

Structure of the Anthrax Research Literature

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ABSTRACT

Text mining was used to extract technical intelligence from the open source global anthrax research literature. An anthrax-focused query was applied to the *Science Citation Index/Social Science Citation Index (SCI/SSCI)* (SCI, 2006) databases. The anthrax research literature infrastructure (prolific authors, key journals/institutions/countries, most cited authors/journals/ documents) was obtained using bibliometrics, and the anthrax research literature technical structure (hierarchical taxonomy) was obtained using computational linguistics/document clustering.

Keywords: Anthrax, *Bacillus anthracis*, anthraxin, bioterrorism, biowarfare, bioweapons, biological weapons, biodefence, biosecurity, biosurety, information technology, text mining, bibliometrics, citation analysis, computational linguistics, clustering, taxonomy

1. INTRODUCTION

Bio-terrorism has become a major concern for the US in the post-9/11 era. The mailings of letters containing spores of *Bacillus anthracis* to the media and members of the US Congress in September and October 2001 resulted in 22 cases of anthrax with 5 deaths, closed part of the US government's operations, and terrorised the American public¹⁻³. Importantly, this event affected numerous countries⁴ and there are now major world-wide efforts devoted to countering bio-terrorism (and other potential weapons of mass destruction (WMD), such as chemical and nuclear).

One of the less tangible weapons in the arsenal to combat bio-terrorism is intelligence. This has myriad forms, including the direct use of humans to access information, use of sophisticated computer systems to track infrastructure and resource movements, and development of technologies to detect, neutralise, shield and vaccinate against bio-warfare agents. The goal of the present study is to use text mining to extract technical intelligence from the anthrax research literature.

2. BACKGROUND

The study consists of two components: text mining and anthrax. The comprehensive anthrax and text mining backgrounds are described by Kostoff⁵, *et al.*

A typical text mining study of the published literature develops a query for comprehensive information retrieval, processes the database using computational linguistics and bibliometrics, and integrates the processed information. For recent studies in which the databases consist of journal article abstracts and associated bibliometric information (authors, journals, addresses, etc.), the final results have

included not only identification of the infrastructure (key authors, journals, institutions), but relationships among the technical themes and authors, journals, and institutions as well^{6,7}.

As a result of renewed interest in anthrax, there have been a number of recent review articles that have provided comprehensive and complementary perspectives on this disease⁸⁻¹⁵. These review articles are structured along traditional lines in that they cover the etiology and pathogenic mechanisms of anthrax, addressing both biological and medical considerations. However, none of these reviews address the infrastructure and technology structure of the anthrax research literature that text mining can provide.

In recent years, especially since the anthrax attack of 2001¹, there has been increased concern over the use of *B. anthracis* and other potentially lethal microorganisms for bio-terrorism. For this reason, related research papers that address various aspects of bio-terrorism have been retained in the database.

3. MATERIALS AND METHODS

The 'anthrax research literature' was defined as published open-literature papers that focused on theoretical, laboratory, biological, clinical, and epidemiological aspects of anthrax, and emphasized the original research literature (Articles) accessed by the *Science Citation Index (SCI)* and *Social Science Citation Index (SSCI)*. The anthrax literature was defined operationally by the following query: "anthrax OR anthracis OR anthraxin", where 'anthraxin' refers to a skin test that detects anthrax cell-mediated immunity.

The iterative search approach of simulated nucleation¹⁶ was used to generate the search query listed above, and

then retrieve the relevant records from the *SCI/SSCI* covering the time period from 1991 through 2005 (some bibliometrics updated to 2007). The results of this search were analysed for publication trends, authors, journals, institutions, countries, and citations.

Document clustering^{17,18} was used to identify the anthrax literature sub-themes and numbers of records (levels of emphasis) associated with each sub-theme. Sixty-four individual clusters were chosen for the database¹⁹ (1991-2005 articles retrieved from the *SCI/SSCI*). The clusters are summarized here, and are presented in detail in Kostoff⁵, *et al.* CLUTO¹⁷ was used to agglomerate the 64 clusters in a hierarchical tree (taxonomy) structure.

4. RESULTS AND DISCUSSION

4.1 Publication Trends

Figure 1 shows the number of *SCI/SSCI* articles retrieved with the above query as a function of time. As the threat of terrorism has increased, the number of research papers per year has increased substantially, and is now an order of magnitude larger than in the early 1990s.

