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## MODIFIED GUIDANCE LAWS FOR ESCAPING A MICROBURST WITH TURBULENCE

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#### Abstract

This paper introduces Modified Altitude- and Dive-Guidance laws for escaping a microburst with turbulence. First, a new safety metric is constructed that quantifies the aircraft upward force capability in a microburst encounter. In the absence of turbulence, the safety factor is shown to be a decreasing function of altitude. This suggests that descending to a low altitude may improve safety in the sense that the aircraft will have more upward force capability to maintain its altitude. In the presence of stochastic turbulence, the safety factor is treated as a random variable and its probability distribution function is analytically approximated as a function of altitude. This approximation allows us to determine the highest safe altitude at which the aircraft may descend, hence avoiding to descend too low. This highest safe altitude is used as the commanded altitude in Modified Altitude- and Dive-Guidance. Monte Carlo simulations show that these Modified Altitude- and Dive-Guidance strategies can decrease the probability of minimum altitude being less than a given value without compromising the probability of crash. That is, an aircraft with Modified Altitude- or Dive-Guidance can have a higher recovery altitude without increasing the risk of ground contact or stall.1

#### 1 Introduction

Microbursts are a hazard for landing aircraft, and associated escape strategies have been studied in the literature [1]. Among these studies, only Refs. [4], [10], and [12, 13] suggest that an initial descent may improve the safety of an escape maneuver. However, Refs. [4], [10] and [12] use point-mass aircraft models and do not consider the effect of turbulence, stall prevention action, or air vorticity on escape performance. Our previous study [13], using a 6-DOF aircraft model and taking into account the effects of turbulence, stall prevention and air vortic-

ity, showed that the probability of crash decreases as the commanded altitude decreases as long as the commanded altitude is higher than an optimal value. However, instead of descending to an optimal altitude in every microburst encounter, it may be possible to safely recover with a commanded altitude that is higher than the optimal commanded altitude. Ref. [3] provides a formula for selecting the target altitude, based on optimal trajectory studies of a point-mass model of an aircraft flying in a vertical plane through a microburst without turbulence.

This paper provides a procedure to determine the highest safe commanded altitude for a microburst encounter, depending on the strength of microburst and the aircraft energy state. Thus, the aircraft is prevented both from descending unnecessarily to an optimal altitude and from flying so high that it runs into stall. This goal is achieved by utilizing a new safety factor constructed in this paper. We first define this safety factor, that quantifies the upward force capability of the aircraft, and show that, in the absence of turbulence, it is a decreasing function of altitude. Then, in the presence of stochastic turbulence, we treat the safety factor as a random variable, and its probability density function (PDF) is approximated analytically as a function of altitude. This analytical approximation allows us to determine the highest safe altitude in the sense that the aircraft flies with minimum, or prespecified, probability of failing to have enough vertical force capability to maintain the altitude. This highest safe altitude is used as commanded altitude in the Modified Altitude and Dive Guidance Strategies that we propose. Our results suggest that, under the assumptions of this paper, altitude- and dive-guidance can be improved by this modification, in that we can decrease the probability of minimum altitude being less than a given value without compromising the probability of crash. Hence, in a microburst encounter, the highest safe altitude can be computed using information on the microburst and aircraft energy state, and the aircraft can be guided to fly at that altitude with minimum or prespecified probability of failing to have enough vertical force capability. Like in Ref. [13], Modified Altitude-Guidance appears to perform better than the other escape strategies.

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## 2 Mathematical Model

The equations of longitudinal aircraft motion (including the effect of windshear) used in this paper are equivalent to those given in Ref. [13]. Aircraft data and aerodynamic coefficients used in this study are representative of a large, jet-engine commercial transport airplane in landing configuration [14].

The equations of translational dynamics and kinematics are:

$$\dot{V} = -g\sin(\theta - \alpha) + \frac{1}{m} \left[ -D + T\cos(\alpha + \delta) \right] 
-\dot{W}_x \cos(\theta - \alpha) + \dot{W}_z \sin(\theta - \alpha) , \qquad (1) 
\dot{\alpha} = q + \frac{g}{V} \cos(\theta - \alpha) - \frac{1}{mV} \left[ L + T\sin(\alpha + \delta) \right] 
-\frac{\dot{W}_x}{V} \sin(\theta - \alpha) - \frac{\dot{W}_z}{V} \cos(\theta - \alpha) , \qquad (2)$$

$$\dot{x} = V \cos(\theta - \alpha) + W_x , \qquad (3)$$

$$\dot{z} = -V\sin(\theta - \alpha) + W_z . (4)$$

The equations of rotational dynamics and kinematics are:

$$\dot{q} = \frac{\mathcal{M}}{I_{yy}}, \qquad (5)$$

$$\dot{\theta} = q. \tag{6}$$

The equation for engine dynamics is:

$$\dot{\xi} = \frac{1}{\tau} \left( \xi_t - \xi \right). \tag{7}$$

The above equations are based on the following assumptions: (i) the wind flow is steady, (ii) the earth is flat and non-rotating, (iii) the aircraft weight is constant, (iv) the flight is in a vertical plane. The thrust T is assumed to have a fixed inclination  $\delta$  relative to the zero-lift axis, but the thrust vector remains in the aircraft plane of symmetry. The throttle response is modeled as a first-order lag with time constant  $\tau$ . The maximum thrust is assumed to be a function of airspeed only, i.e.

$$T = \xi T_{\text{max}},\tag{8}$$

where

$$T_{\text{max}} = T_0 + T_1 V + T_2 V^2. \tag{9}$$

The aerodynamic forces and their coefficients are

$$D = \frac{1}{2}\rho V^2 \mathcal{S}C_D, \tag{10}$$

$$L = \frac{1}{2}\rho V^2 \mathcal{S}C_L, \tag{11}$$

where [14]

$$C_D = C_{D_0} + C_{D_{\alpha}}\alpha, \tag{12}$$

$$C_L = C_{L_0} + C_{L_{\alpha}} \alpha + C_{L_q} \frac{\bar{c}}{2V} q + C_{L_{\delta_e}} \delta_e. \quad (13)$$

