

# P3.22 VERIFICATION OF CLEAR AIR TURBULENCE (CAT) FORECAST INDICES DURING TWO WINTERS



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## 1. INTRODUCTION

- **Clear air turbulence:** in-flight bumpiness away from thunderstorms, generally above 500 mb (Ellrod et al. 2012)
- **CAT is an unsolved forecasting problem**, with techniques still falling short of Turbulence Joint Safety Implementation Team guidelines for probability of detection of its occurrence and absence ([http://www.cast-safety.org/pdf/jsit\\_turbulence.pdf](http://www.cast-safety.org/pdf/jsit_turbulence.pdf)) developed by CAST, a collaboration of FAA, NASA, DoD, and aviation industry organizations
- **Turbulence is the leading cause of non-fatal flight injuries;** 65% of weather-related aviation incidents involve turbulence, costing carriers tens of millions of dollars and causing hundreds of injuries per year (Sharman et al. 2006)
- The vast majority of incidents occur above FL100 (flight level 10,000 feet), with **many of them being CAT-related**



Figure 1. Kelvin-Helmholtz billows indicative of CAT, as seen from an airplane. Photograph by John Knox.

- **Forecasting improvements are needed**, the inspiration for this collaborative research with the Aviation Weather Center to develop and implement new and improved methods (see also Poster 3.7)

## 2. FORECASTING METHODS

- Two methods were analyzed using forecasts from NCEP's Global Forecast System (GFS):
  - Ellrod-Knapp Turbulence Index (Ellrod and Knapp 1992), also known as "TI" for Turbulence Index TI1, based on vertical wind shear (VWS) and flow deformation DEF:

$$TI = VWS \times DEF$$

- The new Ellrod-Knox modification to Ellrod-Knapp (Ellrod and Knox 2010) which incorporates a divergence tendency term DVT to account for CAT that occurs in unbalanced flow situations (e.g., Knox 1997), abbreviated here as "EKI"

$$EKI = TI + DVT$$

## 3. OPERATIONAL METHODOLOGY

- Divergence tendency was calculated using 3-h time increments; scaling was used because tendencies calculated from model time steps are ~ 2 orders of magnitude smaller than VWS and DEF
- $DVT = C [(du/dx + dv/dy)_{h_2} - (du/dx + dv/dy)_{h_1}] / 10800$ , where C is a model-dependent empirical constant (leading to scaled divergence tendency) and 10800 is the number of seconds in 3 hours
- Tests at AWC yielded good results for the GFS model for C = 100 and a time step of 3 hours
- Forecasts were made for 200-250 hPa layer (equiv., FL 340-390)
- Deformation and divergence were calculated at the top of the layer

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## 4. VERIFICATION METHODOLOGY

- **Two winters analyzed:** December-March 2009-10 and December-March 2010-11 using 1° x 1° GFS output
- Larger database than Ellrod and Knox (2010):
  - **2009-10 winter: Over 3500 PIREPs, over 1200 moderate-or-greater (MOG) reports**
  - **2010-11 winter: Over 4000 PIREPs, over 1000 MOG reports**
- **TI and EKI forecasts calculated from 24-h GFS forecasts** (23-km horizontal resolution) valid at 0Z and 18Z each day
  - PIREPs within +/- 1 h of forecast time included in analysis
- PIREPs west of Denver, CO ignored (to eliminate most mountain wave turbulence)
- PIREPs within 50 miles of radar reflectivities of 50 dBz or greater ignored (to eliminate turbulence due to deep convection)
- Performance evaluated using various index thresholds for both TI and EKI: 0, 4, 6, 8, 10, 12 and 16 ( $\times 10^{-9} s^{-2}$ )