The majority of the anthrax research articles originated in seven countries. The major country producers of anthrax research articles were the USA and France. More significantly, in the seven years since 2000, the anthrax research articles produced in the USA went from ~2.5 times the number of research articles as its nearest competitor to more than 12

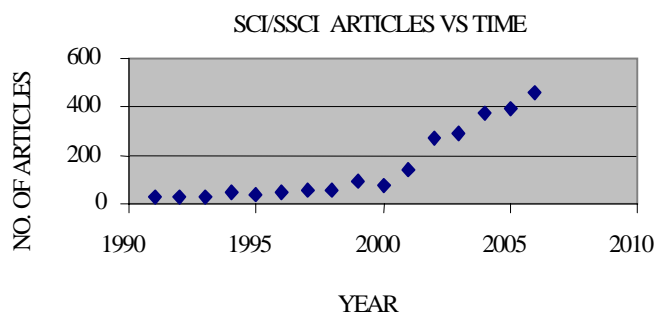


Figure 1. *SCI/SSCI* articles versus time.

times its nearest competitor, reflecting the enhanced investments of the US funding agencies.

4.2 Author Frequency Results

Table 1 lists the 21 authors with the greatest number of anthrax research papers published between 1991 and mid-2007.

Three authors (Leppla, Mock, and Collier) account for 35 per cent of the total number of articles (N=681) published by this group of authors. Thirteen (62 %) of the authors were from the USA, two from France, two from India, and one each from Italy, Norway, UK, and Canada. In previous text mining studies, either the majority or all of the most prolific authors were from universities. However, in the present study, 10 (48 %) of the authors were from research

Table 1. Most prolific anthrax research authors (1991-Mid-2007)

| Author | Institution | Country | No. of Papers |
|-------------------|---------------------------------|---------|---------------|
| Leppla, S.H. | NIH | USA | 92 |
| Mock, M. | Institute Pasteur | France | 77 |
| Collier, R.J. | Harvard Univ | USA | 68 |
| Keim, P. | Northern Arizona Univ | USA | 38 |
| Friedlander, A.M. | US Army - Medical Research Inst | USA | 36 |
| Fouet, A. | Institute Pasteur | France | 33 |
| Bhatnagar, R. | Jawaharlal Nehru Univ | India | 30 |
| Little, S.F. | US Army - Medical Research Inst | USA | 27 |
| Koehler, T.M. | University of Texas | USA | 26 |
| Quinn, C.P. | CDC | USA | 26 |
| Singh, Y. | Centre Biochem Tech | India | 25 |
| Hanna, P.C. | University of Michigan | USA | 23 |
| Turnbull, P.C.B. | Arjemptur Tech, Ltd | UK | 23 |
| Ivins, B.E. | US Army - Medical Research Inst | USA | 22 |
| Montecucco, C. | University of Padua | Italy | 22 |
| Popovic, T. | CDC | USA | 22 |
| Tang, W.J. | University of Chicago | USA | 21 |
| Moayeri, M. | NIH | USA | 19 |
| Baillie, L.W.J. | University of Maryland | USA | 17 |
| Kolsto, A.B. | University of Oslo | Norway | 17 |
| Mogridge, J. | University of Toronto | CA | 17 |

Table 2. Most cited first authors

| Author | Current institution | Country | # Cites |
|-------------------|------------------------|---------|---------|
| Leppla, S.H. | NIH | USA | 662 |
| Friedlander, A.M. | US Army - Med Res Inst | USA | 429 |
| Turnbull, P.C.B. | Arjemptur Tech, Ltd | UK | 416 |
| Inglesby, T.V. | Johns Hopkins Univ | USA | 346 |
| Ivins, B.E. | US Army - Med Res Inst | USA | 321 |
| Welkos, S.L. | US Army - Med Res Inst | USA | 254 |
| Singh, Y. | Centre Biochem Tech | India | 248 |
| Duesbery, N.S. | Van Andel Res Inst | USA | 241 |
| Hanna, P.C. | Univ Michigan | USA | 236 |
| Milne, J.C. | Harvard | USA | 232 |
| Little, S.F. | US Army - Med Res Inst | USA | 224 |
| Klimpel, K.R. | NIH | USA | 224 |
| Dixon, T.C. | Duke Univ | USA | 217 |
| Brachman, P.S. | Emory Univ | USA | 203 |
| Keim, P. | Northern Arizona Univ | USA | 191 |
| Helgason, E. | University of Oslo | Norway | 179 |
| Pezard, C. | Institute Pasteur | France | 175 |
| Vitale, G. | Univ of Udine | Italy | 169 |
| Mock, M. | Institute Pasteur | France | 168 |
| Uchida, I. | Natl Inst Anim Hlth | Japan | 165 |

institutions. Of the remaining authors, 10 (48%) were from universities, and one (Turnbull) is from industry.

