Classifying Federal Contracting Notices

Arnob L. Alam

Overview

- The Federal Government posts more than 1,200 notices a day relating to contracting opportunities
- The notices are of several types
 - Sources Sought: the government is seeking a list of suppliers who can provide particular goods or services
 - > Presolicitation: the government intends to solicit bids for goods or services in the future
 - Solicitation: the government is actively accepting bids for goods or services
 - Award: the government has awarded contract(s)
 - Sole Source/Justification & Approval: the government has awarded a contract without competitive bidding
 - > Cancellation: cancellation of a previous presolicitation or solicitation
 - Modification/Amendment: modification or amendment to an existing notice
 - > Special: Events, seminars, change of acquisition procedures or other special notices
 - Other: (Intent to Bundle Requirements, Sale of Surplus Property, Foreign Government Standard, Fair Opportunity/Limited Sources Justification)

1560-015919298, PLATE, STF Solicitation Number: SPEA4516R0 Agency: Defense Logistics Agency Office: DLA Acquisition Locations Location: DLA Aviation - BSM		CANCELLATION OF RFQ Solicitation Number: HTC711-15-Q-J-002 Agency: Other Defense Agencies Office: United States Transportation Command	Annual Maintenance for Boeing Twister, Spatial Query Server, and Datamaster Software Solicitation Number: 15T4943 Agency: Other Defense Agencies Office: National Geospatial-Intelligence Agency	
Presolicitation	September 9, 2015	Location: USTRANSCOM Command Acquisition	Location: OCSW- GEOINT/Enterprise Operations	
Response Date: Oct 28, 2015 3:00 pm Eastern Archive Date: November 10, 2015	Archiving Policy: Automatic, 15 days after response date Original Set Aside: NIA	Notice Type: Special Notice	Notice Type: Posted Date: Combined Synopsis/Solicitation. September 9, 2015 Response Date: Archiving Policy:	
Set Aside: N/A		Posted Date: August 27, 2015	Sep 14, 2015 11:00 am Central Manual Archive Archive Date: Original Set Aside:	
Classification Code: 15 Aircraft & airframe structural components		Response Date:	- N/A Set Aside:	
NAICS Code: 336 – Transportation Equipment Manufacturing/336413 – Other Aircraft Parts and Auxiliary Equipment Manufacturing		Archiving Policy: Automatic, on specified date	NA Classification Code: 70 General purpose information technology equipment	
Synopsis: Added Sep 09, 2015 11:34 am This solicitation will contain NSN 1560-015919288 for a PLATE STRUCTURAL AI. A Letter Request for Proposal (RFF) will be issued for award of a firm fund price contract. This is a sole sourced item and must be acquired from an approved manufacturer. The CBM and sole approved source is Beologic, ACRE 2019, RN 6-83073-40. The quantity is as follows: 4 each FOB: Origin inspection/Acceptance: Origin based on the Basic Order Agreement. Delivery: 182 ORAC The final contract award decision may be based upon a combination of price, past performance, and other evaluation factors as described in the solicitation. The solicitation issue date is on or about September 24, 2015 in accordance with 10 U.S. C. 2024 (c) (1), other than full and open competition applies. The proposed contract action is for supplies or services for which the Government intends to solicit and negotate with only one source under the authority of FAR 8.342. Interested persons may defently their interest and capability to respond to the requirement or submit proposals. This notice of inserting is not a request for competitive proposals. However, all proposals received within thirty days after date of publication of this synopsis will be considered by the Covernment of Adeemination by the Covernment not compete with this proposal contract based upon responses to this notice is solely within the dispersion of the Government Information received will normally be considered by by the purpose of determining whether to conduct a competitive procurement at Award will be made only if the offeror, the productiventice or the manufacturer meets qualification requirement at meet of award, in accordance with FAR clause 8 2004 or 15 2002 – Places contact the Adjustion Specialist for		Archive Date: September 3, 2015	NAICS Code: 511 Publishing Industries (except Internet)/511210 Software Publishers	
