptions and to evaluate the reasonableness of the various modeling approaches, it will be necessary to obtain additional data, since currently available sources are inadequate for these tasks. More specifically, a data collection effort is needed in order to specify the distributions of:

total vertical error,
static pressure system error,
altimeter instrument error, and
pilot response error.

It may be possible to obtain static pressure system error and altimeter instrument error data from controlled laboratory experiments, since both are basically errors in equipment performance. By contrast, the total error and the pilot response error will require field observations using airborne aircraft. Since information is required on extreme or gross deviations, the set of observations must be quite large in order to provide enough data points in the tails of the distributions to allow estimating the size and shape of those tails. This implies that data collection will unavoidably be expensive. Careful design of the data gathering effort will thus be necessary, to permit collection of sufficient data at a reasonable cost. Precautions must be taken to ensure the usefulness of each piece of data collected, and to ensure that no important factors are overlooked. The data collection must also be designed to aid in further modeling and choice of model, by facilitating the checking of model assumptions.

This section will include a discussion of many of the issues which should be considered in the design of a data collection effort. These issues are presented from the point of view of the analyst who desires as complete and carefully specified a data set as possible, and this section does not explicitly address the budgetary or feasibility problems of obtaining such data. Thus these remarks describe an ideal goal towards which any data collection effort should strive. Such remarks should serve as a vehicle to stimulate discussion of the kinds of data needed and possible methods of obtaining them, but they should not be taken as requirements. Rather a careful design must balance the desirable characteristics described below against technical feasibility and budgetary and manpower constraints, with the objective of finding an acceptable middle ground.

4.1 Avoiding Possible Problems in Data Collection

Previous data collection efforts have encountered several problems in obtaining the desired numbers and in interpreting the information after it was gathered.

One of these problems is the identification of the flight level to which a given aircraft was actually assigned. Actual flight level flown and assigned flight level must be obtained from separate data sources, and the two pieces of information must be coordinated in time. Analyses which infer assigned flight level from that actually flown (by using the closest 1000 foot level) will fail to capture truly gross deviations from assigned flight level. It is therefore necessary to collect flight level assignments along with actual height flown in order to assess error magnitudes accurately.

Similarly, those analyses which infer controller intervention if aircraft depart significantly from planned course or flight level will also miss gross deviations. For example, aircraft flying at an even flight level (odd flight levels are usually assigned above FL290) cannot be presumed to have been assigned there by a controller. Again it is necessary to know what the controller's actions are, and therefore it is valuable to collect data both on actual performance and on the controller's directions to pilots.

Several other pieces of information must be collected about each flight for which height-keeping performance is to be analyzed. In particular, aircraft type and altimeter type must be recorded in order to evaluate the effects of differences in performance among aircraft on the error distributions. It is also desirable to know whether the altitude-hold equipment was or was not in force, since pilot response error will be affected by the use of such equipment. Further, it is useful to know if weather conditions are stable or changing, and if barometric pressure is varying, thus causing variation in pressure altitude. When turbulence exists, as in a thunderstorm, then this condition will affect ability to measure pressure accurately and to maintain an equal pressure contour. All of these auxiliary data factors should be collected in conjunction with and at the same time as the actual aircraft altitude, to permit evaluating the (possibly systematic) effects of these factors. (Other such systematic error factors are discussed in the next section.)

A final problem in collecting data is the difficulty of identifying the pressure altitude flown. Although ground stations can monitor actual altitude (height above sea level) quite accurately using radar, the aircraft is not assigned to an actual height but rather to an equivalent pressure altitude. The two would be the same only if the standard atmospheric pressure were the true reference pressure. Obtaining actual ambient air pressure at the aircraft's altitude appears to require special instrumentation whose use is not only expensive but also defeats the aim of obtaining data on the usual response of pilots (who therefore should not know they are being specially monitored). Some method must be devised for obtaining the actual barometric pressure at given altitudes in order to establish true pressure altitude flown.

