Predicting Retention Rates of U.S. Soldiers Stationed in Europe.

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The high pace of military operations (usually referred to as operations tempo, OPTEMPO), poor unit work climate, lack of good leadership, and family concerns have all been cited as reasons U.S. soldiers leave the military. In this study, we assessed how well each of these factors accurately predicted the career decision of 289 soldiers who were stationed in either Germany or Italy. OPTEMPO measures included the average number of hours worked per day, days worked per week, days spent on training exercises, days on temporary duty, number of deployments and work overload. Work climate measures included job satisfaction, job recognition, task significance, work intensity, job challenge, goal acceptance, job control, and soldier pride. Measures of leadership included NCO leadership, officer leadership, horizontal cohesion, general leadership, and morale. Family issues assessed were marital status, children, family members with special needs, and work family/family work conflict. Important demographic variables included were years in the military, rank, gender, ethnicity, and age. Career decision categories included remaining in the military, leaving the military, or being undecided. The best Chi Square Automatic Interaction Detection (CHAID) model had an overall accuracy of 62.3% in predicting career intentions, with years in the military, deployment experience, and job satisfaction included in the model. The best multinomial logistic regression model had an overall accuracy of 75.1%, with all of the OPTEMPO, work climate, and OPTEMPO X work climate interactions included in the model. These findings demonstrate that retention models must include a wide-range of indicators for predicting soldier career decisions.
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The U.S. has one of the largest militaries in the world, with over 1.5 million service members stationed around the world. The U.S. Army alone consists of nearly 435,000 soldiers, with 65,000 stationed in Europe. Remarkably, this entire force is maintained completely by voluntary service. That is the U.S. military doesn’t employ conscripts. Thus, recruiting, selection, and retention are extremely important for ensuring that the U.S. maintains a highly qualified and capable force. In this report, we focus on several key areas that are believed to be important in determining soldier retention: operations tempo (OPTEMPO), leadership, personal factors, work climate, and family considerations.

The U.S. Army is extremely concerned about the impact of OPTEMPO on retention, especially given the reduced size of the Army coupled with an ever increasing number of military deployments (see Castro & Adler, 1998, 1999). To date, the findings describing the effects of OPTEMPO on retention are somewhat mixed. For instance, while some investigators have shown that deployment experience has a negative effect on retention (Adler, Castro & Bartone, 1997; Sullivan et al., 1985; Giacalone, 2000), others have shown deployment experience to have a positive effect (Castro, Huffman, Adler & Bienvenu, 1999; Sticha, et al., 1999; Hosek & Totten, 1998). In addition, it has also been reported that soldiers who re-enlist work longer hours than those soldiers who plan on leaving the military (Castro et al., 1999). In another recent study, it was reported that the number of deployments a soldier has participated on did not impact retention (Reed & Segal, 2000).
Thus, it appears that how OPTEMPO is conceptualized (or measured) determines, to some extent, whether it can be shown to affect soldier retention. We define OPTEMPO here as "the rate of military actions or missions" (see Castro & Adler, 1999 for a full discussion of the issues surrounding defining OPTEMPO). In this report, we included several measures of OPTEMPO, including work hours, deployment experience, days on training exercises, and days on temporary duty. These four OPTEMPO measures were selected because they capture the workload of soldiers in garrison, on training exercises or on military deployments.

Personal factors (or demographics) such as rank and years in the military do impact on the career decision of soldiers. For example, noncommissioned officers (NCOs) are more likely to indicate they intend to remain in the military than junior-enlisted soldiers (Castro, Huffman, Bienvenu & Adler, 1999). Similarly, soldiers who have been on active duty for approximately ten years or longer are also more likely to remain in the military (Adler, et al., 1997). This latter finding has been referred to as the "half-way there effect" because soldiers and officers can retire from the U.S. military after twenty years of service. In addition to including rank and years of military service in this report, we have also included gender, ethnicity, and education level.

The role that leadership plays in determining soldier career intentions has not been well established (see Huffman et al, 2000; Vickers et al., 1983). However, soldiers who held positive views of their NCOs were more likely to report that they intended to remain in the military. Similarly, work climate and family considerations have also been reported to impact on soldier career intentions (Huffman, et al., 2000; Schumm, et al., 1998; Pierce, 1998). Perhaps the most important family variable that is related to soldier retention is marital status. Soldiers who are married are more likely to remain in the military compared to single soldiers.
METHODS

The findings reported here are part of a larger study examining the effects of operations tempo (OPTEMPO) and personnel tempo (PERSTEMPO) on soldier and unit readiness in the U.S. Army, Europe (Castro, Adler, Bienvenu, 1998). This report is based on data that was collected from June 1999 to December 2000 and focuses on soldiers’ and officers’ career intentions.

Participants. The sample included 289 U.S. soldiers and junior officers stationed in Germany or Italy who were participating in the OPTEMPO/PERSTEMPO study. All of the soldiers had either recently made a career decision or were about to make a career decision (i.e. they were in their reenlistment window). The sample included 81.8% male and 18.2% female soldiers. The largest ethnic group was white (63.4%), followed by African American (15.8%), and Hispanic (10.4%), with just over ten percent of the sample being members of some other ethnic group (10.2%). There were 47.2% junior-enlisted soldiers, 35.7% non-commissioned officers (NCO), and 25.0% junior officers (lieutenants or captains). Almost half (45.7%) of the sample were married, 46.0% were single, 8.0% separated, divorced, or widowed. In terms of the highest education level obtained, 34.6% were high school graduates, 39.4% had some college, and 22.8% had a college degree. In this sample, 58.8% had previous deployment experience and 41.2% had never deployed.

Scales and Items. All of the soldiers in the OPTEMPO study completed an OPTEMPO survey that included basic demographic questions and a section on OPTEMPO measures, work climate, leadership, family issues, and career intentions. The OPTEMPO measures included number of deployments, hours of work per day, number of days on training exercise, and number of days on temporary duty. Work climate scales included job recognition (Brown & Leigh, 1996), job challenge (Brown et al.), work intensity (Brown et al.), goal acceptance (Podsakoff,
MacKenzie & Ahearne, 1997), job control (Hackman & Oldham, 1975), job satisfaction (Hackman & Oldham, 1975), task significance (Bliese, Escolas, Christ & Castro, 1999) and soldier pride (Viatkus, 1994; Marlowe, 1985). Leadership was measured by examining horizontal cohesion (Podsakoff, et al.), NCO leadership, officer leadership, general leadership quality (Viatkus; Marlowe), and morale (Castro, Bienvenu, Huffman & Adler, 2000). Family issues were measured by the work-family conflict and family-work conflict scales (Netemeyer, Boles, & McMurrian, 1996), and by asking the respondents about their marital status, the number of children they had, and whether they had family members with special needs. Important demographic or personal factors included the number of years the soldier was in the military, ethnicity, gender, highest level of education completed, rank, and age.