4.3 Author Citation Results

4.3.1 Most Cited First Authors

The 21 authors receiving the most total citations from the articles in the retrieved database are listed in Table 2.

Thirteen of these first authors are from the USA, five are from Western Europe, and two are from Asia. Eight of the authors are from universities, 11 are from research institutions, and one is from industry. Past text-mining studies^{20,21} have shown that cited documents tend to be at a more fundamental level than the citing papers. Thus, there is a big proportion of authors from research institutions relative to those from universities [who are engaged in more fundamental (basic) research] is again in stark contrast to these previous text mining studies. One more difference from the past text mining studies is that 10 of the 24 most prolific authors appear with the 20 most-cited first authors. In the past text mining studies (Kostoff, *et al.* 1999, 2002), perhaps one or two authors would be in common between the two lists. The reasons for this high degree of overlap are not clear, but may reflect a highly in-bred community. It may also reflect the relatively high fraction of research institutes, where typically (not always) researchers have a higher first author fraction than from universities.

A caveat is that the *SCI* downloads citations by first author only. Thus, authors who may publish many papers, but who tend to get listed behind the first author, will be under-represented in this tabulation.

To identify the authors most associated with the highly cited papers, the 100 anthrax-related documents cited most

Table 3. Authors appearing on the 100 most cited anthrax papers

| Author | No. of Papers |
|-------------------|---------------|
| Collier, R.J. | 16 |
| Leppla, S.H. | 15 |
| Mock, M. | 10 |
| Klimpel, K.R. | 8 |
| Friedlander, A.M. | 7 |
| Hanna, P.C. | 6 |
| Fraser, C.M. | 5 |
| Jiang, L.X. | 5 |
| Koehler, T.M. | 5 |
| Arora, N. | 4 |
| Ivins, B.E. | 4 |
| Keim, P. | 4 |
| Kolsto, A.B. | 4 |
| Little, S.F. | 4 |
| Okstad, O.A. | 4 |
| Read, T.D. | 4 |
| Andersen, G.L. | 3 |
| Fouet, A. | 3 |
| Fouts, D.E. | 3 |
| Helgason, E. | 3 |
| Jackson, P.J. | 3 |
| Milne, J.C. | 3 |
| Mogridge, J. | 3 |
| Montecucco, C. | 3 |
| Mourez, M. | 3 |
| Pitt, M.L.M. | 3 |
| Popovic, T. | 3 |
| Quinn, C.P. | 3 |
| Ravel, J. | 3 |
| Vitale, G. | 3 |

*totals are > 100 due to multiple authorship

highly (as listed in the *SCI*) were retrieved (in January 2007), and the author frequency was extracted. This method of author extraction included all of the authors, and was not limited to the first author. The central authors are clearly evident from these results (Table 3). Many more bibliometric quantities were extracted for the 100 most cited anthrax papers. Kostoff ⁵ *et al.* have done detailed analyses of these bibliometrics.

The citation data for authors in Table 2 represent citations generated only by the specific records extracted from the *SCI/SSCI* database for this study. These data do not represent all of the citations received by these papers as they could have been cited additionally by papers in other technical disciplines. The next metric provides examples of the magnitude of these differences.

4.4 Most Cited Documents

Table 4 lists the 20 most cited documents. The column headed '#Cites' reflects the citations from the retrieved documents only, whereas the column headed 'Total *SCI* Cites' reflects citations from all documents contained in

Table 4. Twenty most cited anthrax document references.

