Assessing Later Survey Response Based on Past Survey Completion

Ada Harris FedCASIC Workshop



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Office of People Analytics

• Established October 1, 2016

Transitioned from Defense Manpower Data Center (DMDC):

- Marketing research and outreach
- Cognitive and non cognitive testing
- Personnel surveys and related research
- Personnel security research

Provide research and analytical solutions to effectively align Total Force management programs and policies

Nonresponse Bias Analyses

- **1.** Evaluated composition of sample compared to respondents
- 2. Compared estimates to known population totals
- **3.** Analyzed frequency of item missing data
- 4. Analyze later survey response

Response Rates from Active Duty Surveys

| | 2014 | 2013 | 2012 | 2011 |
|--------------|------|------|------|------|
| Total | 21% | 24% | 26% | 20% |
| Service | | | | |
| Army | 19% | 22% | 20% | 16% |
| Navy | 21% | 22% | 27% | 20% |
| Marine Corps | 15% | 17% | 21% | 15% |
| Air Force | 29% | 36% | 37% | 30% |
| Paygrade | | | | |
| E1-E4 | 9% | 11% | 9% | 12% |
| E5-E9 | 27% | 31% | 31% | 32% |
| W1-W5 | 37% | 42% | 38% | 29% |
| 01-03 | 32% | 36% | 38% | 28% |
| 04-06 | 48% | 51% | 54% | 44% |

Research Objective

- Examine current survey response using prior satisfaction and retention.
- Assess 'survey takers' vs. 'survey avoiders'
- OPA noted that as members were sampled in subsequent surveys, they became more likely that they would answer at least one.

| Number of Surveys Sampled in | Sampled Count | Respondents to = Zero | Respondents to >= One | Respondents to >= Two | Respondents to >= Three | Respondents to = Four |
|---------------------------------|---------------|--------------------------|--------------------------|--------------------------|----------------------------|--------------------------|
| One | 237,316 | 184,975 (78%) | 52,341 (22%) | - | - | - |
| Тwo | 16,173 | 10,237 (63%) | 5,936 (37%) | 2,032 (34%) | - | - |
| Three | 860 | 423 (50%) | 437 (50%) | 244 (56%) | 85 (35%) | - |
| Four | 25 | 6 (24%) | 19 (76%) | 12 (63%) | 8 (66%) | 2 (25%) |

Active Duty Sample Design

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- Annual Cross-Sectional survey (sample size about 70,000 per year) – 2011, 2012, 2013, 2014
- Target population Active duty Army, Navy, Marine Corps, and Air Force
- Single-stage stratified design (Service, Paygrade, Race, Duty Location, and Family Status)

Research Design

 Determine the number of members that were sampled in one, two, three or all four surveys

- Officers are more likely to be repetitively sampled than enlisted because of necessary domain estimates and fewer military officers
- 20.5% of members sampled three-times are O-3, 6.8% are E-3

• 4,414 sample members responded to a prior survey and were sampled in a later iteration of the survey.

| Completed Survey | Sampled in 2014 | Sampled in 2013 | Sampled in 2012 | |
|------------------|-----------------|-----------------|-----------------|--|
| 2013 | 1,042 (24%) | - | - | |
| 2012 | 632 (14%) | 1,060 (24%) | - | |
| 2011 | 534 (12%) | 833 (19%) | 704 (16%) | |

Weighting

- Created research weights for the analysis
- Post-stratification cells were defined by the cross-classification of paygrade and Service at final iteration of the survey the member was sampled
 - Members service mostly remained (99%) the same from survey iterations
 - Members paygrade mostly remained (93%) the same from survey iterations

The final weights were adjusted to match population counts for 2014.

Methods

Survey response at later survey sampling

- 1= responded to later survey (54%)
- 0=did not respond to later survey (47%)
- Dataset was split into training and validation data (70% training and 30% validation)

Use Logistic Regression and Naïve Bayes to model response on later survey

- Satisfaction/Retention (observed from prior survey)
- Service
- Family Status
- -Race
- Gender
- Martial Status
- Years of Service

Methods

Log Loss function

- Log-loss is an appropriate performance measure when model output is the probability of a binary outcome.
- The log-loss measure considers confidence of the prediction when assessing how to penalize incorrect classification.

Satisfaction

- Naïve Bayes 0.677
- Logistic Regression -0.679

Retention

- Naïve Bayes -0.71
- Logistic Regression -0.691

• Naïve Bayes Final Model – the whole dataset is used

Results

Conditional Probabilities

| Satisfaction | | | | | | |
|--------------|----------------------|--------------|---------|-----------|----------------|--|
| | Very dissatisfied | Dissatisfied | Neither | Satisfied | Very satisfied | |
| Nonresponse | 0.02 | 0.08 | 0.16 | 0.52 | 0.22 | |
| Response | 0.01 | 0.06 | 0.11 | 0.59 | 0.26 | |

| Retention | | | | | | |
|-------------|---------------|----------|---------|--------|-------------|--|
| | Very unlikely | Unlikely | Neither | Likely | Very likely | |
| Nonresponse | 0.06 | 0.10 | 0.11 | 0.30 | 0.43 | |
| Response | 0.03 | 0.07 | 0.11 | 0.33 | 0.46 | |







- Number of times a member is sampled across iterations
 - Response burden may be high for officers
- Takes advantage of prior survey information that can inform types of respondents
- Prior satisfaction and retention show little difference between response and nonresponse on later survey

• Question?

Next Steps

- Cross-Validation
- Weighting strategies for combining cross-sectional surveys
- Improve Machine Learning techniques
- Investigate additional variables to model to describe likely respondents

Thank You

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