The aerodynamic moment and its coefficient are

$$\mathcal{M} = \frac{1}{2}\rho V^2 \mathcal{S}\bar{c}C_{\mathcal{M}} + T\Delta z, \tag{14}$$

where [14]

$$C_{\mathcal{M}} = C_{\mathcal{M}_{\alpha}} \alpha + C_{\mathcal{M}_{\delta_e}} \delta_e + C_{\mathcal{M}_q} \frac{\bar{c}}{2V} q . \tag{15}$$

Note that the effect of thrust on pitching moment is taken into account. In the mathematical model the control variables are: thrust setting,  $\xi_t$ ; and elevator deflection,  $\delta_e$ . They are constrained by

$$0 < \xi_t \le 1 , -20^o \le \delta_e \le 20^o .$$
 (16)

The 1-g stall speed of a large airliner jet with weight of 564,000 lbs and 30° flap setting (gear down) is 61 m/s [15]. If airspeed drops to the stall speed while angle-of-attack,  $\alpha$ , is greater than  $\alpha_{\rm max}$  (which is 17.2° [3]), the aircraft is assumed to stall.

The microburst model [4] used herein is axisymmetric, three-dimensional, and stationary. The induced radial and vertical deterministic wind velocities at any point in three-dimensional space can be computed through the following relations

$$W_r^d = f_r \cdot \left(\frac{100}{\left[(r - D/2)/200\right]^2 + 10} - \frac{100}{\left[(r + D/2)/200200\right]^2 + 10}\right), \quad (17)$$

$$W_h^d = -f_h \cdot \left(\frac{0.4h}{(r/400)^4 + 10}\right),$$
 (18)

where

$$r = \sqrt{(x - x_c)^2 + y_c^2}. (19)$$

Using polar coordinates, the horizontal deterministic wind component,  $W_x^d$ , can be readily related to the radial wind component,  $W_x^d$ :

$$W_x^d = \cos \psi_w W_r^d(r) \,. \tag{20}$$

Stochastic turbulence is superimposed on the deterministic wind components of Eqs. (18) and (20). Thus,

$$W_h = W_h^d + d_h, \quad W_x = W_x^d + d_x.$$
 (21)

The turbulence components in inertial frame are related to those in body frame by a rotation matrix as follows:

$$d_x = \cos\theta \ u_q + \sin\theta \ w_q \ , \tag{22}$$

$$d_h = \sin\theta \ u_a - \cos\theta \ w_a \ . \tag{23}$$

Turbulence is modeled using the Dryden Power Spectral Density (PSD) functions. State variable models for  $u_g$  and  $w_g$ , respectively, are [16]

$$\dot{u}_{g} = -\lambda_{u}u_{g} + \sqrt{K_{u}} \eta_{1} , \qquad (24)$$

$$\begin{bmatrix} \dot{x}_{1} \\ \dot{x}_{2} \end{bmatrix} = \begin{bmatrix} 0 & 1 \\ -\lambda_{w}^{2} & -2\lambda_{w} \end{bmatrix} \begin{bmatrix} x_{1} \\ x_{2} \end{bmatrix} + \begin{bmatrix} 0 \\ 1 \end{bmatrix} \eta_{2} ,$$

$$w_{g} = \sqrt{K_{w}} [\beta_{w} \quad 1] \begin{bmatrix} x_{1} \\ x_{2} \end{bmatrix} ,$$

$$(25)$$

where  $\eta_1$  and  $\eta_2$  are signals from independent white noise sources. The intensity of the w-component of turbulence in body-fixed frame  $(\sigma_{w_g})$  is chosen to be 4, which corresponds to severe storm. The intensities of the other components are computed using the assumption that the intensities of the three translational components of turbulence are isotropic. All the coefficients in Eqs. (24), (25) depend on altitude through so-called turbulence scale lengths [16]:

$$L_{w_g} = h, \quad L_{u_g} = 145 \ h^{\frac{1}{3}}.$$
 (26)

In this microburst model with turbulence, we assume that turbulence and microburst windshear can be modeled independently. Experimental evidence suggests that turbulence length scales increase through a microburst and, in some unknown manner, depend on microburst size and strength [17]. Such a functional dependence between turbulence and microburst parameters will result in a nonstationary and non-Gaussian wind process description [9]. This functional dependence is neglected in this study.

#### 3 Deterministic Analysis

## 3.1 Construction of a Safety Metric

Upon encountering a microburst, in the absence of turbulence, descending to a lower altitude may result in safer recovery because of two separate reasons: (i) the special structure of the wind field in a microburst and (ii) trading altitude for airspeed.

The first mechanism can be understood as follows. In a microburst, the air moves downward, causing a downdraft and, near the ground, spreads outward, resulting in horizontal windshear. The velocity of downdraft decreases with altitude due to the stagnation level on the ground. Thus, flying at a lower altitude through the microburst will expose the aircraft to downdraft of smaller magnitude.

As the second mechanism, once the escape maneuver is initiated, altitude is traded for airspeed and the aircraft flies with high airspeed through the core of the microburst, where the downdraft is most severe. The benefit of this mechanism can be understood by considering

the effect of the microburst on aerodynamic lift, which can be reduced by windshear in two ways. First, a wind speed change along the flight path will produce a direct initial effect on lift in proportion to the change in airspeed. Second, a vertical windshear will change lift by changing the angle of attack directly without affecting airspeed initially. A windshear that acts to reduce airspeed or angle of attack will reduce aerodynamic lift and result in a deteriorating flight path [2]. Thus, if an aircraft enters a microburst with higher airspeed gained by trading off altitude, the airspeed fluctuation due to windshear will be smaller relative to the original airspeed. Additionally, angle of attack changes due to the vertical windshear will be smaller than when flying with low airspeed. Therefore, aerodynamic lift reduction due to the windshear and downdraft will be relatively small in the case of higher airspeed.