		Original Set Aside: N/A Set Aside:	Synopsis: Acided: Sep 09, 2015 11:16 am National Geospatial Intelligence Agency Request for Quote (RFQ) The National Geospatial Intelligence Agency (NGA) has a requirement as detailed below:	
		N/A	This is a combined synopsis/solicitation for Maintenance on Boeing Software as detailed in the table below	
		Classification Code: 84 Clothing, individual equipment & insignia	prepared in accordance with the format in FAR subpart 12.0 and FAR part 13, as supplemented with additional information included in this notice. This announcement constitutes the only solicitation: quotes are being requested and a written solicitation will not be issued. The North American Industry Classification System (NAICS)	
		NAICS Code: 315 Apparel Manufacturing/315990 Apparel Accessories and Other Apparel Manufacturing	code for this acquisition is 511210 and the size standard is \$38.5M.	
additional information at Virginia Bangit@dia. mil tet: (ধ	804) 279-2072; fax: (804)279-4949.	Synopsis: Added: Aug 27, 2015 1:18 pm CANCELLATION NOTICE OF RFQ HTC711-15-Q-J002 BRAND NAME CRYE PRECISION PPE FOR JECCJPASE.	Part Number Software Title City PoP TDF-10N-LC TWISTER DATA FRAMEWORK 1.7-1-2015 - 6-30-2018 TS-SQS-WP-I-S XQS NAMED USER WORKPLACE 775.7-1-2015 - 6-30-2016 TS-SQS-WP-I-S XQS NAMED USER WORKPLACE 775.7-1-2015 - 6-30-2016 TS-SQS-E-S XQS NAMED USER WORKPLACE 775.7-1-2015 - 6-30-2016 TS-SQS-E-FL-S XQS COCURRENT USER ENTERPRISE 50.7-1-2015 - 6-30-2016 TS-SQS-E-S XQS SERVER ENTERPRISE 123.7-1-2015 - 6-30-2016 TS-SQS-E-S XQS XMED USER ENTERPRISE 203.7-1-2015 - 6-30-2016	
Contracting Office Address: 8000 Jeffeson Davis Highway Richmond, Viging 32907-8000 United States Place of Performance: Defense Logistics Agency Richmond 8000 Jeffeson Davis Highway Richmond, Viging 32907		THIS RFQ IS CANCELLED IF YOU HAVE ANY QUESTIONS PLEASE FEEL FREE TO CONTACT THE CONTRACTING OFFICER	TS-SGS-E-IL-S SGS CONCIRRENT USER ENTERPRISE 534-7-1-2015 -6-30-2016 TS-DATA-24 15- DATAMASTER WORKSTATION MAINTENANCE - WINDOWS 91 4-1-2015 -3-31-2016 TS-DATA-DEVCL DATAMASTER COMMAND LINE MAINTENANCE - UNIX 14 4-1-2015 -3-31-2016 TS-DATA-901 DATAMASTER WORKSTATION MAINTENANCE - UNIX 13 4-1-2015 -3-31-2016	
		(arlene.y.davis.civ@mail.mil) Contracting Office Address:	TS-DATA-14 5-14 DATAMASTER WORKSTATION MAINTENANCE - WINDOWS 9 4-1-2015 - 3-31-2016 TS-DATA-24 REINSTATEMENT OF 15+ DATAMASTER WORKSTATION MAINTENANCE - WINDOWS 127 1-1-2015 - 6-30-2015 TS-DATA-24 15+ DATAMASTER WORKSTATION MAINTENANCE - WINDOWS 127 7-1-2015 - 6-30-2016	
United States Primary Point of Contact.: Virginia Bangit		508 Scott Drive Bldg 1900 Scott AFB, Illinois 62225	Period of performance: 1 Jan 2015 - 30 Jun 2016.	
virginia bangit@dla.mil Phone: 8042792072 Secondary Point of Contact: Brittany C, Gull,		United States Primary Point of Contact.: Arlene Y. Davis	This is a request for quote for the items listed above. NGA intends to select awardee on a brand name basis for the required items. You must be the manufacturer or authorized reseller of the Boeing Software listed above in order to respond to this RFQ. This notice is a request for competitive proposals. The Government reserves the right to cancel this solicitation, with no obligation to the vendor by the Government.	
Acquisition Specialist Britany.Gull@dia.mil Phone: 8042794390 Fax: 8042796887		ariene y davis civ@mail.mil Phone: 7578369889	Maintenance shall include bug fixes, patches, and technical support.	
Opportunity History Original Synopsis Sep 09, 2015 11:34 am		Opportunity History Original Synopsis Aug 27, 2015 1:18 pm	Firesponding as a large business for NAICS code 511210, please submit a copy of your subcontracting plan or a letter stating no small business subcontracting possibilities exist for this requirement. If any interested party is capable of fulfilling all of NAS's requirements, please explain in a two-page capability statement submitted to Doug Verseman at Douglas H Verseman@nga mil by 11 SEP 2015 11.00 am Central Time.	

