

Prediction of Top of Descent Location for Idle-thrust Descents

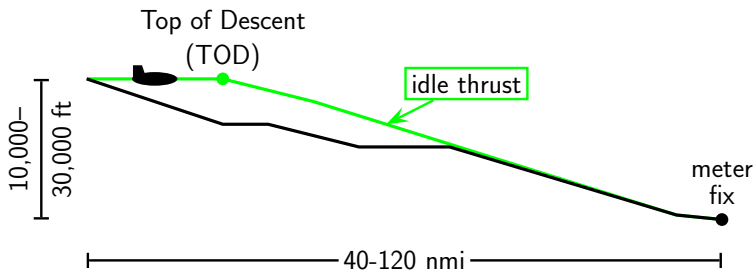
Laurel Stell

NASA Ames Research Center



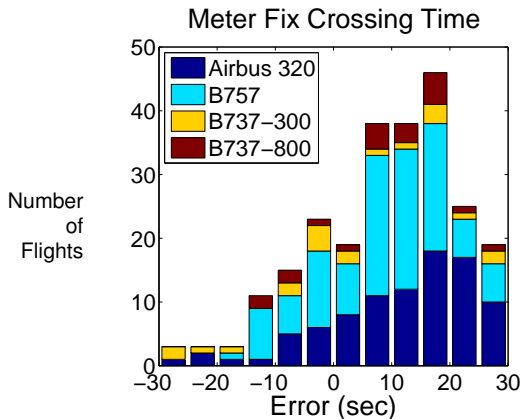
Background

Vertical profile from cruise to meter fix



Idle-thrust descent reduces fuel consumption and emissions.

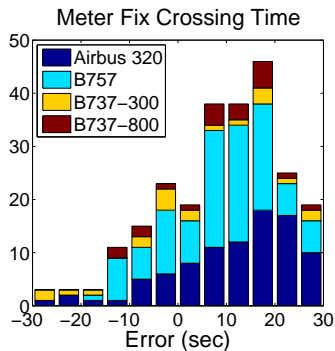
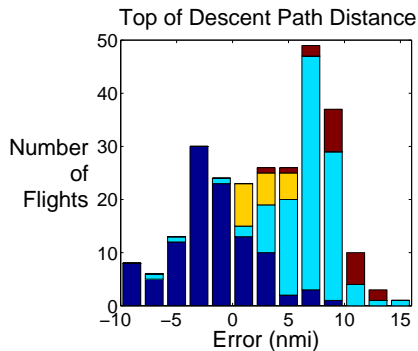
Example Meter Fix Time Errors for Operational Data



- More than 90% of the meter fix crossing time predictions have absolute error less than 30 sec.



Example Prediction Errors for Operational Data



- Less than 50% of the TOD location predictions have absolute error less than 5 nmi.



Outline of Presentation

- Mathematical analysis and approximation of TOD location based on NASA trajectory predictor
- Comparison of results with FMS test bench data and with operational data
- Possible applications



Mathematical Analysis



- For this mathematical analysis, wind is zero
- Incorporating wind into the results is explained in paper
- Analysis of operational data included wind



Kinematic Equations

$$\frac{ds}{dt} = V_t$$
$$\frac{dh}{dt} = \gamma_a V_t$$

t : time

s : the ground path distance relative to the meter fix

h : the altitude

V_t : the true airspeed

γ_a : is the flight path angle with respect to the air mass



Kinetic Equation

$$m \frac{dV_t}{dt} = T - D - mg \gamma_a$$

T : thrust

D : drag

m : aircraft mass

g : gravitational acceleration



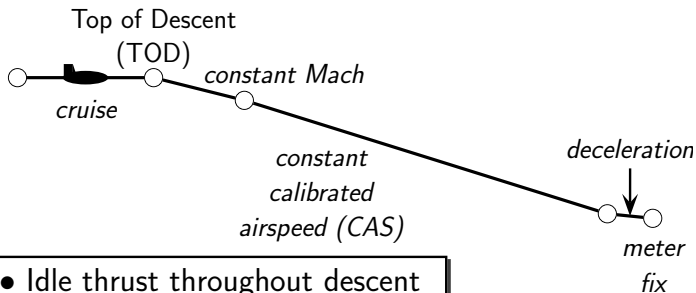
All Equations for Vertical Profile

$$\frac{1}{g} \frac{dV_t}{dt} = \frac{T - D}{mg} - \gamma_a$$
$$\frac{ds}{dt} = V_t$$
$$\frac{dh}{dt} = \gamma_a V_t$$