Now, we will define a safety metric that quantifies the aircraft maximum capability of generating an upward force, and compare different escape trajectories using this safety metric. The safety metric presumes the following quasi-static scenario in the absence of turbulence: The aircraft is flying horizontally in the microburst, i.e. the instantaneous absolute velocity of the aircraft is horizontal, and the flight is longitudinal. Under these conditions we compute the maximum force that would be available to initiate a climb.

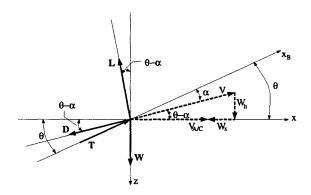


Figure 1: Velocities and forces in inertially horizontal longitudinal flight

Note that  $W_h = W_h^d$  and  $W_x = W_x^d$  due to the assumption, in this section, that there is no turbulence. As can be seen from Fig.1, the sum of the vertical forces, except the weight of the aircraft, with the positive direction being upward, is

$$F_v = L\cos(\theta - \alpha) - D\sin(\theta - \alpha) + T\sin\theta. \tag{27}$$

Since maximum thrust is used in microburst escape maneuvers, the only way to change the vertical force is to change the pitch angle,  $\theta$ . So, we define the safety metric

as the ratio of the maximum available  $F_v$  to the weight, W:

$$S_f = \frac{\max_{\theta} (F_v)}{W}.$$
 (28)

To evaluate  $\max_{\theta} (F_v)$  we need to write  $F_v$  as a function of  $\theta$ . Using the assumptions that the flight is longitudinal and the inertial velocity of the aircraft,  $V_{A/C}$  is horizontal, i.e.  $\dot{x} = V_{A/C}$  and  $\dot{z} = 0$ , Eqs. (3) and (4) yield

$$\cos(\theta - \alpha) = \frac{V_{A/C} - W_x}{V}, \tag{29}$$

$$\sin(\theta - \alpha) = \frac{W_h}{V}. \tag{30}$$

Substituting L from (11) and (13), D from (10) and (12) into Eq.(27) and recalling that the maximum thrust is used, Eq.(27) becomes

$$F_{v} = \frac{1}{2}\rho V^{2} \mathcal{S} \left\{ \left[ C_{L_{0}} + C_{L_{\alpha}} \alpha + C_{L_{\delta_{e}}} \delta_{e} \right] \left( \frac{V_{A/C} - W_{x}}{V} \right) - \left[ C_{D_{0}} + C_{D_{\alpha}} \alpha \right] \frac{W_{h}}{V} \right\} + \left( T_{0} + T_{1}V + T_{2}V^{2} \right) \sin \theta. \tag{31}$$

Note that since the analysis here is quasi-static, the velocity terms, e.g. in  $C_L$  in Eq.(13) is neglected. The assumptions of quasi-static analysis and longitudinal flight, together with Eq.(5) imply that

$$\mathcal{M} = 0. \tag{32}$$

Hence

$$\delta_e = -\frac{1}{C_{\mathcal{M}_{\delta_e}}} \left[ C_{\mathcal{M}_{\alpha}} \alpha + \frac{2 \left( T_0 + T_1 V + T_2 V^2 \right) \Delta z}{\rho S \bar{c} V^2} \right]. \tag{33}$$

From Eq.(30), the angle-of-attack for a given pitch angle, in the case of horizontal flight, is

$$\alpha = \theta - \arcsin\left(\frac{W_h}{V}\right). \tag{34}$$

Thus, Eq.(31) along with Eqs.(33) and (34) give  $F_v$  as a function of  $\theta$ . Now, the problem of maximizing  $F_v(\theta)$  can be solved. It can numerically be shown that both  $F_v(\theta)$  and  $\alpha(\theta)$  are increasing functions of  $\theta$ . Thus, recalling that the angle-of-attack has a maximum bound, we obtain

$$\max_{\theta} \left( F_v \right) = F_v \left( \theta^* \right), \tag{35}$$

such that

$$\alpha \left( \theta^{*} \right) = \alpha_{\max}. \tag{36}$$

Therefore, the safety factor,  $S_f$  is

$$S_{f} = \frac{\rho V^{2} S}{2W} \left[ \left( C_{L_{0}} + C_{L_{\alpha}} \alpha_{\max} + C_{L_{\delta_{e}}} \delta_{e}^{*} \right) \frac{V_{A/C} - W_{x}}{V} - \left( C_{D_{\alpha}} + C_{D_{\alpha}} \alpha_{\max} \right) \frac{W_{h}}{V} \right] + \frac{\left( T_{0} + T_{1}V + T_{2}V^{2} \right)}{W} \sin \theta^{*}$$
(37)

where

$$\theta^* = \alpha_{\text{max}} + \arcsin\left(\frac{W_h}{V}\right),$$
 (38)

$$\delta_e^* = -\frac{C_{\mathcal{M}_{\alpha}}\alpha_{\max} + \frac{2(T_0 + T_1V + T_2V^2)\Delta z}{\rho S\bar{c}V^2}}{C_{\mathcal{M}_{\delta_e}}}.$$
 (39)

The safety factor  $S_f$  is constructed to determine whether an aircraft, initially flying horizontally, has any climb capability. Roughly speaking if  $S_f > 1$ , then the aircraft has enough vertical force capability to climb, but if  $S_f < 1$ , the aircraft does not have enough vertical force to maintain its altitude.