Career intentions were measured with a single item. Each respondents’ career intention was determined using the following survey question, “Which best describes your current active-duty Army career intentions?” The response options were: 1) definitely stay in until retirement; 2) probably stay in until retirement; 3) definitely stay in beyond present obligation, but not until retirement; 4) undecided; 5) probably leave upon completion; or 6) definitely leave upon completion of current obligation. For model development, this retention outcome was categorized into three options. Soldiers who indicated that they were definitely going to stay until retirement, probably going to stay until retirement or definitely stay beyond their present obligation, but not until retirement were categorized as STAY. Soldiers who indicated that they would probably leave upon completion of their current obligation or definitely leave upon the completion of the current obligation were categorized as LEAVE. Soldiers who marked undecided were categorized as UNDECIDED. This item has been used in previous military research (Tremble, Payne, & Bullis, 1998) to measure career intention. Its test-retest reliability coefficient in the present study was .79. Research by Hom, Caranikas-Walker, Prussia and
Griffeth (1992) has found that turnover (or career) intention is predictive of actual career choice behavior.

**Statistical Analyses.** Two methods of analyses were used to predict retention decisions, Multinomial Logistic Regression (MLR) and Chi-Squared Automated Interaction Detection (CHAID). MLR is a common technique used to examine the relationship between a dependent variable and a set of predictor variables, where the dependent variable has two or more categories, and the predictor variables are either categorical or continuous (Menard, 1995). In this study, the significance level for main effects was set at alpha less than .05.

The other statistical technique, CHAID (Answer Tree 2.0, SPSS, 1998), is a less common statistical procedure that combines categories within a variable and detects interactions when there is one categorical dependent variable and multiple predictor variables. CHAID creates mutually exclusive subgroups within each variable and the partitioned variable that yields the most significant chi-square is determined the best predictor. Once the primary predictor is established, the partitioning continues based on the primary predictor variable in a stepwise fashion with all the predictor variables. These results will continue to yield any possible new subgroups. This process continues until the size of the groups is either too small or there are no more significant relationships. The results, and terminology to describe the findings, are presented differently than the logistic regression model. The results are shown as a dendrogram (see Figure 1), with the significant predictor variables branching down from the dependent measure (root node). Nodes are the created subgroups, with the parent node being the originating node and the new nodes being the child node. Additionally, a misclassification matrix shows how inaccurately each dependent variable is predicted. The exhaustive CHAID was used in this study, with the significance level set at alpha less than .05. Each significance level was adjusted by Bonferroni technique to guard against Type I error. Maximum tree depth
was set at 3, minimum number of cases for parent node was set at 30, and minimum number of cases for child nodes was set at 10.

**Model Development.** We began our model development by using CHAID to identify the most important variables within each category that predicted career decision. We conducted five separate CHAID analyses including all the variables from each category (OPTEMPO, demographics, work climate, leadership or family issues. For example, in the first CHAID model we included all the OPTEMPO measures in order to predict career intention. In the second CHAID model we included all the demographic variables to predict retention, and so forth, until we developed five CHAID models. From these five CHAID models we developed an "integrated" CHAID model by including only the most significant variables from each CHAID model. For comparison, we also developed parallel MLR models with the same variables. Thus, we were able to make direct comparisons between the CHAID and MLR models.

Next, we built four MLR models within the conceptual framework of the stressor-moderator-strain model, also known as the stress-buffering model (see Cohen & Wills, 1985; LaRocco, House & French, 1980; Thiots, 1982). The OPTEMPO measures (i.e., work hours, days on temporary duty, deployment experience, and days on training exercises) were conceptualized as the stressors. The demographic or personal factors, family issues, leadership, and work climate categories were conceptualized as the moderators. The outcome or strain was retention. The OPTEMPO measures (i.e., stressors) and retention (i.e., outcome) were entered into each model. The four MLR models were distinguished by the category of moderators each contained. In addition, each model also contained all the stressor-moderator interaction terms.

**RESULTS**

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In the total sample (N=289), 26.4% reported they were definitely or probably going to stay in until retirement, 12.0% reported they would stay beyond their obligation, 38.8% stated they would probably or definitely leave after their obligation, and 22.8% were undecided. NCOs and officers were more likely to stay in the military than junior-enlisted soldiers, $\chi^2(4, N=298) = 43.1$. Soldiers and officers who were older, $F(2,284)=29.0$, and had served more years in the military, $F(2,284)=29.0$, were more likely to report that they were planning on staying in the military.

**OPTEMPO.** The variables, “number of hours worked per day”, “days spent on training exercise”, “days on temporary duty”, and “deployment experience” were entered into each model with career intentions being the dependent measure. Using CHAID, the only significant OPTEMPO variable that predicted career intention was deployment experience, with those who had deployment experience (37.1%) being more likely to stay in the military than those with no deployment experience (28.6%), $\chi^2(2, N=289) = 8.5$.

The OPTEMPO MLR model was also significant, $\chi^2(8, N=289) = 18.7$, deviance $\chi^2(496) = .185$, psuedo R-square (Nagelkerke) = .074. Likelihood ratio tests showed that deployment experience, $\chi^2(2, N=289) = 7.0$, and days on temporary duty, $\chi^2(2, N=289) = 6.9$, were predictive of staying in the military, with soldiers who were undecided about a military career (vs. leaving) having more days on temporary duty and being more likely to have deployed compared to soldiers who intend to leave the military.

The overall OPTEMPO CHAID model correctly predicted 46.7% of the cases while the overall OPTEMPO MLR model correctly predicted 50.5% of the cases. In terms of correctly classifying each retention outcome, the OPTEMPO CHAID model correctly classified the leave category 100% of the time, and the stay and undecided categories 0.0% of the time. The
OPTEMPO MLR model correctly classified the leave category 93.9% of the time, the stay category 14.7% of the time, and the undecided category 7.4% of the time.

**Demographics.** Years in the military, ethnicity, gender, education, rank, and age were entered into the models, with career intentions being the dependent measure. The CHAID analysis revealed that the only significant demographic variable for predicting career intentions was years in the military, \( \chi^2(4, N=289) = 66.4 \). For soldiers who had been in the military for more than seven years, 68.9% reported they intended to stay, compared to 32.5% of those who were in the military for three to six years, and 14.8% of those who have been in the military for less than three years.

The demographic MLR model was significant \( \chi^2(10, N=289) = 74.5 \), deviance \( \chi^2(162) = .50 \), psuedo R-square (Nagelkerke) = .27. Likelihood ratio tests revealed that years in the military, \( \chi^2(2, N=289) = 29.9 \), and rank, \( \chi^2(4, N=289) = 10.4 \), were predictive of staying in the military, with soldiers who stated they were leaving (vs. undecided) having spent less time in the military and being junior-enlisted.

The overall demographic CHAID model correctly predicted 58.8% of the cases while the overall demographic MLR model correctly predicted 60.2% of the cases. In terms of correctly classifying each retention outcome, the demographic CHAID model correctly classified the leave category 88.2% of the time, the stay category 52.6% of the time, and the undecided category 0.0% of the time. The demographic MLR model correctly classified the leave category 83.2% of the time, the stay category 59.6% of the time, and the undecided category 5.6% of the time.

**Work Climate.** The work climate variables included, job recognition, job challenge, work intensity, goal acceptance, job control, job satisfaction, task significance, and soldier pride. These items were entered into the models with career intentions being the dependent measure. The strongest predictor of career intentions on the basis of the work climate CHAID analyses
was soldier pride, with soldiers with high soldier pride were more likely to stay in the military (51.1%) than soldiers with low soldier pride (18.6%), $\chi^2(2, N=289) = 40.0$. Additionally, job satisfaction interacted with soldier pride, whereas soldiers with high soldier pride and high job satisfaction were more likely to remain in the military (64.5%) than soldiers with high soldier pride and low (38.5%) or medium (40.0%) job satisfaction, $\chi^2(4, N=289) = 17.2$.

