

Program-Awareness via Lexical Link Analysis (LLA)

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Research Questions

Conceptual: 1) Can the information that emerges from the acquisition process be used to produce overall *awareness* of the *fit* between programs/projects/systems and *needs* for which they were intended?. 2) If a higher level of *awareness* is possible, will that enable system level regulation of programs/projects/systems for improvement of the acquisition system?

Focused: 1) Based on the normal evolution of documentation and current databased program information, can requirements (needs) be connected to system capabilities? 2) Can requirements gaps be revealed?

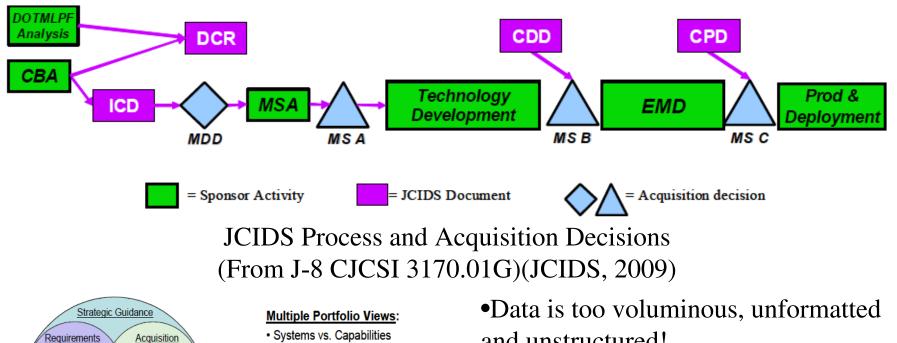
Theory development: Is there a correlation between system interdependency (links/relationships) and development costs?

Methodology: Is it possible to use natural language and other documentation (roughly, unformatted data) to produce visualization of the internal constructs useful for management, through lexical link analysis (LLA)?





Critical Need: Automation



- Systems vs. Capabilities
- · Investment vs. Capabilities
- System Context

-Technology

Portfolio

Analytic

Capability

-Joint Planning

Guidance

-Budgeting

POM

-Development

-Production

Sustainmen

-Gaps, Overlaps

-IPLs

J essons

Learned

- Highly dependent programs (Joint Enablers)
- Procurement Optimization
- S&T vs. future needs
- Sustainment Efficiency
- Market Value

and unstructured!

•Need automation

•Extract relations among PE, **MDAP** and **ACATII**

•Extract costs

Acquisition Research Program: Creating Synergy for Informed Change

Naval Postgraduate School Monterey, CA

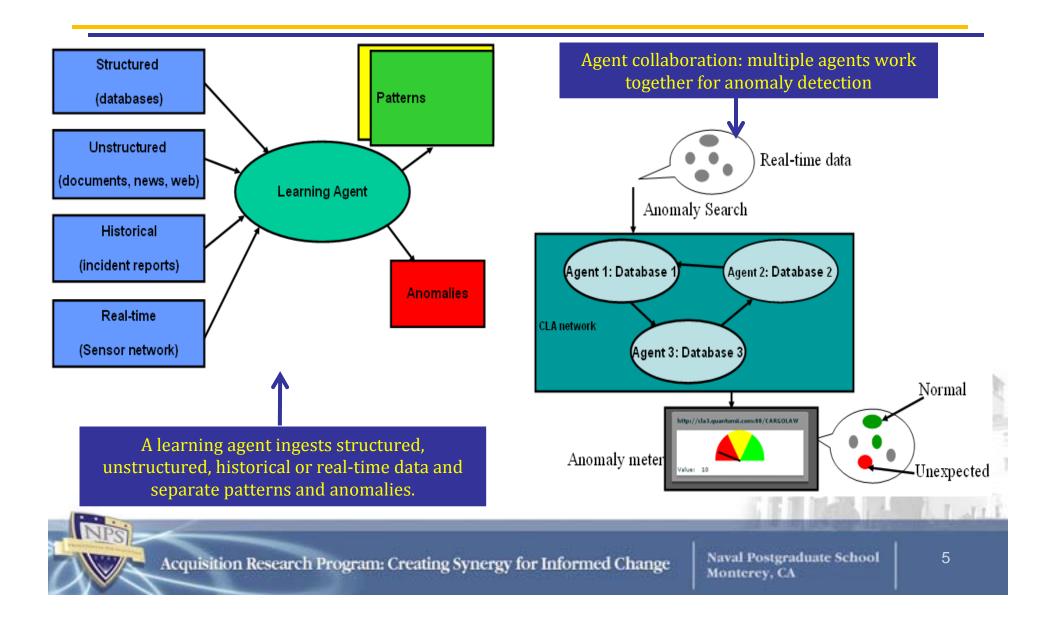


LLA for Analysis of Unstructured Data

- Apply Collaborative Learning Agents
 - Separate patterns and anomalies
 - Parallel computing using NPS High Performance Center (HPC)
- Develop Visualization
 - AutoMap
 - Radar
 - Matrix
- Conduct Pre-processing Steps
 - Named Entity Extraction
 - Leave out people, places and organizations
 - Parts of Speech Tagging
 - Separate nouns, verbs, adjectives, adverbs



Apply Learning Agents to Perform LLA





What is a learning agent?