## 3.2 Safety of Low Altitude Flight

Now, for a given specific inertial energy, we will write  $S_f$  as a function of altitude and analyze how it changes with altitude. The specific inertial energy is defined as:

$$E_i = \frac{1}{2}V_{A/C}^2 + gh. (40)$$

For a given inertial energy, we can write the inertial aircraft speed as a function of altitude:

$$V_{A/C} = \sqrt{2(E_i - gh)}. (41)$$

Since  $\vec{V}_{A/C} = \vec{W}_w + \vec{V}$ , from Fig.1, we obtain

$$V = \sqrt{(V_{A/C} - W_x)^2 + W_h^2}.$$
 (42)

Thus, airspeed V is also written as a function of position since  $W_h$  is a function of x and h, and  $W_x$  is a function of x. Hence, substituting  $V_{A/C}(h)$ , V(x,h),  $W_x(x)$ , and  $W_h(x,h)$  into Eqs.(37), (38), and (39),  $S_f$  becomes a function of position, (x,h).

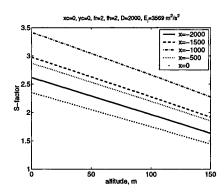


Figure 2:  $S_f$  as a function of altitude, plotted for various horizontal positions, in the case of headwind

In Figs.2 and 3,  $S_f$  is plotted as a function of altitude at various horizontal positions, for the headwind and tailwind cases, respectively. Both figures show that  $S_f$  is a decreasing function of altitude for the particular airplane

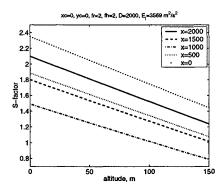


Figure 3:  $S_f$  as a function of altitude, plotted for various horizontal positions, in the case of tailwind

and microburst considered. A formal proof of the generality of this statement is in Ref.[1]. Figure 2 shows that for a given altitude, headwind is performance-increasing. The upper curve corresponds to the position with maximum headwind. The lower curve corresponds to the center of the microburst, where there is theoretically no horizontal wind. On the other hand, Fig.3 shows that for a given altitude, the tailwind region is where the aircraft is in real danger and the most dangerous position is where the tailwind magnitude reaches its peak.

## 4 Probabilistic Analysis

## 4.1 Construction of a Probabilistic Safety Factor In the previous section, we have shown that in the absence of turbulence, the safety factor is a decreasing function of altitude. This implies that the lower the aircraft flies the safer the escape maneuver will be in terms of vertical force capability. In this section, we will investigate the safety of low altitude flight in the presence of turbulence through the safety factor, $S_f$ . In the previous section, $S_f$ was a deterministic function since turbulence was not taken into account. However, in this section, we will reconstruct $S_f$ as a random variable to study the

effect of turbulence on the safety of low altitude flight.

Equations (37)-(39) imply that  $S_f$  is a function of the wind components,  $W_x$  and  $W_h$ . Also note from Eq. (21) that, in the presence of turbulence, the wind components are random processes due to the turbulence components, given in Eqs. (24) and (25). However, recall that  $S_f$  has been constructed under the assumption of a quasi-static analysis. Consistent with this assumption, we replace the stationary random processes  $u_g(t)$ ,  $w_g(t)$  of Eqs. (24), (25) by random variables  $u_g$ ,  $w_g$  with same mean and variance. Specifically we have

$$E[u_g] = 0, (43)$$

$$E[w_g] = 0, (44)$$

$$var(u_g) = \frac{145 \sigma^2 \sigma_{w_g}^2}{\pi} \frac{1}{h^{2/3}}, \qquad (45)$$

$$\operatorname{var}(w_g) = \frac{\sigma^2}{\pi} \sigma_w^2 . \tag{46}$$

Additionally, Ref. [13] showed that the pitch angle of the aircraft in a microburst encounter is not directly affected by turbulence. Thus, unlike Eq. (38), we assume, for simplicity, that the pitch angle is only function of deterministic components of wind, i.e.

$$\theta^* = \alpha_{\text{max}} + \arcsin\left(\frac{W_h^d}{V^d}\right) , \qquad (47)$$

where, from Eq. (42)

$$V^{d} = \sqrt{(V_{A/C} - W_{x}^{d})^{2} + (W_{h}^{d})^{2}}.$$
 (48)

Hence we have constructed the safety factor as a random variable:  $S_f$  is given in Eq. (37) as a function of  $V, \delta_e^*, V_{A/C}, W_x, W_h, \text{ and } \theta^*. V \text{ is given in Eq. (42)};$  $\delta_e^*$  in Eq. (39);  $V_{A/C}$  in (41);  $W_x$  and  $W_h$  in (21); and  $\theta^*$ in (47).

## 4.2 Statistical Properties of the Safety Factor

The safety factor  $S_f$  is now treated as a random variable because it is a function of two Gaussian random variables,  $u_g$  and  $w_g$ . Specifically, for given microburst parameters, inertial specific energy, and spatial position, we have

$$S_f = S_f(u_q, w_q) . (49)$$

Thus, a logical next step is to find the probability density function (pdf) of  $S_f$  in terms of the pdf's of  $u_g$  and  $w_g$ . Unfortunately, the function,  $S_f(u_g, w_g)$ , is nonlinear and it would be difficult to analytically determine its exact pdf. Instead, we will find an analytical approximation as follows.

The Taylor series expansion of  $S_{f}\left(u_{g},w_{g}\right)$  has linear terms and higher order terms. Since the turbulent components of wind are high-frequency fluctuations and small relative to the deterministic components,  $u_q$  and  $w_g$  are assumed to be small. Hence, in the Taylor series expansion, the higher order terms are neglected. With this linear approximation,  $S_f$  is also a Gaussian random variable with [19]

$$E[S_f] = S_f(0,0) , (50)$$

$$E[S_f] = S_f(0,0) , \qquad (50)$$

$$\operatorname{var}(S_f) = \frac{\partial S_f}{\partial u_g} \Big|_{(0,0)}^2 \operatorname{var}(u_g) + \frac{\partial S_f}{\partial w_g} \Big|_{(0,0)}^2 \operatorname{var}(w_g) (51)$$

where  $S_f(0,0)$  is the safety factor in the absence of turbulence in Eq. (37) and was shown to be a function of altitude for given specific inertial energy and horizontal position. It can be shown that  $var(S_f)$  is also a function

of altitude for given specific inertial energy and horizontal position.