The work climate MLR model was significant, $\chi^2(16, N=289) = 51.3$, deviance $\chi^2(336) = .82$, psuedo R-square (Nagelkerke) = .29. Likelihood ratio tests revealed that soldiers who were staying in the military had higher levels of soldier pride compared to those soldiers who were leaving the military, $\chi^2(2, N=289) = 9.2$.

The overall work climate CHAID model correctly predicted 58.1% of the cases while the overall work climate MLR model correctly predicted 61.5% of the cases. In terms of correctly classifying each retention outcome, the work climate CHAID correctly classified the leave category 77.7% of the time, the stay category 64.9% of the time, and the undecided category 0.0% of the time. The work climate MLR model correctly classified the leave category 77.6% of the time, the stay category 67.7% of the time, and the undecided category 0.0% of the time.

**Leadership.** The leadership variables horizontal cohesion, NCO leadership, officer leadership, general leadership quality, and morale were entered into each model with career intentions being the dependent measure. For the leadership CHAID model, NCO leadership was the most important variable for predicting career intention, $\chi^2(2, N=289) = 24.0$. However, NCO leadership did significantly interact with general leadership quality, $\chi^2(2, N=289) = 11.3$. Soldiers with higher perceptions of NCO leadership (40.1%) were more likely to stay in the military than soldiers with lower perceptions (13.9%) of NCO leadership. Additionally, soldiers
with low NCO leadership and low leadership quality were less likely to stay (3.2%) than soldiers with low NCO leadership and high leadership quality (22.0%).

The leadership MLR model revealed similar results to that of the leadership CHAID model. The leadership MLR model was significant, $\chi^2(10, N=289) = 33.8$, deviance $\chi^2(534) = .46$, psuedo R-square (Nagelkerke) = .13. Likelihood ratio tests indicated that NCO leadership was the only predictor of career intentions, $\chi^2(2, N=289) = 11.2$. Soldiers who were staying (vs. leaving) rated NCO leadership higher and soldiers who were undecided (vs. leaving) rated NCO leadership higher.

The overall leadership CHAID model correctly predicted 47.8% of the cases, while the leadership MLR model correctly predicted 51.9% of the cases. In terms of correctly classifying each retention outcome, the leadership CHAID model correctly classified the leave category 37.8% of the time, the stay category 90.0% of the time, and the undecided category 0.0% of the time. The leadership MLR model correctly classified the leave category 73.3% of the time, the stay category 52.6% of the time, and the undecided category 0.0% of the time.

**Family Measures.** Marital status, number of children, families with special needs, work-family conflict and family-work conflict were entered into each model with career intentions being the dependent measure. The strongest predictor of career intentions on the basis of the CHAID analyses was marital status with married personnel being more likely to stay (43.8%) than single personnel (25.48), $\chi^2(2, N=289) = 10.8$.

The family MLR model was significant, $\chi^2(10, N=289) = 20.2$, deviance $\chi^2(360) = .19$, psuedo R-square (Nagelkerke) = .079. Likelihood ratio tests indicated that marital status, $\chi^2(2, N=289) = 5.0$, and work-family conflict, $\chi^2(2, N=289) = 4.9$, were significant predictors of
career intentions. Soldiers who were staying in the military were more likely to be married and/or have less work-family conflict than soldiers who were leaving the military.

The overall family CHAID model correctly predicted 49.2% of the cases while the overall family MLR model correctly predicted 53.3% of the cases. In terms of correctly classifying each retention outcome, the family CHAID model correctly classified the leave category 63.0% of the time, the stay category 58.8% of the time, and the undecided category 0.0% of the time. The family MLR model correctly classified the leave category 79.9% of the time, the stay category 47.9% of the time, and the undecided category 0.0% of the time.

**Integrated Models.** From the four CHAID analyses conducted above, there was one significant stressor variable (deployment experience) and six significant moderator variables (years in military, soldier pride, job satisfaction, NCO leadership, leadership quality, and marital status) that predicted career intention. The integrated CHAID model that included all of these variables found that the number of years in the military was the most important variable for predicting career intention, $\chi^2(4, N=289) = 66.4$. In addition, years in the military interacted with deployment experience, $\chi^2(2, N=289) = 7.6$, and job satisfaction, $\chi^2(2, N=289) = 17.1$. Soldiers who were on active duty for less than three years and had deployment experience were more likely to leave the military (73.2%) than those soldiers who had never deployed before (53.1%) were. For soldiers who had been on active duty for three to six years, those with higher job satisfaction were more likely to remain in the military (70.0%) than those with lower job satisfaction (20.0%). Figure 1 shows the complete “integrated” CHAID model.

The integrated MLR model was significant, $\chi^2(14, N=289) = 108.3$, deviance $\chi^2(554) = .98$, pseudo R-square (Nagelkerke) = .36. Likelihood ratio tests indicated that years in the military, $\chi^2(2, N=289) = 35.5$, deployment experience, $\chi^2(2, N=289) = 5.0$, and military pride,
\( \chi^2(2, N=289) = 9.8 \), were significant predictors of career intention. Soldiers who had been on active duty longer, had higher military pride, or had never deployed before were more likely to remain in the military.

The overall integrated CHAID model correctly predicted 62.3% of the cases and the integrated MLR model correctly predicted 63.1% of the cases. In terms of correctly classifying each retention outcome, the integrated CHAID model correctly classified the leave category 89.2% of the time, the stay category 67.0% of the time, and the undecided category 0.0% of the time. The integrated MLR model correctly classified the leave category 85.1% of the time, the stay category 68.0% of the time, and the undecided category 1.8% of the time.

**Stressor-Strain Models.** Four separate MLR models containing the OPTEMPO measures, each category (i.e. leadership, work climate, demographics, and family), and the interaction of each category with OPTEMPO measures were developed. Of the four stressor-strain models, the most predictive model was the one that contained the work climate variables, \( \chi^2(78, N=289) = 140.5 \), deviance \( \chi^2(266) = .99 \), psuedo R-square (Nagelkerke) = .64. Likelihood ratio tests revealed that work hours, \( \chi^2(2, N=289) = 10.6 \), deployment experience, \( \chi^2(2, N=289) = 7.4 \), and soldier pride, \( \chi^2(2, N=289) = 7.7 \), were significant predictors of retention. In addition, likelihood ratio tests indicated that deployment experience X goal acceptance, deployment experience X job control, work hours X job recognition, work hours X goal acceptance, days on temporary duty X soldier pride, and days on temporary duty X work intensity interaction terms were significant, all \( \chi^2(2, N=289) > 6.2 \). The OPTEMPO-work climate model correctly predicted 75.1% of the cases. In terms of correctly classifying each retention outcome, this OPTEMPO-work climate MLR model correctly classified the leave category 84.1% of the time, the stay category 76.6% of the time, and the undecided category 44.4% of the time.
DISCUSSION

In this report we sought to develop predictive models of U.S. enlisted soldiers stationed in Europe who were in their re-enlistment window or of junior officers stationed in Europe who had one to two years remaining on the current military obligation. Overall, the career intentions of soldiers who plan to either stay or leave the U.S. military can be accurately modeled, using either chi square automatic interaction detection (CHAID) or multinomial logistic regression procedures (MLR).