- A computer program or software
 - Installed in a computer with permission
 - Perform automatic tasks
- Multi-agent, distributed networks are capable of
 - Self-managing (Hinchey et al, 2006)
 - Self-healing (Dashofy et al, 2002)
 - Self-optimizing, self-configuring, self-adapting...
- Our learning agent
 - Related to
 - Reinforcement learning (Sutton 1998)
 - Bayesian belief networks (Pearl, 1986; Ben-Gal, 2007)
 - Hidden Markov Models (Huang 1990)
 - Learning patterns and anomalies





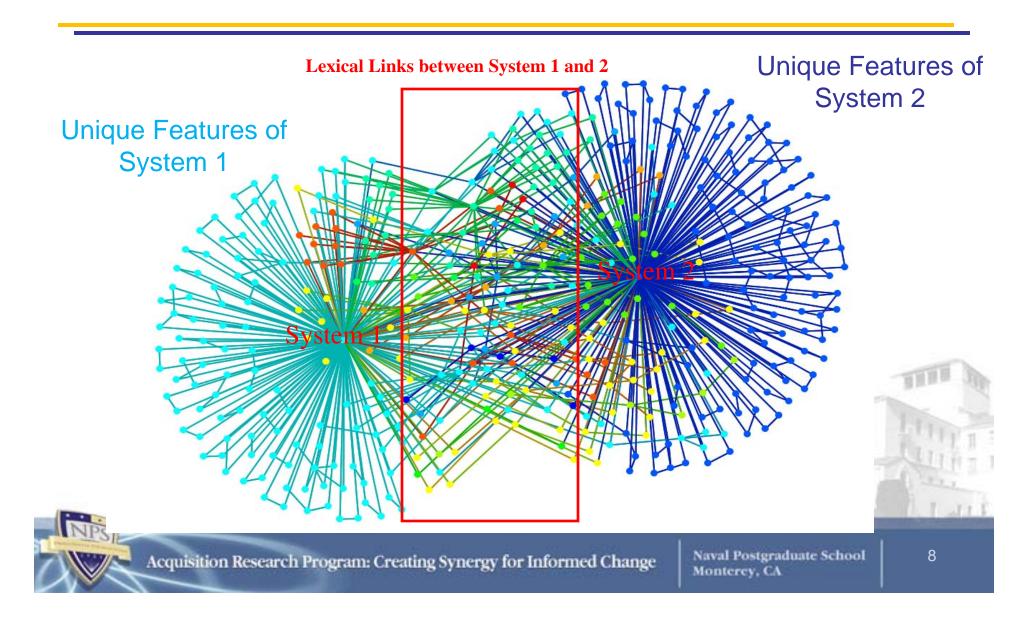
Example

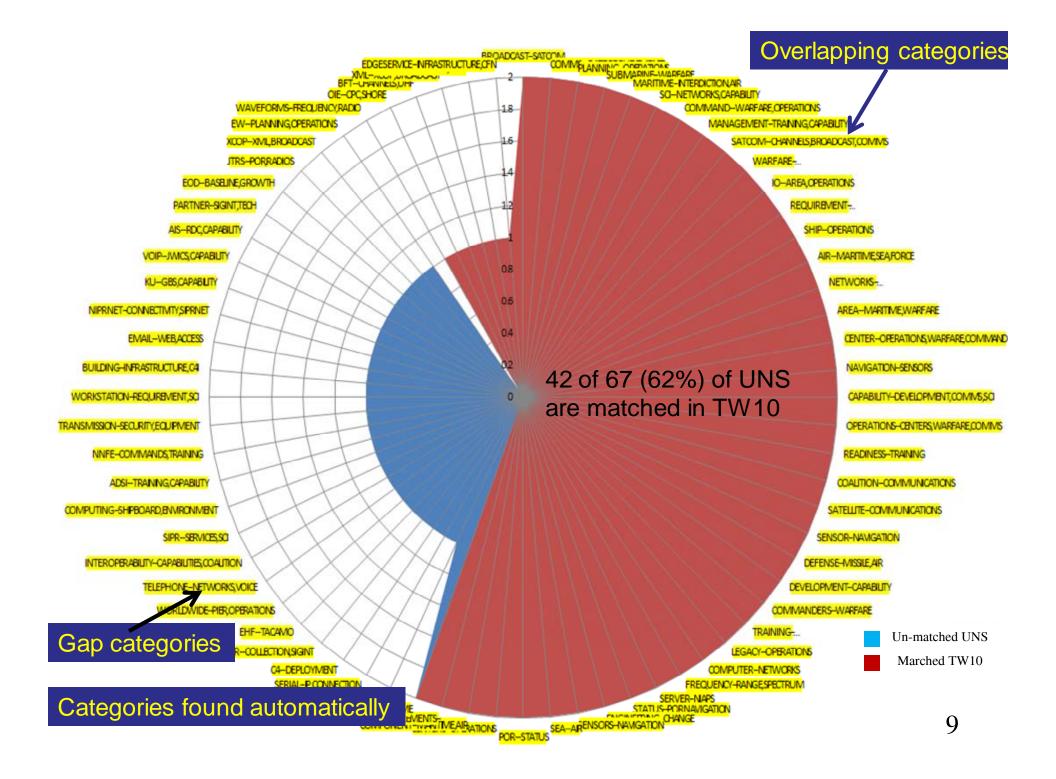
Analysis of Urgent Need Statements (UNS)

- Analyzed three lists of classified needs statements and links to Trident Warrior 10 technology capabilities
 - Navy classified UNS
 - C5F (5th Fleet)
 - Integrated Priority List (IPL)
 - CENTCOM and NAVCENT
- Validity checked by Subject Matter Experts



Visualization







Large Scale Data

- Program Elements
- Programs
 - Major DOD Acquisition Programs (MDAP)
 - Acquisition Category II (ACAT II)
- UJTLS
- Source
 - Rob Flowe OUSD(AT&L)/ARA/EI