None of these problems should prove insurmountable, but all require careful consideration and should be taken into account in designing the data collection effort. Anticipation of these problems and provision, prior to data gathering, of means for overcoming them will contribute greatly to the success of the collection task and the usefulness of its product.

4.2 Consideration of Factors Causing Systematic Errors

As noted above, the design of the data collection effort must take into account subsidiary factors which can systematically influence the results. Data should be recorded over the whole range of values for such a factor, to ensure that the observations recorded are properly representative. A preliminary list of such factors appears in Table 5, in approximately their expected order of importance or effect.

The type of altimeter certainly has an effect on instrument performance, and so it is necessary to include data gathered from the different altimeter types in use above FL290, at the least Types II (precision) and III (servo-corrected) which are described in Section 2. There may also be some variation by manufacturer, so data should be taken from several manufacturers' instruments. If altimeter type is the same for all of a particular model of aircraft (or aircraft type and airline), one need consider only the latter in the design of the data collection. Aircraft type must, however, be taken into account since different aircraft have different shapes and different locations for the static pressure sources, leading possibly to different error character-

TABLE 5

Factors Which Can Cause Systematic Errors

1. Altimeter type
2. Aircraft type
3. Altitude-hold equipment in use
4. Meteorological conditions
5. User class
6. Crew and aircraft variability
7. Altitude
8. Calibration cycle
9. Age of aircraft
10. Surveillance/control system
11. Traffic density

istics. Care must be taken that the aircraft types sampled are representative of those generally found above FL290.

Since altitude-hold eliminates many of the human error sources, it is desirable to have data collected both with and without this equipment in operation. Furthermore, it is desirable that the two situations be represented in the data set according to their relative frequencies of occurrence, or at least one should be able to estimate what these relative frequencies are.

Meteorological conditions, particularly any turbulence or abrupt changes in barometric pressure, also affect altitude measurements. Altitude-hold is usually disengaged during turbulence, since this equipment's efforts to follow an equal pressure contour may lead under such conditions to rather large height fluctuations in a short time span. Poor weather conditions require greater attention by the pilot to his instruments, providing less opportunity for attentiveness to any one of them and perhaps leading to greater altitude deviations. On the other hand, since good weather allows visual observation of other aircraft, pilots may be less attentive under such conditions than at times when visibility is poor. These various speculations highlight the necessity for data to be gathered under varying meteorological conditions to ensure that effects of those conditions can be evaluated.

The majority of aircraft at altitudes above FL290 are those of commercial air carriers, but military aircraft also operate in these altitudes as do some general aviation aircraft. Each user class is likely to have its own equipment and procedures for calibrating that equipment. In addition there are likely to be differences in pilot flying hours and flight frequency. All these differences combine to suggest possible systematic variation in height-keeping error among the three classes of users.

In an effort to collect data on actual vertical errors it is desirable to take into account the variability among equipment and crews: in particular, the variability for the same crew on different flights and the variability for the same aircraft with different crews. It will of course not be sufficient to have data relating only to one crew or only to one aircraft. Thus, for instance, a design which relies on a single heavily instrumented aircraft will not provide sufficient data to resolve the many questions about altitude error.

Another factor to be considered in planning the data collection effort is altitude itself. Clearly all data must refer to aircraft flights whose assigned altitude is above FL290, but it is desirable that several different altitudes within that range are represented. For example, each aircraft type is designed to operate most efficiently in a particular altitude range, and thus the pilot usually requests clearance to fly at an assigned altitude in that range. In addition, air traffic control procedures assign aircraft flying in opposite directions to different flight levels. Accordingly, if data are recorded only on aircraft flying at one flight level (and hence in only one direction) the effects of prevailing wind patterns (such as the jet stream) may not properly be accounted for. Therefore several altitude levels should be represented in the data set.