The best CHAID model achieved an overall accuracy rate of 62.3%, with years in the military, deployment experience, and job satisfaction being important predictor variables. For those soldiers and officers intending to remain in the military, the accuracy of the CHAID model was 67.0% and for those soldiers and officers intending to leave the military, the accuracy of the CHAID model was 89.2%. Unfortunately, for soldiers and officers who were undecided about their career intentions, the CHAID model failed to accurately predict their career intentions.

The best MLR model of retention was the OPTEMPO-work climate model. This model had an overall accuracy rate of 75.1%, slightly better than the best CHAID model. In terms of accurately predicting the soldiers and officers who intended to remain and leave the military, the OPTEMPO-work climate MLR model achieved accuracy rates of 76.6% and 84.1%, respectively. For the undecided soldiers and officers, the accuracy of the MLR model was 44.4%, while this prediction rate was not great, it was better than the integrated CHAID model which had an accuracy rate of 0.0%

Although both the CHAID and MLR procedures resulted in fairly accurate models of soldier and officer retention, there are important differences between the two techniques. First, the best MLR model (i.e., the OPTEMPO-work climate MLR model) resulted in overall better
prediction rates than the best CHAID model (i.e., the integrated CHAID model) (see above). However, the best CHAID model was simpler than the best MLR model in that it contained fewer variables. The best CHAID model consisted of only three variables, with two interaction terms, while the best MLR model comprised 11 variables, plus 32 interaction terms. Third, the MLR procedures are more flexible than the CHAID procedures in that specific interaction terms can be included in the model, whereas, for CHAID, interaction terms are determined automatically. This resulted in the best MLR model having six significant interaction terms as opposed to only two significant interaction terms in the best CHAID model. Finally, because the CHAID model contains fewer variables and interaction terms than the MLR model it is relatively easier to interpret.

**Future Research.** In this report we included a wide variety of measures that are thought to be important in the career decision of soldiers and officers. These included operation tempo (OPTEMPO) measures, demographic or personal factors, leadership, family issues, and work climate. And although, accurate predictive models were successfully developed using these measures, other important factors such as civilian economic conditions and job opportunities, and unavoidable facts that impact retention (such as military separations due to medical conditions, indiscipline, etc.) were omitted. Future research should include these and other factors shown to be important in job turnover in the civilian community.

In this study, we assessed soldier career intention near the time that an actual career decision was being made. Indeed, in some instances soldiers had already re-enlisted for another term of military service or had already decided to leave the military. It is possible that their attitudes regarding work climate and leadership were subsequently affected by their career decision. Future research should assess work environment variables prior to the career decision being completed. This way, a stronger causal connection can be made between career decision
and important variables such as work environment and leadership. Finally, this study also relied on self-report measures of career intention. Although self-report measures of career intentions has been shown to be indicative of actual career decision behavior, self-report measures should be linked to actual retention decisions in future research.
REFERENCES


Table 1. Measures of interest by Career Intentions (N=289)

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<th>Undecided</th>
<th>Leave</th>
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<td>Single</td>
<td>25.5</td>
<td>20.4</td>
<td>54.1</td>
</tr>
<tr>
<td>Married</td>
<td>43.2</td>
<td>18.9</td>
<td>37.9</td>
</tr>
<tr>
<td>Families with Special Needs (%)</td>
<td>8.2</td>
<td>5.3</td>
<td>3.7</td>
</tr>
<tr>
<td>Have Children (%)</td>
<td>43.8</td>
<td>31.6</td>
<td>25.2</td>
</tr>
<tr>
<td>Work-Family conflict</td>
<td>16.2</td>
<td>16.7</td>
<td>17.3</td>
</tr>
<tr>
<td>Family-Work conflict</td>
<td>11.4</td>
<td>11.9</td>
<td>12.4</td>
</tr>
</tbody>
</table>

<table>
<thead>
<tr>
<th>OPTEMPO Measures</th>
<th>Stay</th>
<th>Undecided</th>
<th>Leave</th>
</tr>
</thead>
<tbody>
<tr>
<td>Average Hours Worked per Day</td>
<td>11.7</td>
<td>11.9</td>
<td>11.6</td>
</tr>
<tr>
<td>Days on Training Exercise*</td>
<td>35.0</td>
<td>28.7</td>
<td>38.6</td>
</tr>
<tr>
<td>Days on Temporary Duty**</td>
<td>12.2</td>
<td>15.8</td>
<td>6.7</td>
</tr>
<tr>
<td>Deployment Experience (%)</td>
<td>64.9</td>
<td>42.1</td>
<td>61.5</td>
</tr>
</tbody>
</table>

<table>
<thead>
<tr>
<th>Work Climate</th>
<th>Stay</th>
<th>Undecided</th>
<th>Leave</th>
</tr>
</thead>
<tbody>
<tr>
<td>Job Recognition</td>
<td>9.4</td>
<td>9.0</td>
<td>9.3</td>
</tr>
<tr>
<td>Job Challenge</td>
<td>6.8</td>
<td>6.0</td>
<td>5.8</td>
</tr>
<tr>
<td>Work Intensity</td>
<td>12.0</td>
<td>11.4</td>
<td>10.2</td>
</tr>
<tr>
<td>Goal Acceptance</td>
<td>5.9</td>
<td>5.5</td>
<td>5.1</td>
</tr>
<tr>
<td>Job Control</td>
<td>11.4</td>
<td>10.6</td>
<td>9.9</td>
</tr>
<tr>
<td>Job Satisfaction</td>
<td>11.1</td>
<td>8.8</td>
<td>7.8</td>
</tr>
<tr>
<td>Task Significance</td>
<td>11.3</td>
<td>9.9</td>
<td>9.3</td>
</tr>
<tr>
<td>Soldier Pride</td>
<td>12.2</td>
<td>11.1</td>
<td>9.8</td>
</tr>
</tbody>
</table>

<table>
<thead>
<tr>
<th>Leadership</th>
<th>Stay</th>
<th>Undecided</th>
<th>Leave</th>
</tr>
</thead>
<tbody>
<tr>
<td>Horizontal Cohesion</td>
<td>10.1</td>
<td>9.3</td>
<td>9.3</td>
</tr>
<tr>
<td>NCO Leadership</td>
<td>20.9</td>
<td>19.4</td>
<td>17.5</td>
</tr>
<tr>
<td>Officer Leadership</td>
<td>18.6</td>
<td>17.9</td>
<td>16.4</td>
</tr>
<tr>
<td>General Leadership Qualities</td>
<td>9.7</td>
<td>8.6</td>
<td>8.2</td>
</tr>
<tr>
<td>Morale</td>
<td>25.1</td>
<td>24.0</td>
<td>21.3</td>
</tr>
</tbody>
</table>

NOTE: All values are means unless otherwise stated and all scale scores are based on sum scores.

*In the past 6 months
1 leave and stay are different (significant at the .05 level)
2 leave and undecided are different (significant at the .05 level)
3 leave and stay are different (significant at the .05 level)
### Figure 1

The Integrated CHAID Model.
Predicting Retention Rates of U.S. Soldiers Stationed in Europe

Castro, C.A. & Huffman, A.H.

US Army Medical Research Unit-Europe
Walter Reed Army Institute of Research

International Applied Military Psychology-Workshop (IAMPS-W)
The Hague, Netherlands, April 2001
Literature Review

OPTEMPO

- There are inconsistencies on how operations tempo (OPTEMPO) effects retention in military populations.