DOD Program Elements

http://comptroller.defense.gov/defbudget/fy2009/index.html

| t & Comptroller | | | JOIN THE AIR FORCE |
|--|---|--|--------------------|
| Budget > Air Force President's Budget, FY08 | | Inside SAF/FM | |
| FY 2008 Air Force Budget Materials | | Inside SAFIFM | |
| The Air Force is engaged 24/7/365 days a year in National an continual refinement of performance measures and is comm entrusted to them. | d Worldwide response operations. The Air Force is focused on litted to providing good stewardship of resources which are | Search | |
| Supporting Documents | Participation (| Advanced Search | |
| FY08 Budget Rollout Brief FY08 Performance Based Budgeting Overview Book Military Construction Air Force MILCON, FY08 Air Force Reserve MILCON, FY08 Air Force Reserve MILCON, FY09 Air National Guard MILCON FY08 | Aircraft Procurment, Vol 1, FY08 Aircraft Procurement, Vol 2, FY08 Ammunition Procurement Missile Procurement, FY08 Other Procurement, FY08 Research, Development, Test & Evaluation The RDT&E volumes are cross bookmarked using a | View All RSS Links to Budget Materials Defense-wide Budget Documentation Army Budget Documentation Navy Budget Documentation OMB tradget Documentation | |
| Air National Guard MILCON, FY09 Military Family Housing, FY08 Military Personnel Programs Air Force MILPERS, FY08 Air National Guard MILPERS, FY0 Air Force Reserve MILPERS, FY08 Operations & Maintenance | specific filename structure. In order for the bookmarks to function, download each file to the same directory on your local machine. The files should be saved as: AF3600_RDTE_FY08_PB_v1.pdf AF3600_RDTE_FY08_PB_v2.pdf AF3600_RDTE_FY08_PB_v3.pdf The RDT&E volumes can be viewed directly via this vebsite. but the inter-volume bookmarks will not function. | Previous Year's Budget Materials Current Fiscal Year Fiscal Year 2010 Fiscal Year 2009 Fiscal Year 2009 Fiscal Year 2006 Fiscal Year 2006 Fiscal Year 2006 Fiscal Year 2005 Fiscal Year 2004 | |
| Air Force 0&M, Vol 1, FY08 Air Force 0&M, Vol 2, FY08 Air National Guard 0&M, Vol 2, FY08 Air National Guard 0&M, Vol 2, FY08 Air National Guard 0&M, Accompanying Exhibits, FY08 Air Force Reserve 0&M, FY08 | RDT&E, Vol 1, FY08 RDT&E, Vol 3, FY08 RDT&E, Vol 3, FY08 Base Realignment and Closure (BRAC) BRAC 1995 Commission, FY08 | Fiscal Year 2003 Fiscal Year 2002 Fiscal Year 2001 Fiscal Year 2000 Fiscal Year 1998 Fiscal Year 1997 | _ |
| Global War on Terror Air Force MILCON GWOT Vol I, FY08 Air Force MILCON GWOT Vol II, FY08 | BRAC 2005 Commission, FY08 Working Capital Fund Working Capital Fund, FY08 | · | |