The precision of most equipment deteriorates with age. Calibration is designed to reverse this process, at least partially, by resetting the instrument so that certain test measurements are made accurately. The calibration cycle (i.e., the time between successive calibration tests) thus has an effect on the magnitude of instrument errors. Since calibration procedures are largely a matter of the individual owner's choice (as long as minimum standards are met), the actual calibration practices can affect the quality of height-keeping. Therefore it is desirable that the data set include operators with different calibration procedures, and aircraft at different points in the calibration cycle.

The age of the aircraft itself may have some effect on height-keeping error. As noted in Section 2's description of the static pressure system, skin deformations or dents in the neighborhood of the static pressure opening can significantly affect the pressure measurement; such deformations become more likely with age. To the extent that aircraft types change with time, aircraft type may be a fairly good indication of the age, so that data on age of specific aircraft may not be required.

The presence or absence of an independent surveillance system can affect the pilot's perception of acceptable height deviations and thus influence the magnitude of pilot response errors. Radar surveillance covers all of CONUS (Continental U. S.) but high-traffic oceanic areas, such as the North Atlantic or the area between the West Coast of the U.S. and Hawaii, do not have radar coverage; controllers must rely on pilot position reports in these regions. Different lateral and longitudinal separations are required over the ocean, but the vertical separation rules are the same in all areas, regardless of the availability of surveillance and navigational systems. En route radar displays have flight level appearing on the radar scope for any aircraft with an operating Mode C transponder, but controllers do not continuously monitor altitude as they do position. Their intermittent and advisory monitoring may, however, aid in preventing gross altitude deviations and situations in which collision is imminent. Thus it is reasonable to expect that the presence or absence of a surveillance system may affect the distribution of vertical position error, and should be considered in the data collection design.

Traffic density is ultimately reflected in the Reich model through the factors P_x , P_y and P_z , since the probability of losing separation in one of the three^xdirections^z is in part a function of how often aircraft are directly behind one another on the same track, pass on adjacent tracks, or pass on adjacent flight levels of the same track.

In addition to these effects of traffic density, the pilot's knowledge of the proximity of other aircraft, from radio reports or sightings, may affect his attentiveness and adherence to assigned flight level. Therefore traffic density can have an effect on the error magnitudes, and data on this factor will be required for use in the Reich model.

The various factors listed in Table 5 can each cause systematic variations in the distribution of vertical position error and in one or more of the component error factors. Thus a good data collection design will ensure that

the effort includes representative values for each factor and combinations of factors that are important at the altitudes of interest.

While it may be economically prohibitive to include all relevant factors in the experimental design, at least the three major ones -- aircraft type, altitude-hold in use, and meteorological conditions -- should be addressed. Surrogates for factors not included directly (airline and aircraft type for altimeter type, as an instance) can perhaps be used when necessary to ensure representation of other factors, and biases in the collected data set should be recognized during analysis of those data.

4.3 Testing Model Assumptions

The data, once collected, must be analyzed to determine how representative a sample has been drawn. In particular, it can be judged how well the data reflect the types of situations usually encountered in the environment being considered and to what extent the various modeling assumptions noted earlier hold. The two main model assumptions to be tested are: that component errors are independent, and that the distribution of total error (and in particular its tails) is normal. As a first test for the independence of the three component errors (i.e., to check that the errors in one component are not associated with errors in another), one would compute the correlation coefficients between all pairs of components. If a coefficient is near +1 or -1, the two factors display a high degree of linear association; if the coefficient is near 0, the two factors display very little association or correlation with one another. Other statistical measures or tests may also be used to establish the degree of association between the component errors.