| Document Reference | #Cites | Total SCI cites | Max JRNL cites |
|---|--------|-----------------|----------------|
| DUESBERY, N.S., 1998, <i>SCIENCE</i> , V280, P734 (<i>Proteolytic inactivation of mapkk by anthrax lethal factor</i>) | 196 | 297 | 2659 |
| LEPPLA, S.H., 1982, <i>P NATL ACAD SCI USA</i> , V79, P3162 (<i>Anthrax toxin edema factor</i>) | 190 | 357 | 3943 |
| FRIEDLANDER, A.M., 1986, <i>J BIOL CHEM</i> , V261, P7123 (<i>Mmacrophage sensitivity to anthrax lethal toxin</i>) | 178 | 255 | 1745 |
| DIXON, T.C., 1999, <i>NEW ENGL J MED</i> , V341, P815 (<i>Anthrax</i>) | 173 | 270 | 5067 |
| INGLESBY, T.V., 1999, <i>JAMA-J AM MED ASSOC</i> , V281, P1735 (<i>Anthrax as bio-weapon-medical management</i>) | 167 | 293 | 871 |
| PETOSA, C., 1997, <i>NATURE</i> , V385, P833 (<i>Anthrax toxin protective antigen crystal structure</i>) | 146 | 272 | 2749 |
| GREEN, B.D., 1985, <i>INFECT IMMUN</i> , V49, P291 (<i>Capsule plasmid in bacillus-anthraxis</i>) | 123 | 189 | 266 |
| KLIMPEL, K.R., 1992, <i>P NATL ACAD SCI USA</i> , V89, P10277 (<i>Anthrax toxin protective antigen protease activation</i>) | 123 | 211 | 2338 |
| BRADLEY, K.A., 2001, <i>NATURE</i> , V414, P225 (<i>Identification of the cellular receptor for anthrax toxin</i>) | 121 | 181 | 4733 |
| HELGASON, E., 2000, <i>APPL ENVIRON MICROB</i> , V66, P2627 (<i>Bacillus anthracis, bacillus cereus, and bacillus thuringiensis - one species</i>) | 121 | 194 | 194 |
| MILNE, J.C., 1994, <i>J BIOL CHEM</i> , V269, P20607 (<i>Oligomer formation by anthrax protective antigen</i>) | 121 | 173 | 1458 |
| JERNIGAN, J.A., 2001, <i>EMERG INFECT DIS</i> , V7, P933 (<i>Bioterrorism-related inhalational anthrax</i>) | 120 | 196 | 196 |
| INGLESBY, T.V., 2002, <i>JAMA-J AM MED ASSOC</i> , V287, P2236 (<i>Anthrax as a biological weapon</i>) | 113 | 175 | 2656 |
| MESELSON, M., 1994, <i>SCIENCE</i> , V266, P1202 (<i>The sverdlovsk anthrax outbreak of 1979</i>) | 112 | 245 | 2620 |
| MOCK, M., 2001, <i>ANNU REV MICROBIOL</i> , V55, P647 (<i>Anthrax</i>) | 111 | 149 | 316 |
| PEZARD, C., 1991, <i>INFECT IMMUN</i> , V59, P3472 (<i>Contribution of individual toxin components to virulence of bacillus-anthraxis</i>) | 109 | 139 | 492 |
| SAMBROOK, J., 1989, <i>MOL CLONING LAB MANU</i> (<i>Molecular cloning lab manual</i>) | 105 | >75000 | NA |
| HANNA, P.C., 1993, <i>P NATL ACAD SCI USA</i> , V90, P10198 (<i>Macrophage role in anthrax</i>) | 103 | 156 | 2086 |
| MIKESELL, P., 1983, <i>INFECT IMMUN</i> , V39, P371 (<i>Plasmid-mediated toxin production in bacillus-anthraxis</i>) | 97 | 172 | 477 |
| READ, T.D., 2003, <i>NATURE</i> , V423, P81 (<i>The genome sequence of bacillus anthracis ames</i>) | 96 | 181 | 554 |

the *SCI/SSCI* database. Finally, the right-most column labeled 'Max JRNL Cites' is the maximum number of citations received by any paper published in that journal for that year. Thus, the first paper listed (published in *Science* in 1998) was cited 196 times by other papers in the retrieved anthrax-specific database, and was cited 297 times by all the papers in the *SCI/SCSI*. The highest cited paper published in *Science* in 1998 received 2659 cites (citation data circa early 2006).

In general, the most cited anthrax documents receive relatively low numbers of citations (<10 of the highest

cited papers) when published in the broad multi-disciplinary journals (e.g., *Science*, *Nature*), but seem to perform much better when published in specialty journals (e.g., *Infection and Immunity*, *Annual Review of Microbiology*).

The twenty most cited publications appear to be highly applied. Additionally, the ratio of citations by other papers in the retrieved anthrax database to total citations as listed in the *Science Citation Index* (the ratio of the left to middle numerical columns) is, on average, higher than in previous text mining studies conducted by the first author. This reflects the highly applied literature, where most of the

citing papers are within the focused topical area, and the highly cited documents are not sufficiently fundamental to be cited outside the specific anthrax literature of interest (with exceptions, e.g., Sambrook's Manual).