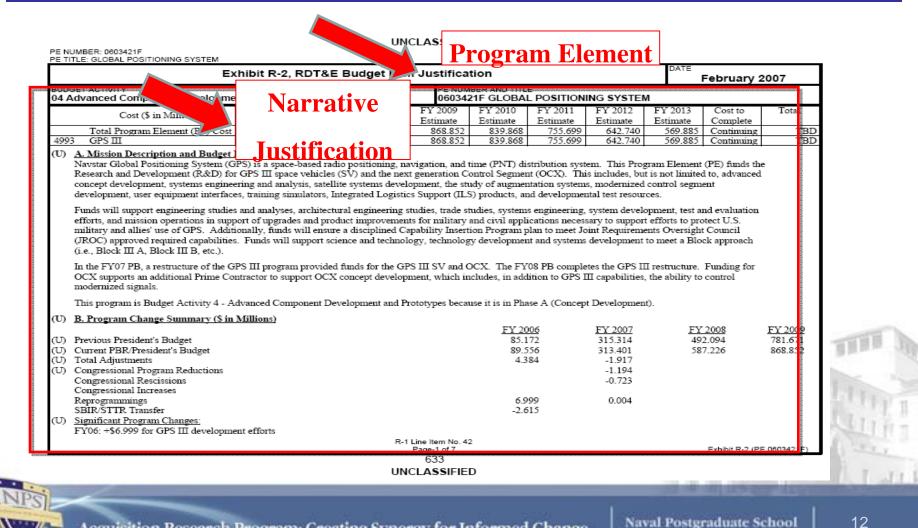


Acquisition Research Program: Creating Synergy for Informed Change

11



PE Narrative Justification

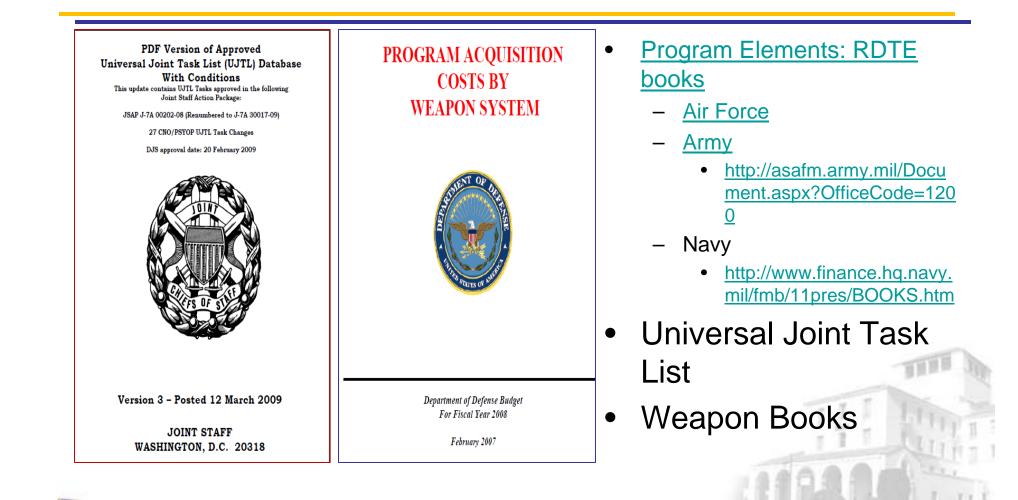


Acquisition Research Program: Creating Synergy for Informed Change

Monterey, CA



Acquisition Documents

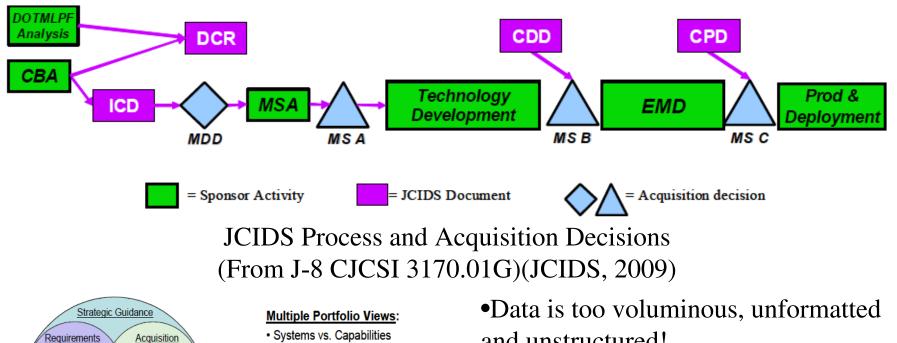




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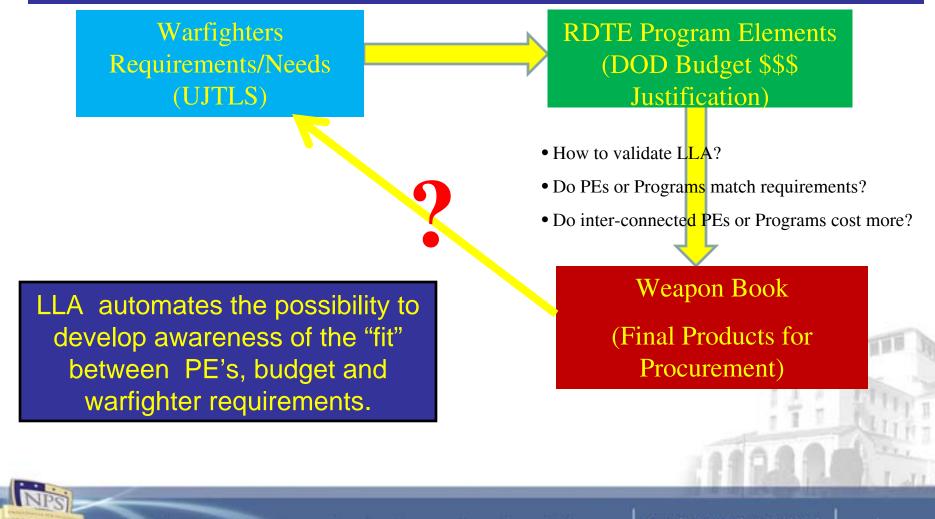
•Need automation

•Extract relations among PE, **MDAP** and **ACATII**

•Extract costs



LLA Methodology Can Help!





PE Links Identified by Human Analysts (Used for LLA Validation)

| | | | | UN | ICLASSIFI | | | | | | |
|-------------------|--|--|--|--|---|---|--|---|--|--|--|
| | I | Exhibit R-2 | a, RDT&E | E Project | Justifica | 1 | | | DATE | May 200 |)9 |
| | ET ACTIVITY stem Development and Demons | tration (SDD |) | | | R AND TIT 2F Armam lopment | LE ent/Ordnanc | | OJECT NUMBE | | |
| | Cost (\$ in Millions) | FY 2008 Actual | FY 2009 Estimate | FY 2010 Estimate | FY Esti | FY 2012 Estimate | FY 2013 Estimate | FY 2014 Estimate | FY 2015 Estimate | Cost to Complete | Total |
| 5361 | Stores-Aircraft Interface | 0.000 | 0.000 | 6.68 | | 0.000 | | 0.000 | 0.000 | Continuing | TBI |
| | Quantity of RDT&E Articles | 0 | 0 | (| 0 | 0 0 | 0 0 | 0 | 0 | | |
| | 2010, Project 5361, Stores-Aircraft In ce (UAI), in order to properly fund the | | | transferred f | rom PE 0605(| 011F, RDT&E | for Aging Air | craft, Project 6 | 54685, Unive | rsal Armamer | it |
| U) <u>A</u> | A. Mission Description and Budget I | tem Justificat | ion | | | | | | | | |
| st 4 M d | Jniversal Armament Interface (UAI) is upport integration of weapons indeper 60/50 aircraft, Small Diameter Bomb (Aunitions Planning Software (PGMPS levelopment and enhancement of the s The UAI efforts were transferred (1) to | ident of aircraf SDB) I and II,). Additional a tandard, provis ensure contine | ft Operation F Joint Direct A ircraft and we sion of certific ued funding fo | light Program Attack Munit eapons have cation tools (or UAI throu | m (OFP) cycli tion (JDAM), program plan (test assets) ar agh the FYDP | es. UAI is curr Joint Air-to-S s to implement d implementa (PE 0605011) | ently being im, urface Stand-o t UAI. The UA tion support to F will be zeroe | plemented on ff Missile (JAS AI program off aircraft and w d out in FY 20 | the F-15E and SSM) and Predice is respons- eapons. 10 due to high | l F-16 Block cision Guided ible for her Air Force | - |
| tì | riorities), and (2) to properly fund the he Arm/Ord PE will ensure that platfo This program is in Budget Activity 5 - | rm and weapor | n program off | ices have the | e support requ | ired to implen | ient and update | UAI. | - | - | la |
| w i | B. Accomplishments/Planned Progr | am (\$ in Milli | ions) | | | | | FY 20 | 0.0 | FY 2009 | FY 2010 |
| U) | ICD Dev/Updates UAI Common Component | | | 02F r | eferen | ces 06 | 05011] | | | | 5.702 0.786 |
| ຫ໌ ' | Certification Tool Total Cost | | | | | | | 0.0 | 00 | 0.000 | 0.197 6.685 |
| | This is not a new start; these efforts w <u>Other Program Funding Summar</u> | - 06 | 05011 | Frefe | erence | d by 0 | 604602 | 2F Bac | kwaro | l Link | |
| | FY | 2008 FY | 2009 F | Y 2010 | FY 2011 | FY 2012 | FY 2013 | FY 2014 | FY 2015 | Cost to | T |
| | 4 | Actual Es | timate E | stimate | Estimate | Estimate | Estimate | Estimate | Estimate | Complete | Total Cost |
| U) N | I/A | | | | | | | | | | |
| Li te | D. Acquisition Strategy in December 2004, under the authority o Boeing, Lockheed-Martin, Northrop Department of Defense' platforms and ' | -Grumman and | d Raytheon. [] | These four v | endors are the | Original Equi | pment Manufa | cturers (OEM | s) for approxim | mately 90% of | the |
| Projec | ct 5361 | | | R- | 1 Line Item No. Page-9 of 13 | 77 | | | | Exhibit R-2a (P | E 0604602F) |
| | | | | UN | 469 ICLASSIFI | ED | | | | | |
| | | | | | | | | 10.00 | In Longing | 10.00 | |
| | | _ | | | | | | 1000 | STATISTICS. | No. of Concession, name | Contraction of the local division of the loc |
| VPS | | | | | | | | | | | |
| | Acquisition Research | n Program | : Creating | y Synergy | y for Info | rmed Cha | nor | aval Postg | | nool | 16 |

