The Impact of NWS Weather Forecast Office Culture on Tornado Warning Performance

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Acknowledgements:
Shaun Del Duco,
Lou Mischkind,
Brent MacAloney
and the OCWWS Stats-on-Demand Team
Descriptive Statistics:
Constant = 10.0956
Coefficient = -0.0047
Rsqr = 0.127

T-value for slope = -0.85
2-tailed t-test 95% CI w/ 5 degrees of freedom = 2.57
### Descriptive Statistics:

- **Constant:** -31.8362
- **Coefficient:** 0.0163
- **Rsqr:** 0.623

### Tornado Probability of Detection

<table>
<thead>
<tr>
<th>Year</th>
<th>Probability</th>
</tr>
</thead>
<tbody>
<tr>
<td>1995</td>
<td>0.3</td>
</tr>
<tr>
<td>1996</td>
<td>0.4</td>
</tr>
<tr>
<td>1997</td>
<td>0.5</td>
</tr>
<tr>
<td>1998</td>
<td>0.6</td>
</tr>
<tr>
<td>1999</td>
<td>0.7</td>
</tr>
<tr>
<td>2000</td>
<td>0.8</td>
</tr>
<tr>
<td>2001</td>
<td>0.9</td>
</tr>
<tr>
<td>2002</td>
<td>1.0</td>
</tr>
</tbody>
</table>

- **T-value for slope:** 2.87
- **2-tailed t-test 95% CI w/ 5 degrees of freedom:** 2.57
Questions asked by National Weather Service Management

- How do we improve our tornado warning verification statistics?
- How will we meet our goals for tornado warnings?
- What do we invest our resources in?
Examine the Top Ten Offices
Descriptive Statistics:
Constant = -31.8362
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Tornado False Alarm Rate

Proportion Undetected

Year

GPRA GOAL

Top Ten WFO’s
Why are the Top Ten Offices doing so well?

- Better Science and Technology?
- Easier Verification?
- Easier Storms?
- More Practice?
- WFO Culture???????
Idioculture – culture in interaction

“A system of knowledge, beliefs, behaviors, and customs shared by members of an interacting group to which members can refer, that serves as the basis of further interaction. Members recognize that they share experiences, and these experiences can be referred to with the expectation that they will be understood by other members.”

-Gary Fine
“Group culture incorporates traditions and practices that are tied to background knowledge, common values, group goals and status systems, but also serves as a space in which new cultural items are performed that complement previous traditions” - Gary Fine
Hypothesis

A tornado warning is arguably the most challenging of all products issued by NWS forecasters. Sustained, high performance in tornado warnings, requires a highly-trained, dedicated staff who can work well as a team under very stressful conditions.

If the effects of group/office culture are to be seen, it would be in tornado warning verification statistics.

Offices that score high in tornado warning verification statistics will also score high in Employee Satisfaction Survey questions (proxy for WFO culture) compared to offices with poorer tornado verification statistics.
Methodology

- Obtained 2000 & 2001 Tornado Warning Statistics for each NWS forecast office
- Ranked all forecast offices by skill
- Requested a special aggregate report of NOAA’s all-employee survey (SFA) for the Top 10 and Bottom 10 forecast offices in skill
- Compared the two reports for significant differences
How would you rate the overall job done by your immediate supervisor?

- Top Ten Performers: 82%
- All NWS: 70%
- Bottom Ten Performers: 63%
My immediate supervisor is a technically competent professional (knows the job)?

- Favorable:
  - Top Ten Performers: 91%
  - All NWS: 79%
  - Bottom Ten Performers: 71%
My immediate supervisor is competent in "human relations" (dealing with people who work for him/her)
Supervision

I can depend on my immediate supervisor to support me in the face of opposition%

Top Ten Performers
All NWS
Bottom Ten Performers

% Favorable

I can depend on my immediate supervisor to support me in the face of opposition
There is trust between employees and my immediate supervisor

- **Top Ten Performers**: 74%
- **All NWS**: 61%
- **Bottom Ten Performers**: 55%
How would you rate the extent to which management treats you with respect and dignity?

- Favorable: 77%
- Top Ten Performers: 69%
- All NWS: 60%
- Bottom Ten Performers: 60%
How would you rate the consistency with which policies are administered where you work?

- Favorable
  - Top Ten Performers: 69%
  - All NWS: 58%
  - Bottom Ten Performers: 53%
Management promotes effective communication among different workgroups.
In my NOAA Line Office, management is receptive to change that will improve the working environment
Leadership

How would you rate the extent that management takes action on employee ideas and opinions?