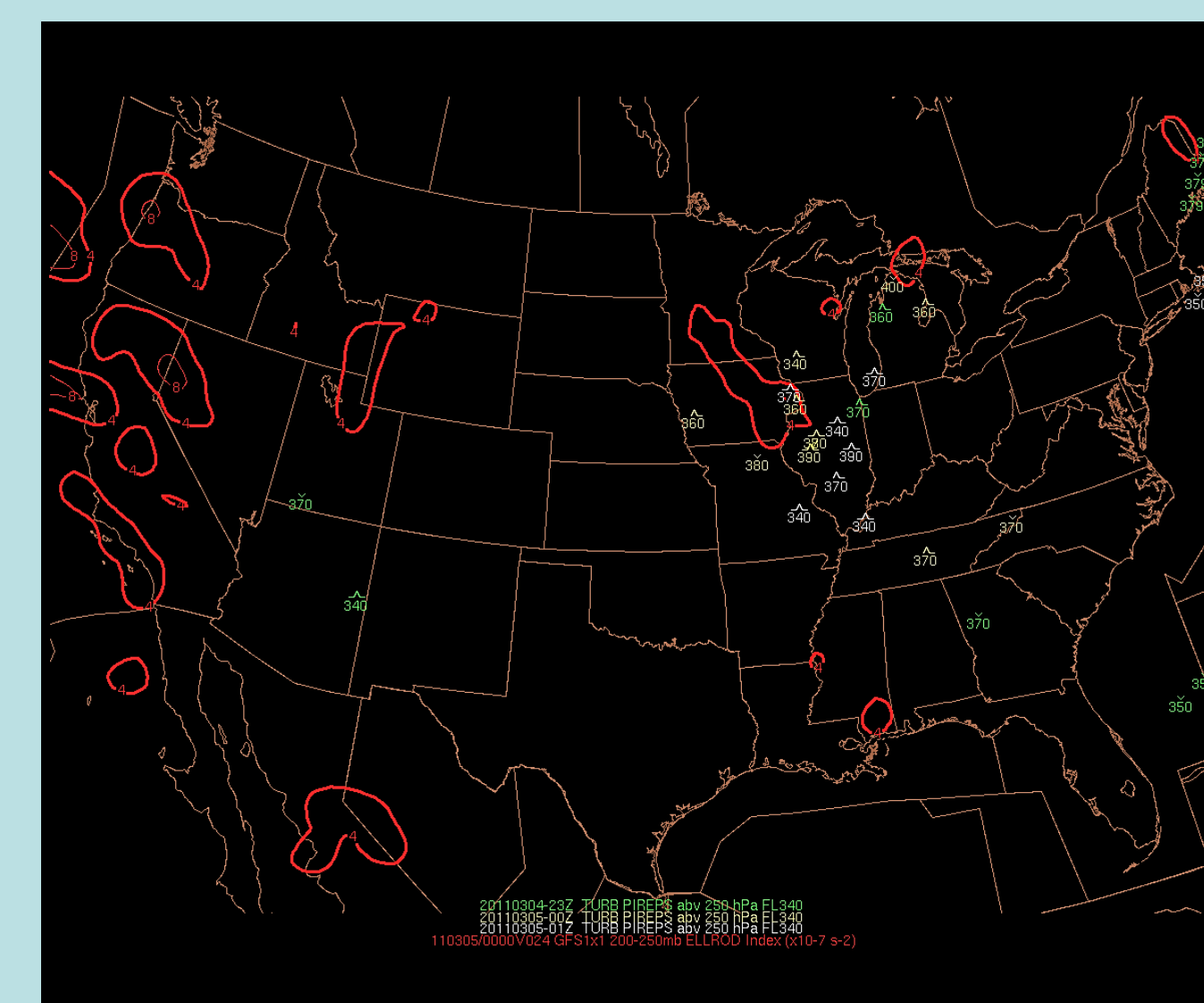


Figure 2. Ellrod-Knapp TI index for forecasting clear air turbulence, for a representative day during the study period. Contour levels start at 4, and PIREPs are overlaid.