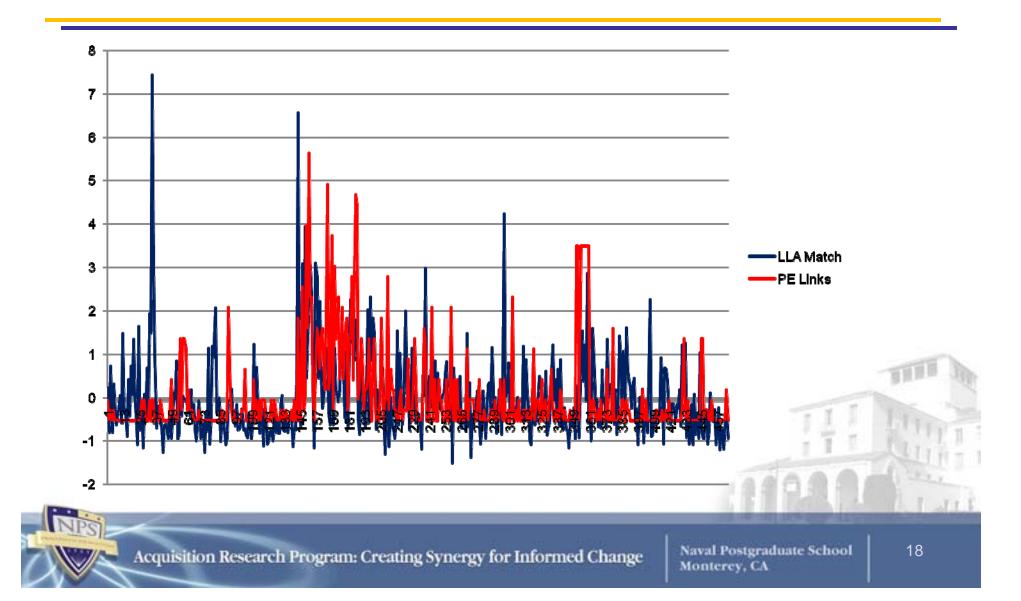
Validate LLA and Discover Statistically Significant Correlation



| | 0.396594525 | F I | rom human ana | lysts | |
|---------------------------------|---|--|--------------------------------------|--|--------------|
| | | |).39 (p-value= | | |
| 2009 Cost | 38651 | | | between the t | wo |
| PE Links(Forward+Backward) | 2 | 0 | 1 | 000 | |
| PE Backward Links | 1 | From LLA usin | g the narrative o | lescriptions of e | ach PH |
| PE Forward Links | 1 | | | | - |
| LLA:# of Unique Word Hubs | | | | | |
| PEs LLA: Overall Match Score | 156125 | 63013 | 326240 | 32278 | |
| LLA:# of Matched Word Hubs | 261 | 88 | 413 | 54 | |
| 0204574N | CTURING, ENHANCEMENTS, DEVELOPS, AR | 2. Contraction of the second second second second second | | NSFERS, DEC, TOTALS, PRIOR, CATEGORY, Q | |
| 0204571N | GATION, SUPPORTED, DAMAGE, IDENTIFIE | TIVES, UTILIZING, STRIKE, MODIFICATIONS | VIGATION, IDENTIFIED, COMMENCE, SUPP | E,FACILITY,ENGINEERING,MILESTONE,RE ELOPS,ARTICLES,METRICS,SUBTOTAL,TRA | E,EVALUATION |
| 204413N | CAL, FUNCTIONAL, TRANSFERS, DIGITAL NERSHIP, DEVICES, OBSOLESCENCE, NAVI | | | SFERS,TOTALS,PRIOR,READINESS,CATEG E,UNCLASSIFIED,LOOP,COUNTERMEASUR | |
| | | | | S, INITIATIVES, METRICS, SUBTOTAL, TRAN | |
| | 0101113F | 0101122F | 0101221N | 0101226N | 0101313F |