To see how accurate the linear approximation of  $S_f$  is, we compare the mean (50) and variance (51) of the linear approximation with the minimum variance unbiased estimates [19] of the mean and variance of  $S_f$  in Eq. (49) under the assumption that  $S_f$  is a Gaussian random variable. Figure 4 shows that the linear approximation almost exactly matches the estimates for the whole altitude range of interest. For different microburst cases a similar consistency was obtained but not shown here. Therefore, in the remainder of the paper, we will use the linear approximation instead of the fully nonlinear  $S_f$ .

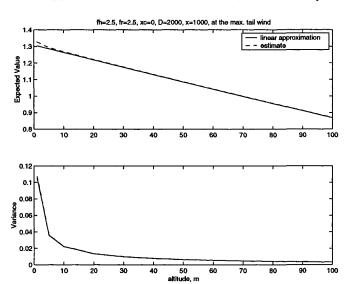


Figure 4: Mean and variance of the linear approximation and estimate of  $S_f$  in a microburst for various altitudes at the horizontal location where tail wind is maximum

Since  $S_f$  can be approximated as a Gaussian random variable with known mean (50) and variance (51), its PDF is known. Thus, the probability of  $S_f$  being less than or equal to a given value,  $p_{S_f}$ , is

$$P\left[S_f \le p_{S_f}\right] = \frac{1}{2} \left[ 1 + \operatorname{erf}\left(\frac{p_{S_f} - E\left[S_f\right]}{\sqrt{2\operatorname{var}\left(S_f\right)}}\right) \right] , \quad (52)$$

where  $erf(\cdot)$  is the so-called "error function" [19],

$$\operatorname{erf}(x) = \frac{2}{\sqrt{\pi}} \int_0^x e^{-t^2} dt$$
 (53)

Recall that  $E\left[S_f\right]$  and  $\text{var}(S_f)$  are functions of altitude. Thus,  $P\left[S_f \leq p_{S_f}\right]$  is also a function of altitude for given specific inertial energy and horizontal position in a microburst.

Figure 5 shows  $P\left[S_f \leq p_{S_f}\right]$  as a function of altitude for various horizontal positions in a microburst. The figure

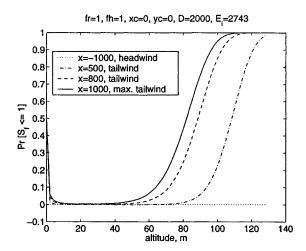


Figure 5: Probability of  $S_f$  being less than 1 versus altitude for various horizontal positions

suggests that the most dangerous horizontal position in a microburst is where the mean of the tailwind reaches its peak. This is because the probability of  $S_f$  being less than 1 is higher at this position than at any other position for any altitude. Recall that in Subsection 3.2, the deterministic analysis of  $S_f$  in the absence of turbulence yielded the same conclusion. Thus, in the remainder of the paper, by  $P\left[S_f \leq p_{S_f}\right]$  we will mean the probability of  $S_f$  being less than  $p_{S_f}$  at the horizontal location where the tailwind is maximum, unless otherwise stated.

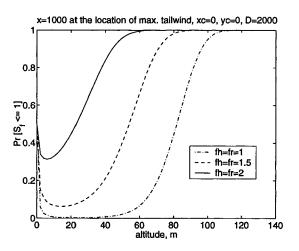


Figure 6: Probability of  $S_f$  being less than 1 versus altitude for various microburst cases

Figure 6 shows the effect of microburst strength parameters on the probability of  $S_f$  being less than 1. As the microburst becomes stronger, the flight at any altitude becomes less safe in the sense that the probability of  $S_f$  being less than 1 increases.

Both Figs. 5 and 6 show the superiority of the statistical

analysis over the deterministic analysis. While the deterministic analysis showed the advantage of descending in a microburst encounter, it completely failed to show that descending too low may increase the risk of failing to have enough vertical force capability to maintain the altitude. However, Figs. 5 and 6 clearly show that flying lower increases safety up to an optimal altitude, and that flying lower than this optimal value dramatically decreases the safety. This is because  $S_f$  being less than 1 means that the aircraft does not have enough vertical force capability to maintain its altitude. Thus, we have analytically corroborated the results of the Monte Carlo simulation in [13]: the probability of crash decreases as the commanded altitude decreases as long as the commanded altitude is higher than an optimal value.

## 5 Highest Safe Altitude in a Microburst Escape

In a microburst escape maneuver, it has been shown that descending may improve safety. We have, in our previous work [13], shown that the probability of crash is minimized if the aircraft descends to an optimal altitude in any microburst encounter. However, in the case of less severe microbursts, it is possible to safely recover with commanded altitudes that are higher than the optimal commanded altitude. On the other hand, flying too high has been shown [13] to be dangerous as well. Thus, it is important to determine the highest safe altitude, which depends on the microburst strength and aircraft energy capacity. Thus, the goal of this section is to develop an algorithm that, using the information on microburst and aircraft state variables, gives the highest safe altitude in a microburst encounter.

## 5.1 Determining a Highest Safe Altitude

The safety factor, developed in the previous sections, can show whether the aircraft has enough vertical force capacity to maintain flight at a given altitude. In the probabilistic analysis, it also took into account the effect of turbulence on the escape performance. In the deterministic approach, the safety factor can be written explicitly as a function of altitude. In the probabilistic approach, its probability of being less than a given value can also be formulated as a function of altitude. Having these facts in mind, in the section, we develop techniques to determine how high an aircraft can fly in a microburst encounter.