  - Research has shown time away from garrison, deployments, and hours worked per day has positive effects on retention (Castro, Huffman, Adler, & Bienvenu, 1999; Sticha, et al., 1999; Hosek & Totten, 1998).

  - High OPTEMPO and time away from family and friends negatively impacted retention decisions (Adler, Castro & Bartone, 1997; Sullivan et al., 1985; Giacalone, 2000).

  - Multiple deployments did not impact retention (Reed & Segal, 2000).

Work Climate & Family

- Work climate and family issues were both cited as important issues when considering career intentions (Huffman, Adler, Dolan & Castro, 2000; Sullivan, 1998; Schumm, et al., 1998; Pierce, 1998).

Leadership

- The role of leadership on retention is not well established (Huffman, Adler, Dolan, & Castro, 2000; Vickers, et al., 1983).
Method: Participants

- All participants were active duty Army personnel (N=289).

### Gender

- Female: 18.2%
- Male: 81.8%

### Ethnicity

- White: 63.4%
- African-Amer: 15.8%
- Hispanic: 10.4%
- Other: 10.2%

### Marital Status

- Married: 45.7%
- Single: 46.0%
- Sep/Div: 8.0%

### Rank

- LT/CPT: 40.8%
- E5 - E8: 54.9%
- E1 - E4: 15.6%

Note: Numbers may not sum to 100% because of rounding or missing data.
Method: Survey Instrument (1 of 2)

- The survey solicits demographic information, deployment history, measures of OPTEMPO and readiness.

Family Considerations
- Families with Special Needs
- Number of Children
- Work-Family Conflict
- Family-Work Conflict
- Marital status

Demographics
- Years in Military
- Ethnicity
- Gender
- Education
- Rank
- Age

OPTEMPO
- Work Hours
- Days on Temporary Duty
- Deployment Experience
- Days on Training Exercises

Work Climate
- Recognition
- Job Challenge
- Work Intensity
- Goal Acceptance
- Job Control
- Job Satisfaction
- Task Significance
- Soldier Pride
Method: Survey Instrument (2 of 2)

- The outcome variable, career intentions, was categorized into three options: **Stay**, **Undecided**, or **Leave**.

- **Demographics**
  - Definitely Stay in until Retirement
  - Probably Stay in until Retirement
  - Definitely Stay in beyond present obligation, but not until retirement

- **Work Climate**
  - Undecided

- **Family**
  - Probably Leave upon Completion
  - Definitely Leave upon Completion of current Obligation

- **Leadership**

- **OPTEMPO**

---

U.S. Army Medical Research Unit-Europe, Walter Reed Army Institute of Research,
U.S. Army Medical Research and Materiel Command
Method: Procedures

- This report is part of a larger study examining the effects of operations tempo (OPTEMPO) and personnel tempo (PERSTEMPO) on soldier and unit readiness in the U.S. Army, Europe.

- This report is based on data that were collected from June 1999 to December 2000 and focuses on soldiers’ and officers’ career intentions.

- In this report, enlisted soldiers were all in their reenlistment window, and junior officers had one to two years remaining on their current obligation.
Method: Analyses

- Two methods of analysis were used to develop predictive models of retention.

- **Multinomial Logistic Regression** is a common technique used to examine the relationship between a dependent variable and a set of predictor variables, where the dependent variable has two or more categories, and the predictor variables are either categorical or continuous.

- **Chi-Squared Automated Interaction Detection** (CHAID; Answer Tree 2.0, SPSS, 1998), is a less common statistical procedure that combines categories within a variable and detects interactions when there is one categorical dependent variable and multiple predictor variables.
Results: Career Decisions

- 33.6% of the soldiers and leaders stated they are planning on staying in the military beyond their current obligation.

<table>
<thead>
<tr>
<th>Soldiers who are Staying by Rank</th>
</tr>
</thead>
<tbody>
<tr>
<td>E1 – E4</td>
</tr>
<tr>
<td>NCO</td>
</tr>
<tr>
<td>LT/CPT</td>
</tr>
</tbody>
</table>

<table>
<thead>
<tr>
<th>Soldiers who are Staying by Unit Type</th>
</tr>
</thead>
<tbody>
<tr>
<td>Combat Arms</td>
</tr>
<tr>
<td>Combat Support</td>
</tr>
<tr>
<td>Combat Service Support</td>
</tr>
</tbody>
</table>

- Soldiers and officers who were older, $F(2, 284)=39.0$, and had served longer, $F(2, 284)=39.0$, were more likely to report that they were planning on staying in the military.¹

¹$p < .05$

U.S. Army Medical Research Unit-Europe, Walter Reed Army Institute of Research, U.S. Army Medical Research and Materiel Command
Results: OPTEMPO

OPTEMPO Measures entered into the equation:
- Work Hours
- Days on Temporary Duty (TDY)
- Deployment Experience
- Days on Training Exercises

- CHAID analysis showed that 46.7% of the cases were predicted correctly by the OPTEMPO variables.

Career Intentions

<table>
<thead>
<tr>
<th>Never Deployed</th>
<th>Deployment Experience</th>
</tr>
</thead>
<tbody>
<tr>
<td>Stay</td>
<td>28.6</td>
</tr>
<tr>
<td>Undecided</td>
<td>27.7</td>
</tr>
<tr>
<td>Leave</td>
<td>43.7</td>
</tr>
</tbody>
</table>

Stay 37.1
Undecided 14.1
Leave 48.8

• Multinomial Logistic Regression (MLR) correctly predicted 50.5% of the cases, Model $\chi^2(8, N=289) = 18.69, GF (\chi^2 = 524.1, p=.19)$, Nagelkerke Pseudo $R^2=.07$.

with the strongest predictors being deployment experience, Model $\chi^2(2, N=289) = 6.98$ and days on TDY, Model $\chi^2(2, N=289) = 6.87$.

<table>
<thead>
<tr>
<th>Undecided</th>
<th>Leave</th>
<th>Stay</th>
</tr>
</thead>
<tbody>
<tr>
<td>$\beta$</td>
<td>$SE$</td>
<td>$\beta$</td>
</tr>
<tr>
<td>Intercept</td>
<td>1.26</td>
<td>.24</td>
</tr>
<tr>
<td>Days TDY</td>
<td>--</td>
<td>--</td>
</tr>
<tr>
<td>No Deployment Experience</td>
<td>-.89</td>
<td>.35</td>
</tr>
</tbody>
</table>

• Soldiers who had more days on TDY and deployment experience were more likely to stay (vs. leave). Soldiers who had no deployment experience were more likely to be undecided (vs. stay).

MLR - Predictions Correct

<table>
<thead>
<tr>
<th></th>
<th>Stay</th>
<th>Undecided</th>
<th>Leave</th>
</tr>
</thead>
<tbody>
<tr>
<td>0%</td>
<td>14.7%</td>
<td>7.4%</td>
<td>93.9%</td>
</tr>
</tbody>
</table>

U.S. Army Medical Research Unit-Europe, Walter Reed Army Institute of Research, U.S. Army Medical Research and Materiel Command

18 April 2001
Results: Demographics

Demographic variables entered into the equation:
- Years in Military
- Rank
- Ethnicity
- Age*
- Gender
- Education*

• CHAID analyses showed that 58.8% of the cases were predicted correctly by the demographic variables.

