#### OFFICE OF THE DIRECTOR OF NATIONAL INTELLIGENCE

## FORESIGHT AND UNDERSTANDING FROM SCIENTIFIC EXPOSITION (FUSE) Office of Incisive Analysis

LEADING INTELLIGENCE INTEGRATION

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INTELLIGENCE ADVANCED RESEARCH PROJECTS ACTIVITY (IARPA)

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"Invests in high-risk/high-payoff research programs that have the potential to provide our nation with an overwhelming intelligence advantage" <u>http://www.iarpa.gov/</u>



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## Foresight and Understanding from Scientific Exposition (FUSE)

Enable reliable, early detection of emerging scientific and technical capabilities across disciplines and languages found within the full-text content of scientific, technical, and patent literature

Focus from the outset on **English**, **Chinese**, **German**, Japanese, Russian, *Korean*, and *Spanish* 

| Novelty | → Discover <u>patterns</u> of emergence and <u>connections</u> between technical concepts at a speed, scale, and |
|---------|--|
|         | comprehensiveness that exceeds human capacity  |
| Usage   | $\rightarrow$ <u>Alert analyst</u> of emerging technical areas with sufficient                                   |

explanatory evidence to support further exploration



## **Worldwide Scientific and Patent Literature**





# **FUSE Approach**

**Today**, *ad hoc* "technical horizon scanning" already consumes substantial expert time, is narrowly focused on a small number of topics, and is subject to limited systematic validation.

**Analysts need** a reliable and transparent capability to <u>scan continually</u> for signs of technical capability emergence.

**Process** full-text documents to identify, prioritize, and nominate technical areas for analysts with supporting evidence.

**Evaluate** progress with case studies, expert judgment, and quantitative tests.

| Today                                      | FUSE  |
|--|---|
| Manual                                     | Automatic                                     |
| Selected coverage                          | "Complete" literature coverage                |
| Updated infrequently                       | Updated monthly                               |
| Months to produce (for one technical area) | 24hrs to produce<br>(for all technical areas) |
| Ad hoc evaluation                          | Formal models of                              |
| ntinual Unhiasod                           | emergence                                     |

Complete, Continual, Unbiased

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# **Key Technical Challenges**

automated detection of emerging concepts, methods, technologies, ...

- Tech Emergence Theories: Develop, test, and validate indicators and establish models / theories of technical emergence
- **Text-to-indicators:** Process multidiscipline, multilingual, and noisy <u>full-text</u> literature
  - Extract usable within-document and cross-document features (e.g., rhetorical stance on citations, methods, applications, ...)
  - Connect features in context, create indicators, and learn patterns (e.g., feature / indicator fusion, time series summarization & analysis, ...)
  - Generate groupings of documents that meaningfully represent "the what" that is emerging Related Document Groups (RDGs)
- **Nomination, Evidence:** Identify, prioritize & nominate technical areas, and provide evidence with understandable explanations
- System Integration and Engineering: Effective virtualized service orchestration

## Phase 1 Hypotheses:

- 1. Emergence of scientific and technical capability can be detected for selected case studies
- 2. Features derived from full-text are critical for detecting technical emergence signatures
- 3. Modules implemented will enable performers to develop prototype systems in Ph. 2 that can scan for technical emergence at scale, across time.





#### Theory Development

- Refers to the performer activity in response to BAA Section 1.B.1 calling for fundamental advances in our understanding of how the **real-world processes of technical emergence leave discernible traces** in the public scientific, technical, and patent literature, and how those traces can be detected.
- Theory **development will be ongoing** through the full FUSE program and is implicitly measured through key program metrics
- Highly variable, **team-specific process**; can capture essence and progress through *emergence hypotheses, indicators,* and *challenge questions.*

**Emergence Hypotheses** 

- Concise statements that capture one or more properties of what it means for a concept to emerge
- Posited by each performer team; revision is expected throughout the program, but not on a continuous basis

#### Indicators

- Quantitative, computable, measures that relate to some aspect of an emergence hypothesis
- Posited by each performer team; expect many indicators to be proposed and implemented (~10-20 per team)

#### Challenge Questions

- Mechanism to test and evaluate the relationship between emergence hypotheses and indicators
- Common set defined by Government; performer-posited challenge questions are being reviewed by the Government team



# What is technical emergence?

(Current "Emergence Hypotheses")

- A concept has emerged if it has been accepted by others within and beyond one's community. ~Columbia
- A concept is emerging when its actant network is increasing in robustness. ~BAE
- A concept has emerged when evidence has appeared that the concept is new and unexpected, noticeable and growing.
  ~Raytheon BBN
- A concept is emerging when it is identifiable by its own practitioners, enables a capability that was not achievable previously, and persists. ~SRI









## How do we probe "Technical Emergence"?

## **Government-Defined Challenge Questions**

- Was there a community practice around <concept> during <time period>?
- Were there **debates** within the scientific community on <concept> during <time period>?
- Was there a demonstration of practical application of <concept> during <time period>?
- Was <concept> considered an **alternative** to an established concept during <time period>?
- Was there a demonstration of commercial application of <concept> during <time period>?
- Was the infrastructure required to perform research in <concept> readily available during <time period>?