Figure 7 shows the general profile of  $P\left[S_f \leq p_{S_f}\right]$  as a function of altitude. As seen in the figure,  $h^*$  denotes the altitude that minimizes the probability that  $S_f$  is less that  $p_{S_f}$ , and  $\bar{h}$  denotes the maximum altitude of which  $P\left[S_f \leq p_{S_f}\right]$  is less than the sum of the minimum probability of  $S_f$  being less than  $p_{S_f}$  and an increment,  $\Delta_p$ . Using  $h^*$  as the recovery altitude will guarantee that the

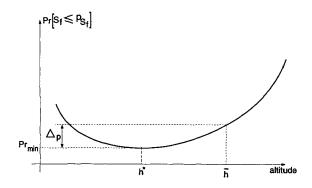


Figure 7: Graphical definition of  $h^*$  and  $\bar{h}$ 

aircraft, in a microburst escape maneuver, flies with the minimum probability of failing to have enough vertical force capability to maintain its altitude, with a safety margin depending on the value of  $p_{S_f}$ . However, note that there will always be a positive probability of failing to have enough capability to maintain the altitude, unless  $Pr_{\min}$  is zero. Flying at  $\bar{h}$  means that the probability of  $S_f$  being less than  $p_{S_f}$  will always be smaller than  $Pr_{\min} + \Delta_p$ .

The probability  $P\left[S_f \leq p_{S_f}\right]$  is given in Eq. (52), and its dependence on altitude can be made explicit through Eqs. (37), (50), (51). These equations are then solved for  $h^*$  and  $\bar{h}$ .

# 5.2 Microburst Escape Guidance Using the Safety Factor

Reference [13] compares three different escape strategies. pitch-guidance, altitude-guidance and dive-guidance, in As the aircraft, guided by the following scenario. the landing controller, is descending, the F-factor [13] is monitored using data obtained from a reactive or forward-looking detection system. Once the F-factor exceeds the threshold value [13], the landing is aborted and an escape maneuver is immediately initiated. The sensitivity of the performances of the escape strategies with respect to variations in microburst size, strength and location, in the presence of turbulence, is analyzed using the Monte Carlo Method. The only data is assumed to be the statistical distribution of the microburst parameters and the comparison between different strategies is based on scalar performance measures: the probability of descending lower than a given altitude, and the probability of crash. The probability of descending lower than a given altitude is obtained from the PDF of the minimum altitude reached in a microburst encounter. The probability of crash is the probability that the aircraft either runs into stall or has a ground contact during an escape maneuver. In the Monte Carlo Simulation, stall and ground contact are deemed equally dangerous and we assume that stall results in ground contact. Thus, the probability of crash is the PDF of minimum altitude evaluated at zero altitude.

The escape strategies analyzed in [13] are:

- (i) pitch-guidance [13]: a 15° target pitch angle is commanded and maintained throughout the microburst. This strategy is recommended in the Windshear Training Aid [2] by the FAA.
- (ii): Dive-guidance [13]: a  $0^{o}$  target pitch angle is commanded until the altitude drops to the commanded altitude,  $h_{c}$ . Once the altitude becomes lower than  $h_{c}$ , a  $15^{o}$  pitch angle is commanded for the remainder of the escape maneuver.
- (iii): Altitude-guidance (h-guidance) [13]: This guidance strategy flies the aircraft at a constant recovery altitude in the high shear region of the microburst. It has two consecutive modes. In the altitude-guidance mode, it directs the aircraft to a given commanded altitude and keeps it there. Then, in the climbing mode, it commands a 15° pitch angle to move the aircraft up from its recovery altitude.

The Monte Carlo simulation in [13] shows that, with respect to the probability of crash, altitude- and diveguidance may be better than pitch-guidance, and that the probability of crash is minimum if the commanded altitude is chosen at an optimal value in both altitude- and dive-guidance. However, as stated before, the aircraft may recover with higher commanded altitude than the optimal value in a less severe microburst.

If the altitude  $h^*$  or  $\bar{h}$  is chosen as the commanded altitude in altitude- or dive-guidance, the commanded altitude will increase as the strength of the microburst decreases, as seen in Fig. 6. Thus, we define the following modified altitude- and dive-guidance strategies:

- (iv): Dive-guidance with  $h^*$  (Sf-guidance-dive-star): Dive-guidance with commanded altitude computed using  $h^*$  for each microburst encountered.
- (v) : Altitude-guidance with  $h^*$  (Sf-guidance-star) : Altitude-guidance whose commanded altitude is computed using  $h^*$  for each microburst encountered.

In (iv) and (v), the commanded altitude is

$$h_c = \begin{cases} h^* & \text{, when } h^* > 25\\ 25 & \text{, otherwise} \end{cases}$$
 (54)

The safety margin,  $p_{S_f}$ , in  $h^*$  computation is 1. Since Ref. [13] suggests that descending lower than 25 m increases the probability of crash, even when we obtain  $h^*$  less than 25 m, the aircraft is not directed lower than 25 m.

- (vi) : Dive-guidance with  $\bar{h}$  (Sf-guidance-dive-bar) : Dive-guidance with commanded altitude computed using  $\bar{h}$  for each microburst encountered.
- (vii) : Altitude-guidance with  $\bar{h}$  (Sf-guidance-bar) :

Altitude-guidance with commanded altitude computed using  $\bar{h}$  for each microburst encountered.

In (vi) and (vii), the commanded altitude is

$$h_c = \begin{cases} \bar{h} & \text{, when } \bar{h} > 25\\ 25 & \text{, otherwise} \end{cases}$$
 (55)

The lower limit on the commanded altitude is imposed for the same reason as for  $h^*$  in (54). In  $\bar{h}$  computation,  $\Delta_p$  is chosen as 0.01 and  $p_{S_f}$  is

$$p_{S_f} = \begin{cases} 1.1 + \frac{\Delta_f}{10} &, \text{ when } \Delta_f > 0\\ 1.1 &, \text{ otherwise} \end{cases}$$
 (56)

where

$$\Delta_f = f_h - f_r \tag{57}$$

Simulation experiments has shown that increasing  $p_{S_f}$ , the safety margin, when  $f_h$  is greater than  $f_r$ , improves the escape performance in the sense that the probability of having minimum altitude less than a given value is decreased without increasing the probability of crash.