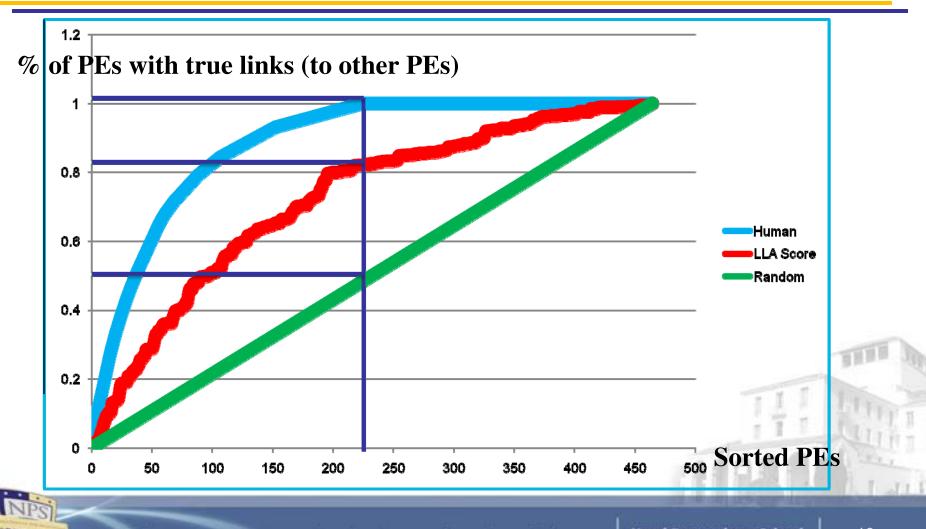


Visualize the Correlation





Use LLA Scores to Predict PE Links: Gains Chart



| 😰 pe_pe.matrix.html - Micro | osoft Excel | | | _ 0 |
|-----------------------------|---------------------|---|---|---|
| A | | В | | C |
| 1 | 0101113F.txt | | | 0101122F.txt |
| 2 0604226F.txt | 0027656.27;STERLING | VA;OWNERSHIPCOST,COSTS;BP16INITIAL,PE | | 5.33 |
| 3 0101126F.txt | 0019881.86;OWNERS | HIPCOST,COSTS;BP16INITIAL,PE | | 8.1 |
| 4 0207581F.txt | 0018671.22;BP16INI | ITIAL,PE | | 5.72 |
| 5 0603235N.txt | 0018667.64;SOURCED | DDATA,SOFTWARE | | 3.16 |
| 6 0302015F.txt | 0017172.55;OGDEN | AIR,AFB;REPLACESCURRENT;DEPENDENTSURVEILLANCE | Links discovered | d bv LLA6.87 |
| 7 0207136F.txt | 0013337.67;AFMSSU | JPGRADES,SS | | 6.79 |
| 8 0207417F.txt | 0007315.54;RNPGLC | DBAL,SURVEILLANCE;GWOTFUNDING | | 6.69 |
| 9 0207249F.txt | 0006227.37;ATPEFF | ORT, REQUIREMENTS | | 7.9 |
| 10 0401119F.txt | 0006133.00;OWNERS | HIPCOST,COSTS;WARTIMECAPABILITY,MISSIONS | | 7.14 |
| 11 0207590F.txt | 0004917.94;LITENING | INTEGRATION,TARGETING | | 7.96 |
| 12 0204229N.txt | 0004916.45;WARTIME | ECAPABILITY, MISSIONS | | 4.91 |
| 13 0303601F.txt | 0004548.71;FABINC | REMENT REMELYFREQUENCY | | 7.79 |
| 14 0602271N.txt | 0004227.58;EXTREME | Links noted by ana | lysts | 3.22 |
| 15 0604503N.txt | 0004227.12;EXTREME | LYFREQUENC | 19303 | 3.79 |
| 16 0401219F.txt | 0003843.68;REPLACE | | | |
| 17 0303109N.txt | 0003807.47;EXTREME | Entitle D. 2. DDT&F. Durland Mars. Juniferentians DD 2044 Air France | UNCLASSIFIED | DATE: Estavor 2010 |
| 18 0901212F.txt | 0003596.23;NORMAL | Exhibit R-2, RDT&E Budget Item Justification: PB 2011 Air Force APPROPRIATION/BUDGET ACTIVITY | R-1 ITEM NOMENCLATURE | DATE: February 2010 |
| 19 0605709A.txt | 0003592.63;NORMAI | 3600: Research, Development, Test & Evaluation, Air Force | PE 0101113F: B-52 SQUADRONS | |
| 20 0602236N.txt | 0002746.67;EXTREMI | BA 7: Operational Systems Development The B-52 Extremely High Frequency (EHF) will integrate and install t | he B-52 fleet with assured and survivable two-way EHF | SATCOM link for Emergency Action |
| 21 0205633N.txt | 0002698.57;OWNERS | Messages (EAMs) and report-backs to meet Joint Chiefs of Staff (JC rammy or A Jvanced Beyond-Line-of-Sight (BLOS) Terminal (FAB-T) | S) nuclear protected Information Exchange Requirement | ts (IER). The B-52 EHF will integrate the |
| 22 0604567N.txt | 0002697.52;OWNERS | 0303601F. The FAB-T system consists of the Operator Interface Gr | oup, Modem Processor Group, and Antenna Group. The | B-52 EHF will integrate the following |
| 23 0603635M.txt | 0002697.32;OWNERS | capability into the CONECT baseline B-52 architecture: a high data The two Multi-function Color Displays (MFCDs) and the additional J- | | |
| 24 0204163N.txt | 0002596.36;EXTREM | the Strategic Radar Replacement and CONECT programs, respectful also be moved from the B-52 EHF. Disposition of this capability is p | lly. In addition, the automated reporting of aircraft fuel le | evel status off-board the jet capability will |
| 25 0605976F.txt | 0002396.59;GWOTF | three increments. Increment 1 is the up front program planning and | isk reduction trade studies on items like radome mountir | ng, environmental cooling system (ECS) |
| 26 0605805A.txt | 0002288.60;OWNERS | capabilities, antenna boresighting, etc. Increment 2 will integrate, an In addition, the ECS will need to be upgraded or replaced. The ECS | | |
| 27 0305114F.txt | 0002081.56;DEPENDI | efforts. Finally, Increment 3 will provide GIG and net ready capability | | |
| 28 0604633A.txt | 0002079.14;DEPENDI | Trainers and upgrades for CONECT & EHF | | |
| 29 0401218F.txt | 0001767.75;REPLACE | In order to maintain currency with the latest aircraft configuration, the | CONECT and EHF programs will update existing trainer | rs or use computer-based training to add |
| 30 0101127F.txt | 0001538.71;EXTREM | CONECT and EHF functionality to meet user-training requirements a (WST). | nd establish a system integration laboratory (SIL) for upo | dates of the Weapon System Trainers |
| 31 0603430F.txt | 0001537.24;EXTREM | | | |
| 32 0604240F.txt | 0001536.97;EXTREM | Advanced Targeting Pod Functionality | | Sa tel terretaria benerativaria est |
| 33 0303131F.txt | 0001536.38;EXTREM | The B-52 Modernization program fully integrates Advanced Targetin Avionics System (OAS). The B-52 ATP effort continues the ATP (Sr | | |
| 34 0603432F.txt | 0001536.18;EXTREM | develops aircraft software updates to add and incorporate advanced | pod functionality into the B-52. In addition, this effort up | grades the software functions of the |
| 35 0603854F.txt | 0001535.96;EXTREM | new Alternate Mission Equipment (AME) (Multi Function Display and Integration (AWI) modification, and enables the B-52 to utilize a LITE | | |
| 36 0602235N.txt | 0001535.65;EXTREM! | maintenance trainers and the SIL. | | 20 |
| 37 0605712E.txt | 0001534.91:EXTREME | Weenens Improvements | | 20 |