#### Performer-Defined Challenge Questions

- Was <concept> accepted during <time period>? **Columbia**
- Did the acceptance of <concept> increase or decrease during <time period>? Columbia
- How interdisciplinary was the scientific and technical knowledgebase around <concept> during <time period>? SRI
- Did usage of new terminology describing <concept> increase in robustness during <time period>? BAE
- How many citations of papers from <concept> published in <time period 1> would you expect to see in <time period 2>? *Raytheon BBN*
- Does the <concept> dominate a thread during <time period>? Raytheon BBN





#### Text to Indicators

- Refers to the performer activity in response to BAA Section 1.B.2 calling for fundamental advances in the exploitation of the full-text of technical documents, in addition to the document's metadata
- This research thrust captures the **bulk of the performer time and effort** with multiple subteams on each performer team
- Feature specific evaluation is performer-centric (defined in waypoints) and often leverages intrinsic evaluations; overall evaluation of research is at the Nomination Quality metric level and is extrinsic, relative to case studies

## Text to Features

- All performer teams have demonstrated progress on FUSE specific development in identifying and extracting / generating features from the FUSE document repository
- All performer teams have efforts focused on the textual level (micro) and the document level (macro); relative balance of feature level varies between teams (Columbia = text focus; BAE = balanced; Raytheon BBN, SRI document focused)
- Little redundancy between teams; multiple teams are pursuing broad topics such as 'topic modeling' and 'citation context', but the details reveal significantly different motivations, approaches, and applications of these features



## Nomination and Evidence Explanation – Ongoing Work

RNAi : 2006-2010 : CQ1

Was there a community of practice around RNAi during 2006-2010?

The answer is YES, with a confidence of 72%

#### **Topic Summary**

RNA interference (RNAi) is an RNA-dependent gene silencing process within living cells. The selective and robust effect of RNAi on gene expression makes it a valuable research tool, both in cell culture and in living organisms.

#### Justification and evidence for answer

Many indicators suggest a positive answer to the CQ, especially within the Coauthorship Graph, Time Series and Funding groups (see below).

|   | Time series   |        |      |       |             |      |        |  |  |  |  |  |
|---|---|--------|------|-------|-------------|------|--------|--|--|--|--|--|
| Coauthorship Graph  | A time series is a sequence of data points measured at successive time instants spaced at uniform time intervals (in our case, years). Time series analysis looks at the way that various functions of the RDG behave overtime.                 |        |      |       |             |      |        |  |  |  |  |  |
| Click for detailed view   | The time series for number of papers and number of unique authors have very high<br>slopes, indicating a lively community of practice which evolves over time. The<br>number of in-citations and out-citations also progress visibly over time. |        | Time | serie | s: RNAi     |      |        |  |  |  |  |  |
| The coauthorship graph for RNAi spans 520 authors, and it has the properties of a small-world network connected network with a high clustering coefficient as well as a reasonably high power law coefficient   | Time series indicators are very important when determining the answer for CO1. In sec<br>this case, they clearly suggest a positive answer.   |        | /    | _     | /           |      |        |  |  |  |  |  |
| Coauthorship graph indicators are the most powerful when determining the answer for CQ1, and in this positive answer.   |   | -      | _    |       |             |      |        |  |  |  |  |  |
|   | 404<br>100<br>200   |        |      | /     | -           |      | _      |  |  |  |  |  |
| Time Series   | 100   |        |      |       |             |      | $\leq$ |  |  |  |  |  |
| Click for detailed view   |   | 200    |      | 100/  | 2008        | 2009 | 2010   |  |  |  |  |  |
|   | — Jada ( v  | 500    |      | 00    | 200         | 800  | 1500   |  |  |  |  |  |
| The time series for number of papers and number of unique authors have very high slopes, indicating   | in citation   | e 600  |      | 000   | 7500        | 8500 | 8500   |  |  |  |  |  |
| The number of in-citations and out-citations also progress visibly over time.   |   | ns 100 | -    | 700   | 2500<br>395 | 2700 | 2800   |  |  |  |  |  |
| The number of informations and out offations also progress visibly over time.   |   | 3 3    |      | 3     | 4           | 3    | 4      |  |  |  |  |  |
| Time and a finite second se |   | -      |      | -     |             |      |        |  |  |  |  |  |