Career Intentions

<table>
<thead>
<tr>
<th>0 - 2 Years in Military</th>
<th>3 - 6 Years in Military</th>
<th>7 + in Military</th>
</tr>
</thead>
<tbody>
<tr>
<td><strong>Stay</strong></td>
<td><strong>Stay</strong></td>
<td><strong>Stay</strong></td>
</tr>
<tr>
<td>14.8</td>
<td>32.5</td>
<td>68.9</td>
</tr>
<tr>
<td><strong>Undecided</strong></td>
<td><strong>Undecided</strong></td>
<td><strong>Undecided</strong></td>
</tr>
<tr>
<td>21.5</td>
<td>26.3</td>
<td>9.5</td>
</tr>
<tr>
<td><strong>Leave</strong></td>
<td><strong>Leave</strong></td>
<td><strong>Leave</strong></td>
</tr>
<tr>
<td>63.7</td>
<td>41.3</td>
<td>21.6</td>
</tr>
</tbody>
</table>

Stay vs.

<table>
<thead>
<tr>
<th>Leave</th>
<th>Undecided</th>
</tr>
</thead>
<tbody>
<tr>
<td>( \beta )</td>
<td>SE</td>
</tr>
<tr>
<td>Intercept</td>
<td>-0.08</td>
</tr>
<tr>
<td>Years in Military</td>
<td>1.00</td>
</tr>
<tr>
<td>Junior-enlisted</td>
<td>-1.10</td>
</tr>
</tbody>
</table>

• Multinomial Logistic Regression (MLR) correctly predicted 60.2% of the cases, \( \text{Model } \chi^2 \) (10, \( N=289 \)) = 74.50, \( \text{GF } \chi^2 = 161.5, p=.50 \), Nagelkerke \( \text{Pseudo } R^2 = .27 \), with the significant predictors being years in the military \( \chi^2 (2, N=289) = 29.93 \) and rank \( \chi^2 (2, N=289) = 10.39 \).

• Soldiers who had been in the military longer and were junior-enlisted reported that were staying (vs. leaving and undecided).

CHAID - Predictions Correct

<table>
<thead>
<tr>
<th>Stay</th>
<th>Undecided</th>
<th>Leave</th>
</tr>
</thead>
<tbody>
<tr>
<td>52.6%</td>
<td>0%</td>
<td>88.2%</td>
</tr>
</tbody>
</table>

* "Age" and "Education" were not entered into the Multinomial Logistic Regression because of multicollinearity (with Years in Military).

MLR - Predictions Correct

<table>
<thead>
<tr>
<th>Stay</th>
<th>Undecided</th>
<th>Leave</th>
</tr>
</thead>
<tbody>
<tr>
<td>59.6%</td>
<td>5.6%</td>
<td>83.2%</td>
</tr>
</tbody>
</table>

18 April 2001
U.S. Army Medical Research Unit-Europe, Walter Reed Army Institute of Research, U.S. Army Medical Research and Materiel Command
Results: Work Climate

**Work Climate measures entered into the equation:**
- Recognition
- Job Challenge
- Work Intensity
- Goal Acceptance
- Job Control
- Job Satisfaction
- Task Significance
- Soldier Pride

**CHAID analyses showed that 58.1% of the cases were predicted correctly by the work climate variables.**

**Career Intentions**

<table>
<thead>
<tr>
<th>Low Soldier Pride</th>
<th>High Soldier Pride</th>
</tr>
</thead>
<tbody>
<tr>
<td>Stay</td>
<td>Stay</td>
</tr>
<tr>
<td>18.6</td>
<td>51.1</td>
</tr>
<tr>
<td>Undecided</td>
<td>Undecided</td>
</tr>
<tr>
<td>19.2</td>
<td>20.3</td>
</tr>
<tr>
<td>Leave</td>
<td>Leave</td>
</tr>
<tr>
<td>62.2</td>
<td>28.6</td>
</tr>
</tbody>
</table>

**Low Job Satisfaction**
<table>
<thead>
<tr>
<th>Low Job Satisfaction</th>
<th>Stay</th>
<th>Undecided</th>
<th>Leave</th>
</tr>
</thead>
<tbody>
<tr>
<td>Stay</td>
<td>38.5</td>
<td>0</td>
<td>61.5</td>
</tr>
<tr>
<td>Undecided</td>
<td></td>
<td>0</td>
<td></td>
</tr>
<tr>
<td>Leave</td>
<td></td>
<td>61.5</td>
<td></td>
</tr>
</tbody>
</table>

**Medium Job Satisfaction**
<table>
<thead>
<tr>
<th>Medium Job Satisfaction</th>
<th>Stay</th>
<th>Undecided</th>
<th>Leave</th>
</tr>
</thead>
<tbody>
<tr>
<td>Stay</td>
<td>40.0</td>
<td>31.0</td>
<td>29.3</td>
</tr>
<tr>
<td>Undecided</td>
<td></td>
<td>14.5</td>
<td>21.0</td>
</tr>
</tbody>
</table>

**High Job Satisfaction**
<table>
<thead>
<tr>
<th>High Job Satisfaction</th>
<th>Stay</th>
<th>Undecided</th>
<th>Leave</th>
</tr>
</thead>
<tbody>
<tr>
<td>Stay</td>
<td>64.5</td>
<td>14.5</td>
<td>21.0</td>
</tr>
</tbody>
</table>

**CHAID - Predictions Correct**
- Stay 53.0%
- Undecided 0%
- Leave 62.1%

**MLR - Predictions Correct**
- Stay 67.6%
- Undecided 0%
- Leave 77.6%

**Multinomial Logistic Regression (MLR) correctly predicted 61.5% of the cases, Model $\chi^2 (16, N=289) = 51.32$, $GF (\chi^2 = 312.5, p=.82)$, *N*egelkerke *P*seudo $R^2 = .29$, with the only significant predictor being soldier pride, Model $\chi^2 (2, N=289) = 9.23$.**

**Stay vs. Leave**

<table>
<thead>
<tr>
<th></th>
<th>$\beta$</th>
<th>SE</th>
</tr>
</thead>
<tbody>
<tr>
<td>Intercept</td>
<td>-.42</td>
<td>.21</td>
</tr>
<tr>
<td>Soldier Pride</td>
<td>1.0</td>
<td>.35</td>
</tr>
</tbody>
</table>

**Soldiers who had higher levels of soldier pride were more likely to stay (vs. leave).**

18 April 2001

U.S. Army Medical Research Unit-Europe, Walter Reed Army Institute of Research,
U.S. Army Medical Research and Materiel Command
Results: Leadership

Leadership Measures entered into the equation:
- Horizontal Cohesion
- General Leadership
- NCO Leadership
- Officer Leadership

- CHAID analyses showed that 47.8% of the cases were predicted correctly by leadership variables.