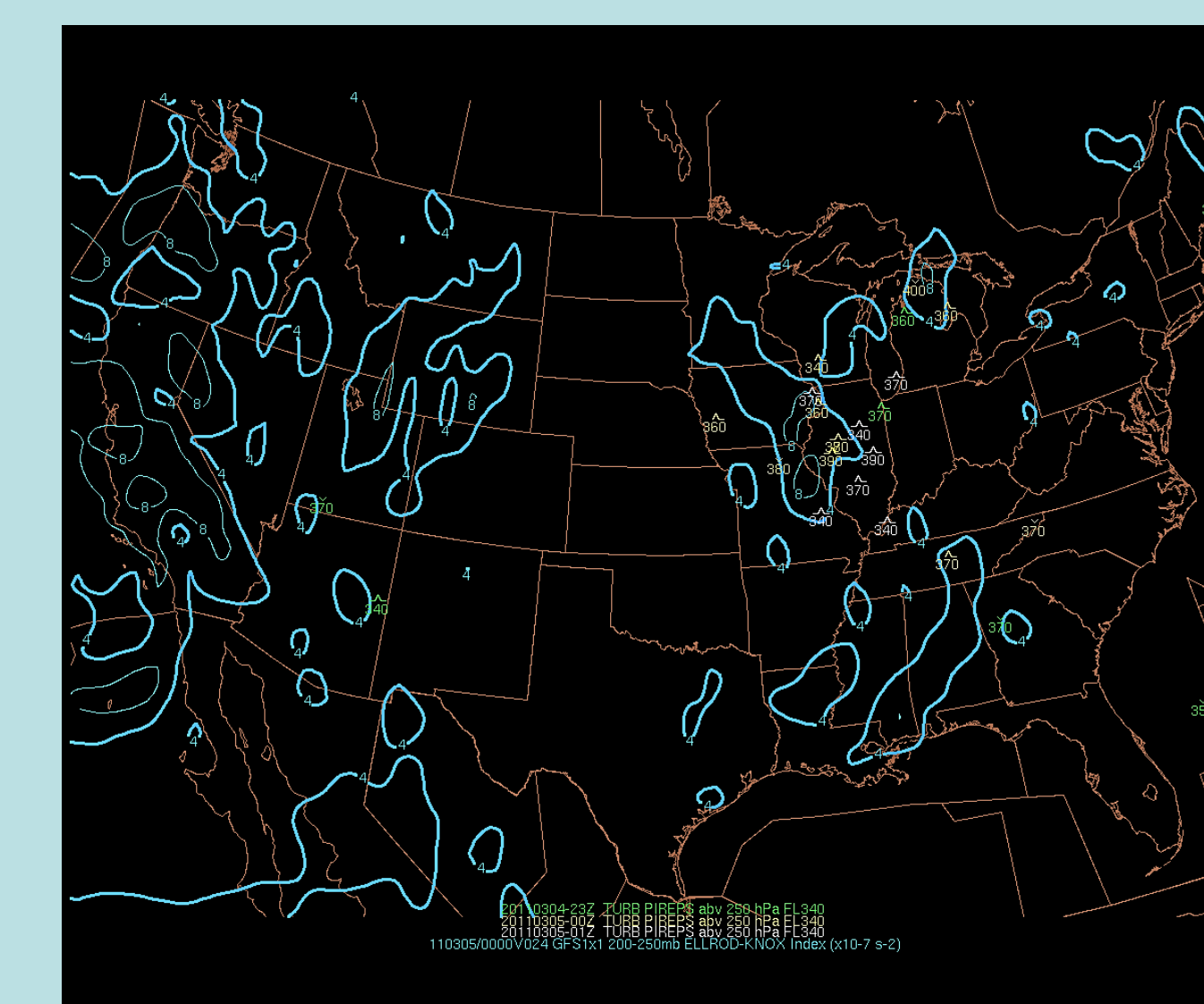


Figure 3. For the same time as in Figure 2, except for the Ellrod-Knox index EKI.

## 5. VERIFICATION METRICS

	Observed CAT	Observed NULL
Forecast CAT	(a) Hit	(b) False Alarm
Forecast No CAT	(c) Miss	(d) Correct Rejection

- Hit Rate (**PODy**):  $a/(a+c)$
- **PODn**:  $d/(b+d)$
- True Skill Statistic (**TSS**):  $PODy + PODn - 1$
- Critical Success Index (**CSI**):  $a/(a+b+c)$

## 6. RESULTS

### 2009-10 WINTER:

Table 1: PODy, PODn, TSS, and CSI for all turbulence reports by threshold for TI and EKI December 2009-March 2010. Boldface indicates the superior statistic of the two indices for each threshold and metric.

GFS 24-h	Dec 2009-Mar 2010 0z and 18z n=3518 PIREPs							
	PODy		PODn		TSS		CSI	
Threshold	TI	EKI	TI	EKI	TI	EKI	TI	EKI
4	0.567	<b>0.777</b>	<b>0.768</b>	0.592	0.335	<b>0.369</b>	0.441	<b>0.518</b>
6	0.354	<b>0.542</b>	<b>0.880</b>	0.777	0.234	<b>0.319</b>	0.308	<b>0.426</b>
8	0.250	<b>0.385</b>	<b>0.934</b>	0.876	0.184	<b>0.262</b>	0.231	<b>0.334</b>
10	0.135	<b>0.208</b>	<b>0.969</b>	0.940	0.104	<b>0.148</b>	0.130	<b>0.194</b>
12	0.105	<b>0.160</b>	<b>0.979</b>	0.965	0.085	<b>0.125</b>	0.103	<b>0.154</b>
16	0.062	<b>0.094</b>	<b>0.988</b>	0.979	0.050	<b>0.074</b>	0.061	<b>0.092</b>

Table 2: As in Table 1, but for MOG turbulence reports by threshold for TI and EKI December 2009-March 2010.