- Top Ten Performers: 47%
- All NWS: 39%
- Bottom Ten Performers: 32%
Supervisors in the NWS take the time needed to properly manage their employees.
The NWS is one team working together to fulfill the NWS Mission.
The NWS has a family-friendly work environment

% Favorable

- Top Ten Performers: 54
- All NWS: 51
- Bottom Ten Performers: 39
Findings from Phone Interviews of Top Ten Forecast Offices

- Manager leadership demonstrated through action (working shifts, severe weather) often in a subordinate role
- Managers do not micro-manage severe weather operations
- Some managers had anti-role models
- Managers back up their forecasters’ decisions
- Managers foster open dialog
- Managers are careful in hiring people to enhance the existing team (consider both skills and personality)
- Office commitment to improvement
Findings from Phone Interviews of Top Ten Forecast Offices

- Managers work closely with the union representatives
- Managers support family/personal needs
- Offices seem to have low staff turnover
- Managers have strong focus on making the work satisfying and enjoyable for their employees
- Managers work to make sure that all employees are appreciated (both mets and non-mets)
- Managers reward quickly and often
- Management team support manager’s goals
* Offices west of the Rockies were excluded from our analyses, as well as those reporting fewer than five tornado events in 2001/2002 and those with fewer than five employees completing the survey.
Weather Forecast Office (WFO) Culture

Characteristics

- “Family” unit of 20-30 people, isolated from other offices
- Relatively homogenous in gender, ethnicity, age
- Experienced (10-25 yrs)
- Unionized
- High value placed on Science and Technology and Dedication to Mission
Which Storms are Tornadic?

- Has the radar identified a strong storm?
- Are there signs of rotation in the storm?
- Are there spotter reports of a funnel with the storm?
- Have other storms in the area produced tornadoes?
- Where is the storm heading?
- Will it remain tornadic?
Key Measures on 50 WFOs

- Data for 50 Weather Forecast Offices:
  - Critical Success Index (CSI) – key measure of tornado warning performance that combines hits, misses, and false alarms
    - Hits: Number of positive forecasts followed by an event occurrence
    - Misses: Number of occurrences that were not predicted
    - False Alarms: Number of positive forecasts that were not accompanied by an event
  - Sick leave hours per month per employee
  - Employee Satisfaction – from a Sirotta survey of 12,000 National Oceanic and Atmospheric Administration (NOAA) employees
    - Conducted as part of a diversity strategy
    - Approximately 130 multiple-choice questions
    - Administered through February of 2002
Data on 50 Weather Forecast Offices (continued):

- **Controlled variables** – several variables thought to affect tornado warning performance accuracy were statistically controlled for:
  
  - Employee tenure
  - Education level
  - Number of employees at each site
  - Geography
  - Number of tornado events
  - F-Scale of tornadoes

- **Other potential influences were comparable across the offices**:
  
  - Technology
  - Training opportunities
Variation in CSI Scores Across Offices

Research Question: How do we explain these CSI performance differences for tornado warnings across WFO’s?

![Variation in CSI Scores Across Offices](image)

Number of Weather Forecasting Offices

- Poor Performance
- Better Performance
Results

- Out of 149 questions, 131 (88%) were positively correlated to CSI for Tornado Warnings.

- Null hypothesis of a random relationship between SFA results and CSI can be rejected with an enormous degree of confidence (0.0000000.....1).

- Of the 18 correlations that were negative, none were significant at the .05 level.

- Of the 131 that were positive, 27 were significant at the .05 level.
Highest Correlates of Tornado Warning Performance