Specify 2 out of 3: flight path angle γ_a , airspeed V_t , thrust T



Descent Procedure



- Idle thrust throughout descent
- Known horizontal trajectory

Constant Mach and CAS Segments

$$\frac{1}{g} \frac{dV_t}{dt} = \frac{T - D}{mg} - \gamma_a$$

$$\frac{ds}{dt} = V_t$$

$$\frac{dh}{dt} = \gamma_a V_t$$

$V_t(h)$ specified:

$$\frac{ds}{dh} = \frac{1}{\gamma_a} = \left(1 + \frac{1}{2g} \frac{dV_t^2}{dh} \right) \frac{mg}{T - D}$$



Top of Descent Location

$$S_{\text{TOD}} = - \int_{h_{\text{crz}}}^{h_{\text{fix}}} \left(1 + \frac{1}{2g} \frac{dV_t^2}{dh} \right) \frac{mg}{T-D} dh$$
$$- \frac{1}{g} \int_{V_c}^{V_{\text{fix}}} V_t \frac{mg}{T-D} dV_t$$

S_{TOD} : TOD location as path distance relative to meter fix

h_{crz} : cruise altitude

h_{fix} : meter fix altitude

V_c : descent CAS

V_{fix} : meter fix CAS



$$S_{\text{TOD}} = - \int_{h_{\text{crz}}}^{h_{\text{fix}}} \left(1 + \frac{1}{2g} \frac{dV_t^2}{dh} \right) \frac{mg}{T - D} dh$$
$$- \frac{1}{g} \int_{V_c}^{V_{\text{fix}}} V_t \frac{mg}{T - D} dV_t$$

Goal

Polynomial approximation in terms of h_{crz} , V_c , h_{fix} , V_{fix} , $W = mg$



Analyzed trajectories from NASA predictor to develop the polynomial approximations

- Test matrix with 9000 entries varying
 - cruise altitude h_{crz}
 - cruise Mach
 - descent speed V_c
 - meter fix altitude h_{fix}
 - meter fix speed V_{fix}
 - aircraft weight W
- B737-700 and B777-200



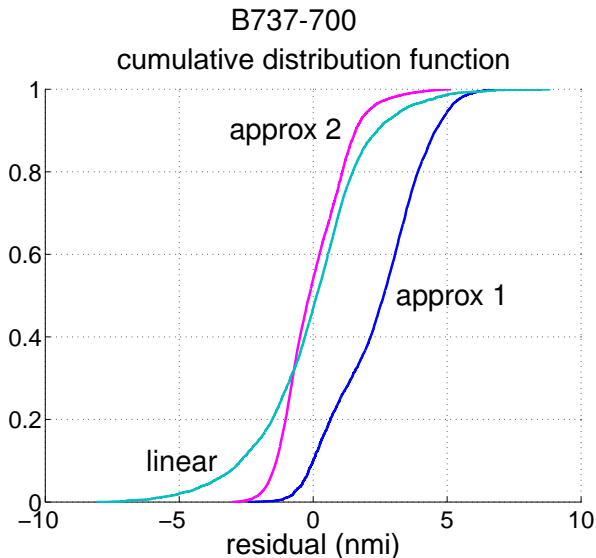
Approximation for Constant Mach and Constant CAS

$$\begin{aligned} & \int_{h_{\text{crz}}}^{h_{\text{fix}}} \left(1 + \frac{1}{2g} \frac{dV_t^2}{dh} \right) \frac{W}{T - D} dh \\ & \approx \mathcal{P}(V_c, W) \int_{h_{\text{crz}}}^{h_{\text{fix}}} \left(1 + \frac{1}{2g} \frac{dV_t^2}{dh} \right) dh \\ & \approx -(\Delta h) \mathcal{V}(V_c) \mathcal{P}(V_c, W) \\ & \approx -(\Delta h) \times [\text{linear function of } V_c, W] \\ & \approx \text{linear function of } V_c, W, \Delta h \end{aligned}$$