EG



- Five year, fundamental research program
- Teams under contract since August 2011
  - BAE Systems
  - Columbia University
  - Raytheon BBN
  - SRI International

|                     | FY | Y FY 12 |    |    |    | FY13 |           |            |           | FY 14     |    |            |           | FY 15 |            |    |           | FY16 |           |            |           |
|---------------------|----|---------|----|----|----|------|-----------|------------|-----------|-----------|----|------------|-----------|-------|------------|----|-----------|------|-----------|------------|-----------|
|                     | 11 | Q1      | Q2 | Q3 | Q4 | Q1   | <b>Q2</b> | <b>Q</b> 3 | <b>Q4</b> | <b>Q1</b> | Q2 | <b>Q</b> 3 | <b>Q4</b> | Q1    | <b>Q</b> 2 | Q3 | <b>Q4</b> | Q1   | <b>Q2</b> | <b>Q</b> 3 | <b>Q4</b> |
| Phase 1 (18 Months) |    |         |    |    | T  |      |           |            |           |           |    |            |           |       |            |    |           |      |           |            |           |
| Base Period         |    |         |    |    |    |      |           |            |           |           |    |            |           |       |            |    |           |      |           |            |           |
| Evaluation          |    |         |    |    |    | ٠    | -         |            |           |           |    |            |           |       |            |    |           |      |           |            |           |
| Phase 2 (15 months) |    |         |    |    | Т  |      |           |            |           |           |    |            |           |       |            |    |           |      |           |            |           |
| Option Period 1     |    |         |    |    |    |      |           |            |           |           |    |            |           |       |            |    |           |      |           |            |           |
| Evaluation          |    |         |    |    |    |      |           |            |           |           | ٠  | •          |           |       |            |    |           |      |           |            |           |
| Phase 2 (15 months) |    |         |    |    |    |      |           |            |           |           |    |            |           |       |            |    |           |      |           |            |           |
| Option Period 2     |    |         |    |    |    |      |           |            |           |           |    |            |           |       |            |    |           |      |           |            |           |
| Evaluation          |    |         |    |    |    |      |           |            |           |           |    |            |           |       |            | ٠  |           |      |           |            |           |
| Phase 3 (12 months) |    |         |    |    |    |      |           |            |           |           |    |            |           |       |            |    |           |      | •         |            |           |
| Option Period 3     |    |         |    |    |    |      |           |            |           |           |    |            |           |       |            |    |           |      |           |            |           |
| Evaluation          |    |         |    |    |    |      |           |            |           |           |    |            |           |       |            |    |           |      |           | ٠          | •         |
| Live Demonstration  |    |         |    |    |    |      |           |            |           |           |    |            |           |       |            |    |           |      |           |            |           |
| Complete Program    |    |         |    |    |    |      |           |            |           |           |    |            |           |       |            |    |           |      |           |            | -         |

- Formal test and evaluation to begin October 2012, three additional rounds of formal evaluation scheduled
  - Case Studies, Eight Examples: Tissue Engineering, Cold Fusion, RF Metamaterials, DNA Microarrays, Genetic Algorithms, RNAi, Steganography, Horizontal Gene Transfer



# If you had a system that could

# (a) reliably identify what technical capabilities are emerging and (b) provide humanly understandable evidence explanation then

# how would you use this tool?

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# How might an IARPA PM use FUSE?

- Idea development (a problem space)
  - Optimal emergence state for an R&D program
  - Hype versus reality
  - New enabling component capabilities
  - Signs of potential convergence
  - Overlap with past and existing efforts
  - Why is this innovative?
- Program impact assessment
  - Impact within the research community
  - Application development or potential



# Would the components of FUSE enable a new capability or enhance an existing workflow?



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- Connecting disparate communities with lots of data sows the seeds for much discovery
  - Social science, emergence theory, Natural Language Processing (NLP), etc.
- Scientific, Technical, and Patent literatures are new genres

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- Most Natural Language Processing (NLP) trained on news wire
- Foreign language tokenization, etc., too

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- Novel extrinsic test for technical emergence
  - Measuring detection of emergence (S&T)
  - Not measuring NLP metric X (internal measures)
- Challenging scale, but tractable
  - Concept extraction, within/cross-doc linkages
  - Currently growing on order 800k/mo. (sci lit + patents), FUSE has ~75-80% filed patents & ~10% sci lit (1980-2010)
- Automated evidence explanation is really challenging, but exciting
- Synthesize & Scan "Horizon", not Search

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# **Anticipated Impact**

## Scientific & Technical Analysis Impact

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- Relevant, timely, and bias-controlled <u>analytic force multiplier</u> to maintain technical vigilance, across all disciplines and multiple languages
- Discover previously unknown emergence signals of interest at speed, scale, and comprehensiveness that <u>exceeds human capacity</u>

## Technical Impact

- Generalized and validated theories of technical emergence
- New cross-document conceptual feature extraction technologies
- Progress in computer-generated evidence representations for human use

## Secondary Impact

- Improved priority filter for USG investment strategies and policy



## The FUSE Team



• Plus FFRDC & gov orgs



## Questions



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