<table>
<thead>
<tr>
<th>Variable</th>
<th>Correlation (r)</th>
</tr>
</thead>
<tbody>
<tr>
<td>Sick leave hrs per month per employee (actual sick leave hours per month)</td>
<td>-0.45**</td>
</tr>
<tr>
<td>My last performance appraisal was on schedule</td>
<td>0.42**</td>
</tr>
<tr>
<td>Reasonable accommodations are made for persons with disabilities (e.g., availability of sign language interpreters, ramps, Braille)</td>
<td>0.38**</td>
</tr>
<tr>
<td>I know the process for voicing a complaint or filing a grievance through the union</td>
<td>0.36**</td>
</tr>
<tr>
<td>In my Line/Staff Office, work practices and procedures that are no longer needed are eliminated</td>
<td>0.34**</td>
</tr>
<tr>
<td>I understand the relationships between the NOAA Line/Staff Offices</td>
<td>0.30*</td>
</tr>
<tr>
<td>Differences among individuals are understood and accepted (e.g., gender, race, religion, age, sexual orientation, disability)</td>
<td>0.28*</td>
</tr>
<tr>
<td>Diverse groups (e.g., work teams, customers) participate in the development of performance measures where I work</td>
<td>0.28*</td>
</tr>
<tr>
<td>The results of the 1998 SFA were used constructively by management</td>
<td>0.26*</td>
</tr>
<tr>
<td>I know where to find information concerning my rights as a federal employee</td>
<td>0.25*</td>
</tr>
<tr>
<td>I know how to contact the appropriate union official if I need to</td>
<td>0.24*</td>
</tr>
<tr>
<td>I understand that the union is the exclusive representative of NWS bargaining unit employees</td>
<td>0.24*</td>
</tr>
</tbody>
</table>

*Pairwise n = 50;  * p < .05;  ** p < .01*
Nearly half of the differences in WFOs’ performance are accounted for by four variables:

- Unknown factors: 54%
- Sick leave: 20%
- Know process for voicing complaint through union: 7%
- Accommodations for disabled: 7%
- Performance appraisal on schedule: 12%

* Results based upon stepwise regression analysis
The most important factors in tornado warning performance reflect managerial effectiveness: Performance Orientation and Employee Relations

* Values are Standardized Beta coefficients
A clear pattern of relationships emerges:

- Work group cooperation and teamwork
  - Within work groups ($r = -0.30$ *)
  - Between work groups ($r = -0.41$ **)
- Supervisor behavior
  - Responsive to employee ideas ($r = -0.40$ **)
  - Fair ($r = -0.36$ *) and Supportive ($r = -0.35$ *)
  - Relationship with union representative ($r = -0.40$ **)
- Performance and diversity

In other words . . .

- WFO culture has a strong and consistent impact on sick leave
- And, ultimately on tornado warnings

* $p < .05$; ** $p < .01$
NWS Tornado Warning Performance

CSI Trend Line

CSI Score


2007 NWS Goal

X
NWS Tornado Warning Performance

WFOs performing best on cultural variables have reached the NWS goal four years ahead of schedule:

Top Third of WFOs on Culture Index*

Bottom Third of WFOs on Culture Index*

*The Culture Index comprises the following items: Performance appraisal on schedule, Accomodations for disabled and Know process for voicing complaint through union
Conclusions - Part I

- Improvements in technology and advancements in science are extremely important to improve tornado warning performance. They promise to raise the performance of all offices.

- In addition, we have found that leadership in individual National Weather Service offices also has a demonstrable impact on performance.

- In fact, the quantitative goal of excellence the National Weather Service has set for itself could be achieved by attending to these cultural variables alone.
Conclusions - Part I (cont.)

- Where a high performance culture is in place, a better job is done carrying out the National Weather Service mission!

- Where a high performance culture is in place, the cost of carrying out the National Weather Service mission is reduced!

- SFA 2002 results show that the National Weather Service should focus on aligning the management practices in all its offices with those that foster of a culture of high performance. An improvement strategy based only on science and technology without an aggressive human relations component is likely to fall short of the mark.

- This is the Business Case for non-technical (leadership, diversity, communication, etc) training for the National Weather Service
High Performance Culture

CHARACTERISTICS
Flexible Policies/Procedures
Teamwork
Open Communication
Focus on Performance
Goals Set and Tracked
Strong Customer Orientation
Emphasis on Innovation
Trust and Respect
Good Relations with Union

Highly Accurate Warnings
Low Sick Leave

Low Performance Culture

CHARACTERISTICS
Rigid Policies/Procedures
Unresolved Conflict
Climate of Fear
Lack of Empowerment
Poor Sense of Goals
Lack of Customer Focus
Resistance to Change
Ignorance of Diversity Issues
Poor Relations with Union

Moderately Accurate Warnings
High Sick Leave
That was a *snapshot* from nine years ago.