The challenge

- We would like to classify a project (a collection of notices relating to a single acquisition effort) into one of several states
 - Presolicitation/Sources Sought
 - Open for bidding
 - Awarded
 - Cancelled
- First attempt: Just look at the notice type, and classify accordingly
 - Issue: notice types are not being used correctly



Archive Date:

Manufacturing

Synonsis: Added: Sep 09, 2015 11:34 am

United States

Virginia Bangit

Place of Performance:

Richmond, Virginia 23297 United States

Primary Point of Contact.:

virginia.bangit@dla.mil

Phone: 8042792072 Secondary Point of Contact Brittany C. Gull.

Acquisition Specialist

Brittany.Gull@dla.mil

Phone: 8042794390 Fax: 8042798687

Defense Logistics Agency Richmond

8000 Jefferson Davis Highway

Set Aside: N/A

November 10, 2015

Classification Code:

Archiving Policy: Automatic, 15 days after response date Original Set Aside: NI/A

15 - Aircraft & airframe structural components 336 -- Transportation Equipment Manufacturing/336413 -- Other Aircraft Parts and Auxiliary Equipment

This solicitation will contain NSN 1560-015919298 for a PLATE, STRUCTURAL, AL. A Letter Request for Proposal (RFP) will be issued for award of a firm fixed price contract. This is a sole sourced item and must be acquired from an approved manufacturer. The OEM and sole approved source is Boeing. CAGE 82918, P/N: 5-83073-49. The quantity is as follows: 4 each. FOB: Origin; Inspection/Acceptance: Origin based on the Basic Order Agreement. Delivery: 182 DARO. The final contract award decision may be based upon a combination of price, past

performance, and other evaluation factors as described in the solicitation. The solicitation issue date is on or about September 24, 2015; In accordance with 10 U. S. C. 2304 (c) (1), other than full and open competition applies.

The proposed contract action is for supplies or services for which the Government intends to solicit and negotiate with only one source under the authority of FAR 6.302. Interested persons may identify their interest and capability to respond to the requirement or submit proposals. This notice of intent is not a request for competitive proposals. However, all proposals received within thirty days after date of publication of this synopsis will be considered by the to this notice is solely within the discretion of the Government. Information received will normally be considered solely for the purpose of determining whether to conduct a competitive procurement. Award will be made only if the offeror, the product/service or the manufacturer meets qualification requirement at

Government. A determination by the Government not to compete with this proposed contract based upon responses time of award, in accordance with FAR clause 52.209-1 or 52.209-2. Please contact the Acquisition Specialist for additional information at Virginia.Bangit@dla.mil tel: (804) 279-2072, fax: (804)279-4949

Contracting Office Address: 8000 Jefferson Davis Highway Richmond, Virginia 23297-5000

Set Aside: N/A

NAICS Code:

Synopsis:

Notice Type:

Special Notice

Posted Date: August 27, 2015

Response Date:

Archiving Policy:

Original Set Aside: N/A Classification Code:

Added: Aug 27, 2015 1:18 pm

(arlene y.davis.civ@mail.mil)

Contracting Office Address:

Scott AFB. Illinois 62225

Primary Point of Contact.:

arlene.v.davis.civ@mail.mil

508 Scott Drive

United States

Arlene Y. Davis

Phone: 7578369889

Opportunity History

Aug 27, 2015

1:18 pm

Original Synopsis

Blda 1900

FOR JECC/JPASE. THIS RFQ IS CANCELLED

Archive Date: September 3, 2015

84 -- Clothing, individual equipment & insignia

Automatic, on specified date

315 -- Apparel Manufacturing/315990 -- Apparel Accessories and Other Apparel Manufacturing