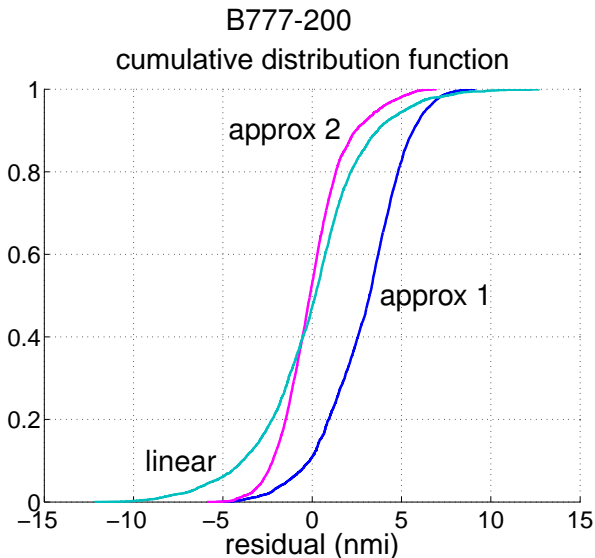
Each of the last three lines gives a polynomial approximation, with decreasing accuracy but increasing simplicity.



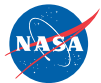
Accuracy of Approximations for TOD Location



Accuracy of Approximations for TOD Location



Validation Against Real-World Data



- Commercial FMS connected to flight simulator
- Same aircraft types as in mathematical analysis
- Test matrix is (3 values of descent CAS V_c) \times (3 values of weight W)
- All other inputs the same in all runs
- Recorded TOD locations computed by FMS



- Least squares fit with a model linear in V_c and W gave absolute errors less than 2 nmi for both aircraft types
- Much more accurate than expected from previous results
 - Approximations above partly explain this
 - Test matrix does not adequately exercise predictor



Operational Data Collection Procedures

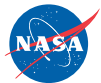
- Collected data for flights arriving at Denver International Airport
- September 8–23, 2009
- United Air Lines and Continental Airlines participated
- Humans in controller facility wrote down:
 - Flights that participated and whether descent interrupted
 - Speed profiles
- Pilots wrote down aircraft weight
- Extracted cruise altitude and horizontal trajectory from radar data



- Analyzed about 70 descents each for Airbus 319/320 and B757-200 from one airline
- Least squares fit with a model linear in Δh , V_C , and W gave absolute errors less than 4 nmi for all except:
 - Four (6%) of Airbus descents
 - Six (8%) of B757 descents



Applications



Possible Uses of These Approximations

- Design of FMS test bench experiments
- Simplified sensitivity analysis
- Kinematic predictor of TOD location
 - Dynamic machine learning of coefficients to handle de-icing settings, for example
 - Continuously updated error models
 - Only 5-10 coefficients; NASA predictor has 2000 entries in its table for B777 thrust



More About Kinematic Predictor

- For “what-if” tool with data link
 - Might only consider changing V_c and horizontal trajectory
 - Only need to assume S_{TOD} is linear in V_c
 - Only need to estimate *one* coefficient
- To fill in predicted trajectory between S_{TOD} and meter fix
 - Kinematic approach: straight line might be better than current predictions with 10 nmi error in S_{TOD}
 - Kinetic approach: modify $W/(T - D)$ so that integrator gives S_{TOD} close to desired value
 - Replace with constant
 - Multiply by constant
 - Add constant
 - ...



Conclusions

- Need to improve prediction of vertical profile to enable fuel-efficient descents in congested airspace
- Largest source of error is difference in $W/(T - D)$ between FMS and ground predictor
- TOD location can be approximated well by a simple function of h_{CRZ} , V_C , h_{fix} , V_{fix} , W
- These approximations might guide research to improve the predictor