The controllers [13], used for the strategies (i)-(iii), are also used for the modified strategies (iv)-(vii). As in [13], the performances of the escape strategies are compared using Monte Carlo simulations that produce estimates of the PDF of the minimum altitude and the probability of crash in a microburst whose statistical properties are known. The problem formulation for the Monte Carlo simulation and the statistical properties of the microburst parameters can be found in [13]. Although the equations, (1)-(7), for the longitudinal aircraft motion are used in the derivation of  $S_f$ , a full 6-DOF aircraft model, given in [13], is used in the Monte Carlo simulation so as to make a fair comparison between the strategies (i)-(iii), with a constant  $h_c$  for every microburst encountered, and their modified versions, (iv)-(vii), which utilize the safety factor to determine the commanded altitude for each microburst encountered.

The scenario for the modified escape strategies is as follows: As the aircraft is approaching on the glide path, the wind velocity components are measured using reactive and/or forward-looking sensors. With these measurements and the microburst model with unknown parameters, the microburst parameters are computed. Then, using the microburst model with the estimated parameters, the deterministic wind components at the position where the tail wind would reach its maximum are computed. Simultaneously, altitude and aircraft inertial speed  $(\sqrt{\dot{x}^2 + \dot{y}^2 + \dot{z}^2})$  are measured and the specific inertial energy of the aircraft is computed. Using the measurement of wind, a sample of vertical wind component is obtained. With this sample, the variance is estimated. Then, using the methods developed in the previous subsection,  $h^*$  or  $\bar{h}$  is computed. The above estimation should be continuously performed on-line and

 $h^*$  or  $\bar{h}$  should be updated as the aircraft is approaching on the glide path. When the F-factor exceeds the threshold, the last update of  $h^*$  or  $\bar{h}$  is used to decide the commanded altitude in altitude- or dive-guidance.

In any practical application of this procedure, the underlying assumptions should be borne in mind:

- The microburst encountered has a wind distribution similar to that of the microburst model used here.
- The accompanying turbulence has statistical properties similar to those of the turbulence model used.
- The aircraft model and data are accurate enough.
- The wind velocity components are measured on-board.
- The variance of the vertical component of turbulence is estimated on-board.
- Aircraft altitude and inertial speed are measured.

## 5.3 Monte Carlo Simulation Results

As stated above, the goal of the modified escape strategies is to avoid descending lower than necessary, but to fly at the highest safe altitude in a microburst encounter. Comparison of the PDFs of  $h_{\rm min}$  for various escape strategies can reveal whether the goal has been achieved. Of course such comparisons are conclusive only when the associated confidence intervals are disjoint. We have performed such conclusive comparisons, but for the sake of clarity, we will only show confidence intervals at altitudes that are multiples of  $20\ m$ .

Figure 8 shows the PDF of  $h_{\min}$  of pitch-guidance, hguidance with 25 m commanded altitude, and the modified altitude guidance strategies, together with 95% confidence intervals at h = 40m. Pitch guidance is used as the baseline strategy since it is recommended by the FAA [2]. Since Ref. [13] shows that altitude-guidance with 25 m commanded altitude yields the minimum probability of crash, the modified strategies are compared with altitude-guidance with  $h_c$  of 25 m. Regarding the probability of crash, both Sf-guidance-star and Sf-guidancebar are as good as h-guidance with  $h_c$  of 25 m since the PDFs at zero altitude are almost the same. It is also obvious that all the three are much better than pitchguidance. Regarding the probability of minimum altitude being less than a given value, among the three, Sfguidance-bar is the best because its PDF is either about the same as, or smaller than, those of the other two for any given altitude. For example, at h = 40 m, the PDF of  $h_{\min}$  of h-guidance is 1, that of Sf-guidance-star is 0.8, and that of Sf-guidance-bar is about 0.55. In other words, with Sf-guidance-bar, it is much less likely to have minimum altitude less than 40 m. Moreover, the probability of crash of Sf-guidance-bar is about the same as those of h-guidance and Sf-guidance-star.

Another interpretation of the PDFs is as follows: The aircraft with h-guidance has descended lower than 40 m in all cases; with Sf-guidance-star, 80 times out of

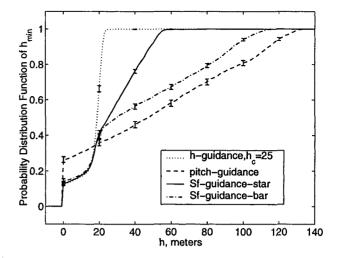


Figure 8: Probability distribution function (PDF) of  $h_{\min}$ , i.e. Pr  $(h_{\min} \leq h)$  of pitch-, altitude- and modified-altitude-guidance

100 microburst encounter; and with Sf-guidance-bar, just 55 times. Also note that, with all the three, the aircraft has crashed or run into stall about 15 times. Thus, we can conclude that, with h-guidance, the aircraft has unnecessarily descended lower than 40 m 45 times (100-55=45); with Sf-guidance-star, 25 times (80-55=25). We say "unnecessarily descended" because descending did not decrease the probability of crash. Thus, Sf-guidance-bar has better escape performance than that of both h-guidance and Sf-guidance-star.

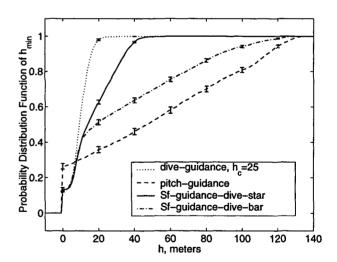


Figure 9: Probability distribution function (PDF) of  $h_{\min}$ , i.e.  $\Pr(h_{\min} \leq h)$  of pitch-, dive- and modified-dive-guidance

Now, we compare the PDF of Sf-guidance-bar with that of pitch-guidance at 40 m. The PDF of pitch-guidance

at 40 m is 0.45. Hence, the aircraft with pitch-guidance has descended lower than 40 m only 45 times out of 100 microburst encounters. But in these 45 times the aircraft has crashed about 30 times. On the other hand, in 55 times when the aircraft with Sf-guidance-bar has descended lower than 40 m, ground contact or stall has occurred only 15 times. Thus, with pitch-guidance, if the altitude dropped lower than 40 m, the aircraft safely recovered only 15 times (45 – 30), but with Sf-guidance-bar, 40 times (55-15).