CANCELLATION NOTICE OF REQ HTC711-15-Q-J002 BRAND NAME CRYE PRECISION PPE

IF YOU HAVE ANY QUESTIONS PLEASE FEEL FREE TO CONTACT THE CONTRACTING OFFICER

CANCELLATION OF RFQ

Agency: Other Defense Agencies Office: United States Transportation Command

Solicitation Number: HTC711-15-Q-J-002

Location: USTRANSCOM Command Acquisition











The challenge

- Second Attempt: hard coded rule
 - If the notice title, synopsis or filenames of attachments contain certain keywords (e.g. "cancel", "FAR PART 6.3", "sole source", etc. classify accordingly)
 - Issue: boilerplate text/legalese

8. "Notice to Offeror(s)/Supplier(s): Funds are not presently available for this effort. No award will be made under this solicitation until funds are available. The Government reserves the right to cancel this solicitation, either before or after the closing date. In the event the Government cancels this solicitation, the Government has no obligation to reimburse an offeror for any costs." If funding is not available by 30 Sep 15 the solicitation will be cancelled. An award prior to 30 Sep 15 would require the contractor to begin performance within 90 days of award date in order to meet Bona Fide Need.

From a presolicitation

All future information regarding this acquisition, including the solicitation and any amendments, will be distributed solely through the FedBizOpps website (www.fbo.gov). Copies of the solicitation document and its related documents, as appropriate, will be posted at this website. Interested parties are responsible for monitoring the FedBizOpps website to assure that they have the most up-to-date information regarding this acquisition. The Government will not reimburse

From another presolicitation (we were stemming words so "solely" would become sole)

Machine Learning Approach

How does a human look at this notice?

- Keywords in the title are more important than keywords in the synopsis
- Cancellation/Award/J&A announcement related keywords usually appear at the start of the synopsis rather than at the end
- The overall length of the synopsis gives a clue about notice type (cancellations and justification and approval [J&A] notices are usually short)
- The number of attachments gives a clue about the notice type
- Synopses for award notices and J&A notices often include names of companies or dollar figures
- The number of notices gives a clue to the project status (many modification notices suggest that it is an ongoing acquisition effort, while few notices mean either cancellation or J&A)
- > The time between notices also gives a clue to the project status

Machine Learning Approach

- Possible machine learning approaches (given relevant features)
 - Logistic Regression
 - * Discriminant Analysis (QDA, LDA)
 - Decision Tree
 - MaxEnt classifier
 - ** Neural networks
 - * not suitable for a mix categorical and continuous predictors
 - ** no familiarity with this type of model

Machine Learning Approach

- Take a simple random sample of 10,000 projects and manually classify them
- Hold back 2,500 projects for testing
- Hold back another 2,500 projects for cross-validation (model selection)
- Train data using the rest of the 5,000 points

Data Engineering

- Notices are collected from several sources and stored in a MongoDB "notices" collection
 - > We are only interested in notices from www.fbo.gov (about 10GB of notices)
 - ➤ However collection also contains notices from www.usaspending.gov (300+ GB of notices)
 - > Initial MongoDB architecture slow to query/process due to large size of collection
 - Data was not being backed up
- Notices from www.fbo.gov are collected by scraping the new notices list every 10 minutes
 - MongoDB "tasks" collection contains a list of tasks to be run, along with details such as "last time run successfully", "how often to run", etc.
 - A PHP (Laravel) script goes through items in this collection, and runs the tasks based on certain rules (e.g. run the fbo.gov scraper if (now() lastRun > interval)
 - The fbo.gov scraper scrapes the first x pages of the new notice listing page (usually 10), and sends a list of notices to a message queueing service
 - Another Laravel script polls the queue for a list of notices. It then checks if the notice already exists in the collection. If not it scrapes the new notice (transforming the html into a MongoDB document)
 - Process was already set up before I joined GovTribe. Might have been easier to just use a cron scheduled task
 - Scraping left some ambiguities. For example, the "Set Aside Type" field for a notice could be "None", "N/A", the field is present but has no value, the field is not present, the field is present and has an actual value