Career Intentions

<table>
<thead>
<tr>
<th>Low NCO Leadership</th>
<th>High NCO Leadership</th>
</tr>
</thead>
<tbody>
<tr>
<td>Stay</td>
<td>13.9</td>
</tr>
<tr>
<td>Undecided</td>
<td>15.3</td>
</tr>
<tr>
<td>Leave</td>
<td>70.8</td>
</tr>
<tr>
<td>Stay</td>
<td>40.1</td>
</tr>
<tr>
<td>Undecided</td>
<td>21.2</td>
</tr>
<tr>
<td>Leave</td>
<td>38.7</td>
</tr>
</tbody>
</table>

Low Leadership Quality
- Stay 3.2
- Undecided 29.0
- Leave 67.7

High Leadership Quality
- Stay 22.0
- Undecided 4.9
- Leave 73.2

- Multinomial Logistic Regression correctly predicted 51.9% of the cases, Model $\chi^2 (10, N=289) = 33.76$, $GF (\chi^2 = 537.1, p=.46)$, Nagelkerke Pseudo $R^2 = .13$, with the only predictor being NCO leadership Model $\chi^2 (2, N=289) = 11.18$.

<table>
<thead>
<tr>
<th>Stay vs. Leave</th>
<th>Stay vs. Undecided</th>
<th>Leave vs. Undecided</th>
</tr>
</thead>
<tbody>
<tr>
<td>$\beta$</td>
<td>$SE$</td>
<td>$\beta$</td>
</tr>
<tr>
<td>-.38</td>
<td>.14</td>
<td>-.85</td>
</tr>
<tr>
<td>.16</td>
<td>.85</td>
<td>.85</td>
</tr>
</tbody>
</table>

NCO Leadership

- Soldiers who rated their NCO leadership higher were more likely to stay (vs. leave).

CHAID - Predictions Correct
- Stay 90.0% Undecided 0% Leave 37.8%

MLR - Predictions Correct
- Stay 52.6% Undecided 0% Leave 73.3%

U.S. Army Medical Research Unit-Europe, Walter Reed Army Institute of Research,
U.S. Army Medical Research and Materiel Command
Results: Family

Family Measures entered into the equation:
- Families with Special Needs*
- Number of Children
- Work-Family Conflict
- Family-Work Conflict
- Marital Status

• CHAID analyses showed that 49.1% of the cases were predicted correctly by family variables.

• Multinomial Logistic Regression correctly predicted 53.3% of the cases, Model $\chi^2 (10, N=289) = 20.34$. GF ($\chi^2 = 373.7$, $p = .19$), Nagelkerke Pseudo $R^2 = .08$. Significant predictors were marital status Model $\chi^2 (2, N=289) = 4.87$, $p = .09$, and work-family conflict Model $\chi^2 (2, N=289) = 4.96$, $p = .08$.

• Soldiers who were married and/or had less work-family conflict were more likely to stay (vs. leave).

<table>
<thead>
<tr>
<th>Career Intentions</th>
<th>Stay vs. Leave</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>$\beta$</td>
</tr>
<tr>
<td>Single</td>
<td></td>
</tr>
<tr>
<td>Stay</td>
<td>25.5</td>
</tr>
<tr>
<td>Undecided</td>
<td>20.4</td>
</tr>
<tr>
<td>Leave</td>
<td>54.1</td>
</tr>
<tr>
<td>Married</td>
<td></td>
</tr>
<tr>
<td>Stay</td>
<td>43.2</td>
</tr>
<tr>
<td>Undecided</td>
<td>18.9</td>
</tr>
<tr>
<td>Leave</td>
<td>37.9</td>
</tr>
</tbody>
</table>

### CHAID - Predictions Correct

<table>
<thead>
<tr>
<th>Stay</th>
<th>Undecided</th>
<th>Leave</th>
</tr>
</thead>
<tbody>
<tr>
<td>58.8%</td>
<td>0%</td>
<td>63.0%</td>
</tr>
</tbody>
</table>

* “Families with Special Needs” was not entered into the Multinomial Logistic Regression because of multicollinearity (with marital status).

### MLR - Predictions Correct

<table>
<thead>
<tr>
<th>Stay</th>
<th>Undecided</th>
<th>Leave</th>
</tr>
</thead>
<tbody>
<tr>
<td>47.9%</td>
<td>0%</td>
<td>79.9%</td>
</tr>
</tbody>
</table>
Variables entered into the equation:
- Deployment Experience
- Years in Military
- Soldier Pride
- Job Satisfaction
- NCO Leadership
- General Leadership Quality
- Marital Status

- Significant moderator variables from each category and significant OPTEMPO variables were entered into one CHAID equation.
- This was the best CHAID model, achieving an overall accuracy of 62.3%.

Career Intentions

<table>
<thead>
<tr>
<th>0 - 2 Years in Military</th>
<th>3 - 6 years in Military</th>
<th>7+ Years in Military</th>
</tr>
</thead>
<tbody>
<tr>
<td>Stay</td>
<td>14.8</td>
<td>32.5</td>
</tr>
<tr>
<td>Undecided</td>
<td>21.5</td>
<td>26.3</td>
</tr>
<tr>
<td>Leave</td>
<td>63.7</td>
<td>41.3</td>
</tr>
</tbody>
</table>

<table>
<thead>
<tr>
<th>Never Deployed</th>
<th>Deployment Experience</th>
<th>Low Job Satisfaction</th>
<th>High Job Satisfaction</th>
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<td>14.1</td>
<td>20.0</td>
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<td>12.7</td>
<td>31.0</td>
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<tr>
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<td>73.2</td>
<td>48.3</td>
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<table>
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<tr>
<th>CHAID - Predictions Correct</th>
</tr>
</thead>
<tbody>
<tr>
<td>Stay</td>
</tr>
</tbody>
</table>

18 April 2001
U.S. Army Medical Research Unit-Europe, Walter Reed Army Institute of Research,
U.S. Army Medical Research and Materiel Command
MLR Integrated Model (1 of 2)

- Using the Stressor-Strain Model as a framework, we entered all the OPTEMPO measures and the significant moderator variables that were also in the CHAID integrated model into a Multinomial Logistic Regression equation.

MODERATORS
- Demographics
  - Years in Military
- Leadership
  - NCO Leadership
  - General Leadership Quality
- Family
  - Marital Status
- Work Climate
  - Soldier Pride
  - Job Satisfaction

STRESSORS
- Deployment Experience

OUTCOME
- Retention
MLR Integrated Model (2 of 2)

- Deployment experience, Model $\chi^2 (2, N=289) = 4.96, p = .08$, moderated by years in service, Model $\chi^2 (14, N=289) = 32.50$, and level of soldier pride Model $\chi^2 (14, N=289) = 9.83$, predicted retention.

- Using these variables in the equation, Multinomial Logistic Regression correctly predicted 63.1% of the cases Model $\chi^2 (14, N=289) = 108.31$. GF ($\chi^2 = 486.5$, $p = .98$), Nagelkerke Pseudo $R^2 = .36$.

MODERATORS

- Demographic: Years in the Military**
- Work Climate: Soldier Pride**

OPTEMOPO STRESSOR

- Deployment Experience$^1$

OUTCOME STRAIN

Retention

Multinomial Logistic Regression - Predictions Correct

<table>
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<tr>
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<tr>
<td>$^1p$</td>
<td>.08</td>
<td></td>
<td></td>
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<tr>
<td>$^{**}p &lt; .05$</td>
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</table>

U.S. Army Medical Research Unit-Europe, Walter Reed Army Institute of Research, U.S. Army Medical Research and Materiel Command

18 April 2001
Building the Stressor-Strain Model

Demographics
- Years in Military
- Ethnicity
- Gender
- Education
- Rank
- Age

• Model $\chi^2 (38, N=289) = 120.90$. GF ($\chi^2$ =454.3, $p=.97$),
  Negelkerke Pseudo $R^2=.40$.