The assumption of normality of the tails may be investigated by plotting the distribution on probability graph paper and comparing the resulting curve with a straight line. Several test statistics, such as the ratio of the mean deviation to the standard deviation, the sample skewness and the sample kurtosis [17] can be computed and compared with known values of those statistics for a normal distribution. In addition, one may use regression to fit the observed total error distribution within a general family of distributions that includes the normal distribution for certain values of the parameters, and see how closely the "best-fit" parameter values resemble the "normal distribution" values. Most of these procedures are easily available using present statistical computation packages, so that testing for independence of the component errors and normality of the total (or a component) error distribution is a relatively straightforward task once data are available. Thus a variety of statistical procedures can be performed on the data set once it is collected, and before it is used in modeling.

5. CONCLUSION

In this report we have discussed several approaches to evaluating vertical separation standards for use above FL290. Various models have been proposed to aid such an evaluation; choice among them rests in part on how well they meet the following criteria:

1. The model should be capable of reflecting changes in the system.
2. The model should relate system characteristics, including separation standards, to some measure of system safety.
3. The model must be "computable", relying on quantifiable measures and functions.
4. The data required as model input must be collectable with a reasonable effort.
5. The model must reflect actual error distributions found, instead of those most easily handled mathematically.

Two models which have been proposed for this application were described in Section 3. The first is the RSS approach, which combines characteristics of individual error components into an estimate of total vertical position error. The second model, originally formulated by Reich, combines characteristics of the error distributions in each of the three coordinate directions (along track, across track, and vertical) into a measure of collision risk.

Neither of these approaches meets all five of the criteria listed above. The RSS method does not meet criterion 2, since it does not relate directly to a safety measure, and it also fails criterion 5 since it relies heavily on the normal distribution even though a fatter-tailed distribution may apply. The Reich model does not meet criterion 1, since there is no way to relate system characteristics, other than the total error distributions in each of the coordinate directions, to the collision risk. Both approaches do involve computable models whose data are collectable, meeting criteria 3 and 4.

Since neither model is wholly satisfactory, this report has contained suggestions for modifying and combining the two approaches into one which would meet all five criteria. Such an approach would rely either on a modified RSS method or on convolution of individual error distributions for obtaining the distribution of vertical position error, and then use that distribution as input to the Reich collision risk calculations. Other approaches listed in Sections 3.5 and 3.6 might also be examined in future work.

In Section 2 of the report we discussed in detail many of the component errors which contribute to vertical position error. The detailed component errors were then combined into 4 categories:

1. static pressure system errors,
2. altimeter instrument errors,

3. pilot response errors, and

4. other errors.

The error distributions for these categories, if known, would be input to a RSS or convolution model of the total vertical position error. It is assumed for this process that these errors are independent and additive, with known standard deviations (for the RSS approach) or known distributions (for the convolution approach).

Section 4 of the report discussed the collection of data on the component and total vertical position error distributions. Existing data have proved inadequate for determining these distributions; much previous modeling has been based on assumptions that distribution types are of a particularly tractable form, rather than whether they are suitable or appropriate for the actual data. Auxiliary factors whose neglect might create systematic bias in a collected data set have also been discussed.

Because of the size of the data set required to estimate the tails of the distributions, Section 4 stresses the importance of a well-designed plan for collecting the data, taking into account the various factors which could bias the results. The collection of such a data set will clearly provide a more solid basis for evaluating alternative approaches to modeling aircraft vertical separation above FL290.

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APPENDIX A.

COMPARISONS OF TAIL LENGTHS OF DISTRIBUTIONS

This appendix provides a formal justification of the observation, made in Section 3.4 on the basis of Monte Carlo simulations, that the convolution of (zero-mean) normal and rectangular distributions cannot yield a distribution with longer-than-normal tails. In fact, a much more general result is shown to obtain: namely, the convolution of a normal distribution with a continuous distribution defined over a finite range cannot have longer-than-normal tails.

It is assumed that the random variables X, Y, Z, \dots under consideration have distributions with mean 0 and finite variance. For such random variables, the following definitions for judging relative tail lengths seem quite reasonable.

DEFINITION. Suppose X and Y have the same mean and same variance. Then the random variable X is longer tailed than random variable Y if there exists $t_0 > 0$ such that

$$\text{Prob} \{ |X| > t \} > \text{Prob} \{ |Y| > t \}$$

for all $t > t_0$.