Similar arguments can be carried out for different altitudes. Hence, Fig. 8 clearly shows that using  $h^*$  or  $\bar{h}$  has improved the performance of altitude-guidance, and that the best performance can be obtained with  $\bar{h}$  in terms of both probability of crash and probability of minimum altitude being less than a given value.

From Fig. 9, the same analysis can be carried out for Sf-guidance-dive-star and Sf-guidance-dive-bar. It appears that Sf-guidance-dive-bar, that is, dive-guidance with  $\bar{h}$ , gives the best performance among the strategies compared in Fig. 9. When we compare Sf-guidance-bar and Sf-guidance-dive-bar, we can see that Sf-guidance-bar has better performance than that of Sf-guidance-dive-bar. Thus, among all the escape strategies studied within the assumptions of this paper, Sf-guidance-bar appears to be the best when we consider both probability of crash and probability of minimum altitude being less than a given value.

## 6 Conclusions

We have defined a safety metric,  $S_f$ , that quantifies the aircraft maximum capability of generating an upward force during a microburst encounter. This was done under quasi-static assumptions of longitudinal horizontal flight. In the absence of turbulence, the safety metric has been shown to be a decreasing function of altitude. In the presence of stochastic turbulence, the Safety Factor has been treated as a random variable and its PDF was analytically approximated as a function of altitude. This allowed us to determine the highest safe altitude that is, the highest altitude where the aircraft can fly with minimum or prespecified probability of danger. Then, altitude-guidance and dive-guidance escape strategies, analyzed in [13], were modified by using this highest safe altitude as commanded altitude. Finally, Monte Carlo simulations were conducted to estimate the probability distribution function of minimum altitude reached in a microburst encounter. Using this probability density functions, various escape strategies were comparatively analyzed. In the Monte Carlo simulation, a 6-DOF aircraft model given in [13] was used.

The deterministic analysis of the Safety Factor has shown

that descending to a low altitude in a microburst encounter may improve safety in the sense that the aircraft will have more vertical force capability to maintain its altitude or to climb if necessary. The fact that the lower the recovery altitude the higher the vertical force capability in the absence of turbulence suggests that low altitude flight is more robust in the sense that it is more likely to maintain the altitude despite changes in wind direction and magnitude. Although this conclusion is the same as in Refs. [4, 10], the analytical method used in this paper allows us to prove that the safety factor is a decreasing function of altitude.

The Probabilistic Analysis Section is used to see whether the conclusion drawn in the Deterministic Analysis Section is valid in the presence of stochastic turbulence. In this section, the Safety Factor is treated as a random variable because it is a function of random variables due to the presence of turbulence. Then, the PDF of the Safety Factor is analytically approximated as a function of altitude. While the Deterministic Analysis Section shows the advantage of descending in a microburst encounter, it completely fails to show that descending too low may increase the risk of failing to have enough vertical force capability to maintain the altitude. However, the probabilistic analysis shows that flying lower increases safety up to an optimal altitude, and that flying lower than this optimal value dramatically decreases safety. Thus, the probabilistic analysis has helped analytically corroborate the results of the Monte Carlo simulation in [13]: the probability of crash decreases as the commanded altitude decreases as long as the commanded altitude is higher than an optimal value.

The PDF of the Safety Factor, as a function of altitude, is used to find the highest safe altitude in a microburst encounter. Safe altitude, in the probabilistic sense, means that the probability of Safety Factor being less than a given value is minimum or less than prespecified value. In other words, using that safe altitude will guarantee that the aircraft flies with minimum or prespecified probability of failing to have enough vertical force capability to maintain altitude. The purpose of flying at the so-called highest safe altitude is to prevent the aircraft from descending unnecessarily to a fixed altitude in every microburst encounter, but to adjust the recovery altitude depending on the strength of the microburst encountered.

Monte Carlo simulations have shown this the purpose can be achieved: specifically, we can decrease the probability of minimum altitude being less than a given value without compromising the probability of crash. That is, in a microburst encounter, a pilot, given the highest safe altitude, can fly the aircraft at that altitude with minimum or prespecified probability that the aircraft cannot maintain that altitude. This paper provides an analyti-

cal method to compute such highest safe altitudes.

Monte Carlo simulations have also shown that modified altitude guidance, using the highest safe altitude as the commanded altitude, has better escape performance than both dive-guidance with the same procedure and pitch-guidance. Thus, the results of the paper suggests that, during the landing phase of a flight, the highest safe altitude be monitored, and upon an encounter with a microburst, the aircraft be directed to the last update of the highest safe altitude and kept there in the high shear region of the microburst.

Besides the conclusion drawn above, the analysis of the PDF of the minimum altitude provides a very simple and decisive criterion to make a comparison between different escape strategies, and shows clearly how to improve the performance of an escape strategy. For example, if the PDF of  $h_{\min}$  at an altitude for escape strategy A is smaller than that for escape strategy B for any altitude, then it can be directly concluded that strategy A has better escape performance than that of strategy B. Moreover, if we are to improve the performance of an escape strategy, the PDF analysis suggests that for a given altitude we should reduce the value of the PDF at that altitude without increasing the PDF at zero altitude. Thus, it appears that the PDF analysis is a very promising tool in microburst studies to develop better escape strategies.

Before practical implementation of this escape procedure, the sensitivity of the procedure with respect to the assumptions should be studied. If the highest safe altitude is very sensitive to the microburst model, the procedure should be modified with the most accurate model available or additional features should be added to the procedure so that the microburst model can be identified on-board. Similarly, the sensitivity with respect to the turbulence model should be investigated. Also algorithms to estimate wind velocity components and turbulent component of wind should be used. The effect of human factors on the performance of the escape procedure should be studied as well.

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