Leadership
- Horizontal Cohesion
- NCO Leadership
- Officer Leadership
- General Leadership Quality
- Morale

• Model $\chi^2 (58, N=289) = 88.7$. GF ($\chi^2$ =494.9, $p=.58$),
  Negelkerke Pseudo $R^2=.31$.

Family
- Families with Special Needs
- Number of Children
- Marital Status
- Work-Family Conflict
- Family-Work Conflict

• Model $\chi^2 (10, N=289) = 20.8$. GF ($\chi^2$ =403.7, $p=.21$),
  Negelkerke Pseudo $R^2=.08$.

Work Climate
- Recognition
- Job Challenge
- Work Intensity
- Goal Acceptance
- Job Control
- Job Satisfaction
- Task Significance
- Soldier Pride

• Model $\chi^2 (78, N=289) = 140.5$. GF ($\chi^2$ =209.5, $p=.99$),
  Negelkerke Pseudo $R^2=.64$.
MLR Models: Work Climate & OPTEMPO

- The best predictive model consisted of OPTEMPO measures and their interactions with work climate variables, with 75.1% of the cases correctly predicted, \( Model \chi^2 (78, N=289) = 140.5, GF (\chi^2 = 209.5, p=.99), \) Nagelkerke Pseudo \( R^2 = .64. \)

### Moderators
- Recognition
- Job Challenge
- Work Intensity
- Goal Acceptance
- Job Control
- Job Satisfaction
- Soldier Pride*
- Task Significance

### Interactions
- Deployment Experience X Goal Acceptance*
- Hours Worked X Goal Acceptance*
- Deployment Experience X Job Control*
- Days TDY X Soldier Pride*
- Days TDY X Work Intensity*
- Hours worked X Job Recognition*

### Stressor
- Work Hours*
- Days on Temporary Duty
- Deployment Experience*
- Days on Training Exercises

* \( p < .05 \)

### Outcome
Retention

#### Multinomial Logistic Regression - Predictions Correct

<table>
<thead>
<tr>
<th></th>
<th>Stay</th>
<th>Undecided</th>
<th>Leave</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>76.6%</td>
<td>44.4%</td>
<td>84.1%</td>
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</tbody>
</table>

18 April 2001
U.S. Army Medical Research Unit-Europe, Walter Reed Army Institute of Research, U.S. Army Medical Research and Materiel Command
Discussion

- The career intention of soldiers who plan to leave or stay in the U.S. military can be fairly accurately modeled.

- The career intentions of undecided soldiers, however, are difficult to predict.

- Although the CHAID models are simpler than Multinomial Logistic Regression (MLR) models in that they contain fewer variables, the MLR models provide more accurate predictions.

<table>
<thead>
<tr>
<th></th>
<th># of Variables</th>
<th>Overall Accuracy</th>
<th>S-U-L</th>
<th># of Interactions</th>
<th>Pseudo r²</th>
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<td>MLR</td>
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<td>75.1</td>
<td>76.6-44.4-84.1</td>
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<td>62.3</td>
<td>67.0-00.0-89.2</td>
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</table>

- Omitted from this analysis are other important factors such as civilian economic conditions and job opportunities, and unavoidable factors that impact retention (such as military separations due to medical conditions, indiscipline, etc.).
References (1 of 2)


Backup Slides: Scales
Scale Items (1 of 5)

Leadership

Vertical Cohesion (Officers) - Marlowe et al. (1985); Vaitkus (1994); see also Bliese and Halverson (1996).
The officers in my unit establish clear work objectives.
The officers in my unit avoid micromanaging soldiers’ work.
The officers in my unit delegate work effectively.
The officers in my unit let soldiers know when they have done a good job.
The officers in my unit are interested in my personal welfare.
The officers in my unit are interested in what I think and how I feel about things.

Vertical Cohesion (NCOs) - Marlowe et al. (1985); Vaitkus (1994); see also Bliese and Halverson (1996).
The NCOs in my unit establish clear work objectives.
The NCOs in my unit avoid micromanaging soldiers’ work.
The NCOs in my unit delegate work effectively.
The NCOs in my unit let soldiers know when they have done a good job.
The NCOs in my unit are interested in my personal welfare.
The NCOs in my unit are interested in what I think and how I feel about things.

Horizontal cohesion - adapted from Podsakoff and MacKenzie (1994).
The members of my unit are cooperative with each other.
The members of my unit know that they can depend on each other.
The members of my unit stand up for each other.
Scale Items (2 of 5)

Leadership (cont)

General Leadership Quality — Marlowe et al. (1985); Vaitkus (1994).
The leaders in this company would lead well in combat.
I am impressed by the quality of leadership in this company.
My chain of command works well.

Morale
Your personal morale
Morale in your unit
Cohesion in your unit
Scale Items (3 of 5)

Work Climate (cont)

Recognition — Brown and Leigh (1996)
I rarely feel my work is taken for granted.
My superiors generally appreciate the way I do my job.
The organization recognizes the significance of the contributions I make.

Challenge — Brown and Leigh (1996)
My job is very challenging.
It takes all my resources to achieve my work objectives.

Goal Acceptance — Adapted from Goal Acceptance concepts (Podsakoff, Mackenzie, & Ahearne, 1997).
The soldiers in my unit think that what’s expected of us is clear.
The soldiers in my unit think that what’s expected of us is reasonable.

Job Satisfaction — adapted from the Job Diagnostic Survey General Satisfaction Scale (Hackman & Oldham, 1975).
I am very satisfied with my job in the Army.
I like my job in the Army.
I am satisfied with the kind of work I do on my job.

Job Control — adapted from the Job Diagnostic Survey General Satisfaction Scale (Hackman & Oldham, 1975).
I have personal control over my job performance.
Once I am given instructions, I am pretty much left alone to do my job.
I am allowed to do my job without constant supervision from others.
Scale Items (4 of 5)

Work Climate (cont)

I feel that what I am doing is important for accomplishing my unit’s mission.
I am making a real contribution to accomplishing my unit’s mission.
What I do helps accomplish my unit’s mission.

Soldier Pride — adapted from the Military Self-Esteem Scale (Marlowe et al., 1985; Vaitkus, 1994).
I am proud to be in the U.S. Army.
I am an important part of my company.
What I do in the army is worthwhile.

Work Intensity — Shortened scale from 5-item Brown & Leigh, 1996. Full scale has reliability of .82-.83.
I work at my full capacity in all of my job duties.
I strive as hard as I can to be successful in my work.
When I work, I really exert myself to the fullest.
Scale Items (5 of 5)

Family Issues

The demands of work interfere with my home and family life.
The amount of time my job takes up makes it difficult to fulfill family responsibilities.
Things I want to do at home do not get done because of the demands of my job puts on me.
My job produces strain that makes it difficult to fulfill family duties.
Due to work-related duties, I have to make changes to my plans for family activities.

The demands of my family or spouse/partner interfere with work related activities.
I have to put off doing things at work because of demands on my time at home.
Things I want to do at work do no get done because of the demands of my family or spouse/partner.
My home life interferes with my responsibilities at work such as getting to work on time, accomplishing daily tasks and working overtime.
Family-related strain interferes with my ability to perform job-related duties.