DEFINITION. Given a random variable X , let Y be the normal random variable having the same variance as X . We say X has shorter tails than normal if Y has a longer tail than X .

We now show that if X is normal and Y is a continuous random variable defined over a finite range (both variables being independent), then the variable $Z = X + Y$ has shorter tails than normal. In other words, it is impossible to obtain a distribution with longer-than-normal tails by convoluting a continuous distribution having a finite range with a normal distribution. To demonstrate this, suppose that X and Y are independent random variables with mean 0. Let $g(t)$ be the probability density function for Y , where $g(t) = 0$ outside $[-B, A]$, and the standard deviation of Y as σ . Without loss of generality, it may be assumed that X follows a normal distribution with unit standard deviation. By the convolution formula given in Section 3.4, the probability density function of $Z = X + Y$ is

$$(A.1) \quad f(x) = \int_{-B}^A k \exp\{-(x-t)^2/2\} g(t) dt,$$

where the abbreviation $k = (2\pi)^{-1/2}$ is used. Since Y has standard deviation 1, it follows from the RSS formula that Z has standard deviation

$$(A.2) \quad \sigma_0 = (1 + \sigma^2)^{1/2}.$$

The tails of $f(x)$ are to be compared with those of the normal distribution having the same standard deviation σ_0 , namely

$$(A.3) \quad f_0(x) = (k/\sigma_0) \exp\{-x^2/2\sigma_0^2\}.$$

It will be shown below that

$$(A.4) \quad f(x)/f_0(x) \rightarrow 0 \text{ as } x \rightarrow \infty,$$

and this implies that $f_0(x)$ has longer tails than $f(x)$.

For the proof of (A.4), first observe that

$$-(x-t)^2/2 = -x^2/2 + xt - t^2/2 \leq -x^2/2 + xt,$$

so it follows from (A.1) that

$$(A.5) \quad \begin{aligned} f(x) &= k \int_{-B}^A \exp\{-(x-t)^2/2\} g(t) dt \\ &\leq k \exp\{-x^2/2\} \int_{-B}^A \exp\{xt\} g(t) dt. \end{aligned}$$

Since $g(t)$ is continuous over the closed interval $[-B, A]$, it attains a finite maximum g_0 on that interval: that is, $g(t) \leq g_0$ for all $-B \leq t \leq A$. Thus, using (A.5),

$$\begin{aligned} f(x) &\leq k g_0 \exp\{-x^2/2\} \int_{-B}^A \exp\{xt\} dt \\ &= k g_0 \exp\{-x^2/2\} (\exp\{Ax\} - \exp\{-Bx\})/x. \end{aligned}$$

From this and (A.3), we have for $x > 0$

$$(A.6) \quad f(x)/f_0(x) < \sigma_0 g_0 \exp\{-ax^2/2\} (\exp\{Ax\})/x,$$

where $a = 1 - 1/\sigma_0^2 > 0$ because of (A.2). Since the right-hand side of (A.6) goes to 0 as $x \rightarrow \infty$, the truth of (A.4) is readily established.

In particular, the above result shows that the convolution of a normal and a rectangular distribution yields a distribution having shorter tails than normal. Moreover, the result implies that the repeated convolution of a normal with any number of rectangular distributions is again shorter-tailed than normal. Actually, the assumption of continuity is not crucial for the result to hold; rather, it is only necessary that the probability density function (which encloses unit area) be bounded. For example, it can be shown that the convolution of a normal distribution with a limit (two-point discrete) distribution -- it does not have (and is not well-approximated by distributions having) a bounded density -- yields a distribution that has longer (not shorter) tails than normal. However, since the convolution of a rectangular and a limit distribution does have a bounded probability density function, the convolution of a number of normal, rectangular and limit distributions cannot have longer-than-normal tails.