| 💽 🖟 🤊 • (° -) = | wp_wp.matrix.html - | Microsoft Excel | |
|--|---------------------------------------|---------------------------|--|
| Home Insert Page Layout Formulas Data Review | View Acrobat | | 🖡 A-10_AIRCRAFT.txt - Notepad |
| | | Calls 330 | File Edit Format View Help |
| V Ruler V Formula Bar | | Split Di View | A-IU AIRCRAFT |
| Normal Page Page Break Custom Full | Zoom 100% Zoom to New Arrange F | reeze | Description: The A-10 Thunderbolt was the first aircraft de support of ground forces and is capable of delivering a ful |
| Layout Preview Views Screen Message Bar | | Panes * 🗌 Unhide 🔄 🖻 Rese | support of ground forces and is capable of delivering a ful munitions as well as self defense air-to-air missiles. It i can be used against all ground targets, including tanks and |
| Workbook Views Weapon | Systems | Windo | contractor for systems integration is Lockheed Martin. |
| B1 - (fx A-10_AIRCRAFT.txt | - | | can be used against all ground targets, including tanks and contractor for systems integration is Lockheed Martin. Mission: The primary mission of the A-10 is to provide day combat support for land forces. The A-10 has a secondary mi search and rescue and Special Forces operations. It also pc capability to perform certain types of interdiction. All of place in a high or low threat environment. FY 2008 Program: The FY 2008 budget provides for Precision wing Renlacement modifications |
| A | | D | search and rescue and Special Forces operations. It also po |
| | | | place in a high or low threat environment. |
| | ADVANCED EXTREMELY HIGH FREQUEN | ADVANCED MEDIUM RA | FY 2008 Program: The FY 2008 budget provides for Precision wing Replacement modifications. |
| 1 A-10 AIRCRAFT.txt | CY AEHF.txt | AIR MISSILE AMRAAM. | Program Acquisition Costs |
| 69 STANDARD MIS | | 2, MISSILE, GUIDED | FY 2006 (\$ Millions) Weapon book |
| | 3 | 2.036.0227.032.03.032 | FY 2007 FY 2008 |
| 70 STRYKER FAMIL ARMORED VEHICLES.txt | 1 | 2,MISSILE,GUIDED | (Qty) Amt (Qty) Amt (Qty) Amt Procurement (-) 72.0 (-) 106.9 (-) 167.1 RDT&E (-) 55.7 (-) 31.9 (-) 2 0 TOTAL (-) 127.7 (-) 138.8 (-) 169.1 |
| Wear or Stratery | | | RDT&E (-) 55.7 (-) 31.9 (-) 2 0 |
| 71 Shadow Raven.tx. Weapon System | \$ | 2,SUBTOTAL | |
| 72 T-45S GOSHAWK.txt | 1.SIZED | | |
| 73 TACTICAL TOMAHAWK CRUISE MISSILE.txt TRANSFORMATIONAL SATELLITE COMMUNIC | 5,USERS,TACTICAL,SURVIVABLE,SECURE, | k | |
| 74 ATIONS SYSTEM TSAT.txt | STRATEGIC | | |
| 75 TRIDENT II.txt | STRATEGIC | 1,MISSILE | |
| 76 UH-60 UTILITY HELICOPTER BLACKHAWK.txt | | 2/11/00/22 | 1 |
| 77 V-22 OSPREY.txt | | 2,SUBTOTAL | |
| 78 VH-71 EXECUTIVE AIRCRAFT.txt | | | Constructive view: Does a |
| 79 VIRGINIA CLASS SUBMARINE.txt | | | |
| | 6,EXPENDABLE, VARIANT, EVOLVED, SIZED | | program cost more with |
| 80 WIDEBAND GAPFILLER SYSTEM WGS.txt | ,INTERMEDIATE | | increased relations to |
| WIND CORRECTED MUNITIONS DISPENSER | | | mereaseu relations to |
| 81 WCMD.txt | | | |
| 82 LLA:# of Matched Word Hubs | 4 10 | | 7 4 |
| 83 LLA: Overall Match Score 5 | 2 35 | | 93 31 6 |
| 84 LLA:# of Unique Word Hubs | K | | |
| 85 Total Cost 169. | | | $\frac{252 \text{ s}}{252 \text{ s}} = \frac{252 \text{ s}}{252$ |
| 86 | | | on between the two is 0.21 p-value<0.032 |
| 87 0.20629574 ₩ ↔ ₩ wp_wp.matrix 10 | 0 | | ly significant positive correlation) |
| Ready | | Dist | |