Data Engineering

- Scraped data sometimes contained encoding error
 - Perhaps document is created on MS Word on a Mac, transferred to a Windows machine and then uploaded online. The encoding is not utf-8
 - Synopses and titles sometime contain HTML tags and entities, line breaks (many variants of
br> tags, \n, ^b, etc.)
- Scraping occurs using PHP, but PHP does not have good machine learning libraries. Prefer to code in R or Python
- Solutions
 - MongoDB: move to a clustered, sharded infrastructure to allow fast querying and index building. Manage cluster and backup data onto 10gen's MMS service
 - Encoding: use publicly available code libraries to try to detect and correct encoding, or toss out non-ASCII entities if this fails
 - HTML entities/natural language: use NLTK and BeautifulSoup to remove HTML, tokenize by word, filter stopwords and stem
 - > PHP interaction: create a python program that listens over a socket and communicate with it via JSON

Building the data set

- Create a web page where people can easily browse through random notices and classify them into one of the cases. Save the classification in the MongoDB document
 - Three people went through the notice collection and classified 10,000 notices over a three day period
- 2. Extract features using python
 - a. Length of notice
 - b. Do certain keywords/phrases appear in the title (sole source, cancel, request for quotes, justify, etc.)?
 - c. Do certain keywords appear in the filenames of attachments?
 - d. Do certain keywords appear in the first 50 words of the synopsis?
 - e. ..

The Models

The Logit Model $P(X) = \frac{e^{\beta_0 + \beta_1 X_1 + \dots + \beta_p X_p}}{1 + e^{\beta_0 + \beta_1 X_1 + \dots + \beta_p X_p}}, \text{ where } P(X) := P(Y = Y \mid X)$

Fit using Maximum Likelihood

The Tree Model

Simple Tree: For each of the predictors, find the cut point that minimizes the Gini impurity. Select the predictor and cut point that minimizes gini impurity overall. Repeat for each of the new nodes, until the number of leaves in each node is less than some value. Use k-fold cross validation and cost complexity pruning to prune back the tree.

The models

Bagged Tree: Take bootstrap samples of the data and fit trees to each data. Average the estimate over all the trees to come up with a prediction.

Random Forest: Also take a bootstrap of the predictors when building the trees.

Boosted Tree: Build an initial tree on the data. Fit another tree to the residuals. Update the initial model by adding a weighted version of the tree fitted on the residuals. Fit this new model on the residuals. Repeat updating the model and fitting on the residuals, stopping using the validation set approach.

Models

Maximum Entropy

let $E[f_i(x)] = \sum_i p(x)f_i(x)$ be the empirical expected count of feature j

let $\bar{E}[f_i(x)] = \sum_i \underline{p}(x)f_i(x)$ be the modeled count of feature j

We maximize the entropy $H=-\Sigma_x p(x)*log[p(x)]$ subject to the constraint that $\Sigma_x p(x)=1$ and $\bar{\mathbb{E}}[f_i(x)]=\mathbb{E}[f_i(x)]$ for all features

Model Selection

The validation set approach was used to pick out among the different models

The logistic regression model achieved a misclassification rate of 8% on the validation set. Both the random forest and maximum entropy models achieved a misclassification rate of less than 4%. The random forest model was chosen because of its interpretability.

Variable Importance Charts were obtained to understand important features in the model.

Fine Tuning

- The Random Forest model achieved a misclassification rate of < 6% on the test data</p>
- However, we encountered some notices which were being classified from "canceled" --> "open for bidding" or "awarded" --> "open for bidding". In these cases, notices were either coming to the project classifier out of order
- In these cases we chose to override the model predictions. Once a project has been cancelled or awarded, we do not try to classify its state again

Deploying

- The models were fitted using python (scikit.learn package) (models were initially developed using R, but deploying with python was easier)
- The classification tree was pickled (serialized) and uploaded to a web server
- A wrapper python program was created that listens for a JSON representation of a notice on a socket and responds with the classification (in JSON format)
- As part of the PHP notice scraping/project creation/update process, new notices are sent to this python program over the socket. The program then predicts the classification for the project and sends it back to the PHP script

Conclusion

- By examining some of the "meta data" associated with a project/notice, we were able to build a smarter classification system
- While a naive approach based solely on notice type achieved a classification rate of ~70% and a rules based approach achieved a classification rate ~80%, the machine learning approach achieved a classification rate of 94% -96% (all rates based on test set data)