GFS 24-h	Dec 2009-Mar 2010 0z and 18z MOG: n=3146 PIREPs							
	PODy		PODn		TSS		CSI	
Threshold	TI	EKI	TI	EKI	TI	EKI	TI	EKI
4	0.577	<b>0.795</b>	<b>0.768</b>	0.592	0.345	<b>0.387</b>	0.420	<b>0.480</b>
6	0.365	<b>0.554</b>	<b>0.880</b>	0.777	0.245	<b>0.331</b>	0.306	<b>0.408</b>
8	0.259	<b>0.397</b>	<b>0.934</b>	0.876	0.193	<b>0.273</b>	0.234	<b>0.331</b>
10	0.138	<b>0.220</b>	<b>0.969</b>	0.940	0.107	<b>0.159</b>	0.132	<b>0.200</b>
12	0.106	<b>0.166</b>	<b>0.979</b>	0.965	0.086	<b>0.131</b>	0.103	<b>0.157</b>
16	0.061	<b>0.096</b>	<b>0.988</b>	0.981	0.048	<b>0.077</b>	0.059	<b>0.093</b>

### 2010-11 WINTER:

GFS 24-h	Dec 2010-Mar 2011 0z and 18z n=4028 PIREPs							
	PODy		PODn		TSS		CSI	
Threshold	TI	EKI	TI	EKI	TI	EKI	TI	EKI
4	0.334	<b>0.516</b>	<b>0.856</b>	0.718	0.190	<b>0.235</b>	0.277	<b>0.368</b>
6	0.213	<b>0.345</b>	<b>0.936</b>	0.884	0.149	<b>0.229</b>	0.195	<b>0.296</b>
8	0.122	<b>0.199</b>	<b>0.954</b>	0.924	0.076	<b>0.124</b>	0.114	<b>0.180</b>
10	0.073	<b>0.130</b>	<b>0.986</b>	0.970	0.059	<b>0.100</b>	0.072	<b>0.125</b>
12	0.057	<b>0.098</b>	<b>0.990</b>	0.980	0.046	<b>0.078</b>	0.056	<b>0.095</b>
16	0.019	<b>0.032</b>	<b>0.992</b>	0.988	0.012	<b>0.020</b>	0.019	<b>0.031</b>

Table 3: All turbulence statistics, as in Table 1, but for December 2010-March 2011.

GFS 24-h	Dec 2010-Mar 2011 0z and 18z MOG: n=3552 PIREPs							
	PODy		PODn		TSS		CSI	
Threshold	TI	EKI	TI	EKI	TI	EKI	TI	EKI
4	0.479	<b>0.658</b>	<b>0.856</b>	0.718	0.335	<b>0.376</b>	0.372	<b>0.421</b>
6	0.274	<b>0.442</b>	<b>0.936</b>	0.884	0.211	<b>0.326</b>	0.243	<b>0.359</b>
8	0.194	<b>0.305</b>	<b>0.954</b>	0.924	0.149	<b>0.228</b>	0.178	<b>0.264</b>
10	0.095	<b>0.163</b>	<b>0.986</b>	0.970	0.081	<b>0.133</b>	0.093	<b>0.154</b>
12	0.071	<b>0.127</b>	<b>0.990</b>	0.980	0.061	<b>0.106</b>	0.070	<b>0.122</b>
16	0.039	<b>0.069</b>	<b>0.992</b>	0.988	0.030	<b>0.057</b>	0.038	<b>0.068</b>

Table 4: MOG turbulence statistics, as in Table 2, but for December 2010-March 2011.

## 7. CONCLUSIONS

- **EKI is generally superior to TI for 24-h GFS forecasts; for example:**
  - ✓ **PODy: EKI improves on TI by 37-78% (all turbulence), 37-79% (MOG)**
  - ✓ **TSS: EKI improves on TI by 10-48% (all turbulence), 12-90% (MOG)**
  - ✓ **CSI: EKI improves on TI by 17-74% (all turbulence), 13-79% (MOG)**

## 8. REFERENCES

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