There is a statistically insignificant correlation between weapon systems' RDT&E cost and # of lexical links to ACAT II systems

| A | В | C | D | E | |
|--|---|---|---|--|---------------|
| | | Weapo | n Systems | | |
| | A-10 AIRCRAFT.txt | CY AEHF.txt | AIR MISSILE AMRAAM.txt | AH-64 APACHE.txt | AIR |
| 11 Unit Water Pod Sy (Camel).pdf | 0.04 | 0.11, VEHICLE, TACTICAL | 0.11,MEDIUM | 0.05,INTEGRATED | |
| Warfighter Inform Network- 12 Tactical (WIN-T).p | 0.22,ENVIRONMENT,COMBAT,INTEGRATI ON,LOCKHEED | 0.37, INTEGRATION, SECURE, COMMUNICA TIONS, WARFIGHTER, DATA, TACTICAL, LOC KHEED | | 0.16,INTEGRATED,SUPPORTS | 0.14, |
| ACAT II Sys | 0.20, PRECISION, VEHICLES, RANGE, MISSIL ES, THREAT | 0.16,LAUNCH,PRIME,VEHICLE,ADVANCED ,CONTROL,ANTI | 0.24, PRIME, GUIDED, MISSILE, AZ, ADVANC ED, RANGE, RAYTHEON | 0.18, PRIME, MISSILE, AZ, MOUNTED, CONT ROL | 0.37, NGE, |
| XM101 Common Remotely Operated Weapon Station.pdf | 0.20,ARMORED,TARGETS,VEHICLES,RANG E | 0.03,VEHICLE | 0.07, TARGETS, RANGE | 0.13,SENSORS | 0.07, |
| 15 XM307.pdf | 0.19, ARMORED, TARGETS, COMBAT, INTEG RATION, VEHICLES | 0.19,LAUNCH,PRIME, VEHICLE, INTEGRATI ON, ADVANCED, VARIANT | 0.17, TARGETS, PRIME, ADVANCED, RAYTHE ON | 0.14,PRIME,MOUNTED | 0.19 |
| 16 LLA:# of Matched Word Hubs | 24 | 27 | 19 | 25 | 5 |
| 17 LLA: Overall Match Score | 21.76839827 | 21.52527465 | 17.7039979 | 17.48533462 | 2 |
| 18 LLA:# of Unique Word Hubs | 8 | Deenson com | relation between | the two is 0.18 | |
| 9 PE Forward Links | - | Fearson cor | relation between | 1 the two is 0.10 | |
| 20 PE Backward Links | | p-value<0 | .055 statistically | insignificant | |
| 21 PE Links(Forward+Backward) | 0 | - | e e | U | |
| 22 RDT&E Cost | | 603.2 | 41.4 | 193.7 | |

24 Pearson correlat

0.181598022



Correlation between Unique # of LLA Word Hubs and Increasing Procurement Cost

| A | | ^c Weapo | n Systems | E | |
|--|--|--|---|--|-----------------|
| | | and the second sec | and the second | | |
| 1 | A-10 AIRCRAFT.txt | ADVANCED EXTREMELY HIGH FREQUEN CY AEHF.txt | AIR MISSILE AMRAAM.txt | AH-64 APACHE.txt | AIR IN |
| 111 Unit Water Pod S (Camel).pdf | 0.04 | 0.11, VEHICLE, TACTICAL | 0.11,MEDIUM | 0.05,INTEGRATED | |
| Warfighter Infor h Network- | | 0.37, INTEGRATION, SECURE, COMMUNICA TIONS, WARFIGHTER, DATA, TACTICAL, LOC KHEED | | 0.16.INTEGRATED,SUPPORTS | 0.14,EI |
| | ON,LOCKHEED | NHCED | 0.15,ENVINONIMENT,JOINT | 0.10,INTEGRATED,SOPPORTS | 0.14,5 |
| ACAT II Sys | 0.20, PRECISION, VEHICLES, RANGE, MISSIL ES, THREAT | 0.16,LAUNCH,PRIME,VEHICLE,ADVANCED ,CONTROL,ANTI | 0.24, PRIME, GUIDED, MISSILE, AZ, ADVANC ED, RANGE, RAYTHEON | 0.18, PRIME, MISSILE, AZ, MOUNTED, CONT ROL | 0.37,L NGE,R |
| XM101 Common Remotely Operated 114 Weapon Station.pdf | 0.20, ARMORED, TARGETS, VEHICLES, RANG | 0.03,VEHICLE | 0.07, TARGETS, RANGE | 0.13,SENSORS | 0.07,T. |
| | | 0.19,LAUNCH,PRIME,VEHICLE,INTEGRATI | 0.17 TARGETS DRIME ADVANCED RAVTHE | | 0.19,L |
| 115 XM307.pdf | RATION, VEHICLES | ON, ADVANCED, VARIANT | ON | 0.14, PRIME, MOUNTED | AYTHE |
| 116 LLA:# of Matched Word Hubs | 24 | 27 | 19 | 25 | |
| 117 LLA: Overall Match Score | 21.76839827 | 21.52527465 | 17.7039979 | 17.48533462 | |
| 118 LLA:# of Unique Word Hubs | 8 | 14 | 7 | 8 | |
| 119 PE Forward Links | | | | | |
| 120 PE Backward Links | 2 | | | | |
| 121 PE Links(Forward+Backward) | 0 | 0 | 0 | 0 | |
| 122 Procurement Cost | 167.1 | 7.8 | 312.1 | 711.7 | |

Pearson correlation between the two is 0.34 p-value < 0.001 statistically significant





Results/Conclusions

- Provided an automated tool to surface important aspects among programs
- Proved LLA Validity for automation
 - Adequately models expected human performance but faster
- Demonstrated correlation among relations between programs
 - Cost drivers: Interrelated and Uniqueness
- Discovered statistically significant correlations of Lexical links between MDAP and ACAII, and RDT&E cost





- Extract lexical links for applications
 - Continue to explore available acquisition data
 - Extract the cost of MDAP programs (PNO) from the PE documents
 - Compare with SAR (Selected Acquisition Report) as in the MDAP perspective
 - Search for other correlations among other program attributes
 - Identify more dependent variables
 - Diversity metrics
 - Predict program costs using this methodology
 - Cost and cost growth relative to the Milestone B
 - Cascade effect of program costs

Acquisition Research Program: Creating Synergy for Informed Change

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Future Work



- Determine methods to leverage the NPS HPC to analyze larger data sets
- Develop improved graphic illustrations of findings
 - 3-D
 - Dynamic
- Provide an automatic LLA service for program self-awareness
 - Enterprise Lexicon Service
 - Meta-Data Registry
- Establish a complex system theory for a cross-domain
 - Law of requisite variety
 - Design Structure Matrix



Program-Awareness via Lexical Link Analysis (LLA)

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