In the wake of the Joplin and Tuscaloosa Tornado disasters of 2011, is the impact of WFO culture on performance still valid?
CSI

COUNTY-BASED WARNINGS

STORM-BASED WARNINGS

TOP 1/3 of WFOs on Culture Index

BOTTOM 1/3 of WFOs on Culture Index


0 0.05 0.1 0.15 0.2 0.25 0.3 0.35 0.4
TOP 1/3 of WFOs on Culture Index

BOTTOM 1/3 of WFOs on Culture Index
16-year mean = 0.669  16-year mean = 0.784
NWS Central Region Service Assessment
Joplin, Missouri, Tornado – May 22, 2011

U.S. DEPARTMENT OF COMMERCE
National Oceanic and Atmospheric Administration
National Weather Service, Central Region Headquarters
Kansas City, MO

July 2011
“While there are no guarantees that simply decreasing false alarms will significantly impact warning response behavior, the results of the Joplin residents interviews appear to indicate a relationship between perceived false alarms, degree of warning credibility, and complacency in warning response.”
“We also found evidence of a false alarm effect, as a higher recent, local false alarm ratio (FAR) significantly increases fatalities and injuries.”

Simmons and Sutter (2011)
Annual Fatalities
Occurring within WFO County-Warning Areas
(CWAs)

16-year mean = 6.8
16-year mean = 53.6
Authors of the Storm
Meteorologists and the Culture of Prediction
Gary Alan Fine
“I argue that any orientation toward science and work is created by groups with their own shared pasts. Local conditions matter.”

“They (group cultures) influence standards of occupational practice. Different cultures have distinct effects, even when tasks are ostensibly similar.”

“Idiocultures can reverberate long after the original participants have departed.”
## Demographics of the WFO Culture Index

<table>
<thead>
<tr>
<th>Region</th>
<th>Tornado Alley</th>
<th>Office History</th>
</tr>
</thead>
<tbody>
<tr>
<td><strong>Top 1/3</strong></td>
<td></td>
<td></td>
</tr>
<tr>
<td>CR</td>
<td>56%</td>
<td>Former WFSOs: 39%</td>
</tr>
<tr>
<td>SR</td>
<td>32%</td>
<td>Former WSOs: 61%</td>
</tr>
<tr>
<td>ER</td>
<td>6%</td>
<td></td>
</tr>
<tr>
<td>WR</td>
<td>6%</td>
<td></td>
</tr>
<tr>
<td><strong>Bottom 1/3</strong></td>
<td></td>
<td></td>
</tr>
<tr>
<td>CR</td>
<td>56%</td>
<td>Former WFSOs: 61%</td>
</tr>
<tr>
<td>SR</td>
<td>33%</td>
<td>Former WSOs: 39%</td>
</tr>
<tr>
<td>ER</td>
<td>11%</td>
<td></td>
</tr>
<tr>
<td><strong>Inside Tornado Alley</strong></td>
<td>50%</td>
<td></td>
</tr>
<tr>
<td><strong>Outside Tornado Alley</strong></td>
<td>50%</td>
<td></td>
</tr>
<tr>
<td><strong>Top 1/3</strong></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Inside Tornado Alley</td>
<td>50%</td>
<td></td>
</tr>
<tr>
<td>Outside Tornado Alley</td>
<td>50%</td>
<td></td>
</tr>
<tr>
<td><strong>Bottom 1/3</strong></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Inside Tornado Alley</td>
<td>22%</td>
<td></td>
</tr>
<tr>
<td>Outside Tornado Alley</td>
<td>78%</td>
<td></td>
</tr>
</tbody>
</table>
Conclusions - Part II

- A culture of high performance is enduring. In 2011, nine years after it was defined, the *Culture Index* continues to be a good predictor of tornado warning performance.

- The culture of high performance at the Top 1/3 WFOs in the study survived a major operations concept change (i.e. County-based to Storm-based tornado warnings). A culture of high performance is also a culture of change management.
Conclusions - Part II (cont.)

- The business case for non-technical “people” training in NWS is still valid.
- The Top 1/3 of 50 WFOs on the Culture Index have a lower mean annual tornado warning FAR and experience fewer tornado fatalities within their CWAs than the bottom 2/3 of WFOs.

→ Results are consistent with the findings of Simmons and Sutter (2011), the NWS Joplin Service Assessment (2011), and Fine (2007).
Key Questions

- How can WFO culture be changed to improve performance?
  → Case Study: Tom Kriehn and WFO MHX

- What feedback loops exist between performance and WFO culture?

- What is the nature of the so-called false alarm effect?
  → Critical Social Science Research Area
Back-up
CSI = \frac{1}{1/(1-FAR) + (1/POD) - 1}

Gerapetritis and Pelissier