The twenty most cited documents can be divided into four topical groups. The largest group contains nine documents (45) focused on the three proteins (PA, EF, and LF) that comprise the two binary anthrax toxins (LT [PA + LF] and ET [PA + EF]). The next largest groups consist of five documents focused on bio-terrorism, post-exposure prophylaxis and medical management of anthrax and five documents focused on broader biological aspects of *B. anthracis* and its pathogenesis. These documents have a medical, epidemiological, and highly experimental focus. Fundamental theory, computer modelling, and access to other literatures are not evident from the citations.

4.5 Journals with Most Anthrax Research Papers

Table 5 presents the 20 scientific journals publishing the most anthrax research papers.

Infection and immunity stands out in terms of the number of papers published, with 50 more papers than its nearest competitor. Many of the journals are highly specialised, and appear quite applied. The technical emphases of these journals are medicine (primarily infectious diseases), microbiology, and chemistry.

Two time bands of publications were analysed: pre 2001, and post 2000. Journals that published substantially more papers after 2000 included *Emerging Infectious Diseases*, *Journal of Clinical Microbiology*, *Biochemical and Biophysical Research*

Table 5. Journals containing most anthrax research papers (1991-mid-2007)

| Journal | # Papers | | |
|--|----------|-------|-------|
| | <2001 | >2000 | Total |
| <i>Infection and Immunity</i> | 39 | 118 | 157 |
| <i>Journal of Bacteriology</i> | 14 | 87 | 101 |
| <i>Applied and Environmental Microbiology</i> | 13 | 79 | 92 |
| <i>Journal of Biological Chemistry</i> | 15 | 69 | 84 |
| <i>Vaccine</i> | 11 | 73 | 84 |
| <i>Proceedings of the National Academy of Sciences of the United States of America</i> | 14 | 61 | 75 |
| <i>Journal of Applied Microbiology</i> | 39 | 29 | 68 |
| <i>Emerging Infectious Diseases</i> | 5 | 61 | 66 |
| <i>Journal of Clinical Microbiology</i> | 7 | 50 | 57 |
| <i>Biochemical and Biophysical Research Communications</i> | 4 | 44 | 48 |
| <i>Fems Microbiology Letters</i> | 16 | 23 | 39 |
| <i>Analytical Chemistry</i> | 1 | 37 | 38 |
| <i>Molecular Microbiology</i> | 15 | 19 | 34 |
| <i>Biochemistry</i> | 9 | 24 | 33 |
| <i>Antimicrobial Agents and Chemotherapy</i> | 0 | 29 | 29 |
| <i>Journal of Infectious Diseases</i> | 1 | 22 | 23 |
| <i>Clinical Infectious Diseases</i> | 5 | 17 | 22 |
| <i>Biosecurity and Bioterrorism-Biodefense Strategy Practice and Science</i> | 0 | 21 | 21 |
| <i>Cellular Microbiology</i> | 2 | 19 | 21 |

Table 6. Most cited journals in the anthrax literature (1991-2005)

| Journal | # Cites |
|---|---------|
| <i>Infection and Immunity</i> | 2829 |
| <i>Journal of Bacteriology</i> | 2585 |
| <i>Journal of Biological Chemistry</i> | 2347 |
| <i>Proc of the National Academy of Sciences- USA</i> | 2049 |
| <i>Nature</i> | 1365 |
| <i>Science</i> | 1286 |
| <i>Molecular Microbiology</i> | 1286 |
| <i>Applied Environmental Microbiology</i> | 1154 |
| <i>JAMA-Journal of the American Medical Association</i> | 1120 |
| <i>Journal of Clinical Microbiology</i> | 799 |
| <i>Biochemistry-US</i> | 738 |
| <i>Vaccine</i> | 723 |
| <i>Emerging Infectious Diseases</i> | 721 |
| <i>MMWR-Morbid Mortal W</i> | 592 |
| <i>FEMS Microbiology Letters</i> | 564 |
| <i>Nucleic Acids Research</i> | 561 |
| <i>New England Journal of Medicine</i> | 519 |
| <i>Journal of Applied Microbiology</i> | 518 |
| <i>Gene</i> | 511 |
| <i>Journal of Infectious Diseases</i> | 488 |

Communications, Analytical Chemistry, Antimicrobial Agents and Chemotherapy, Journal of Infectious Diseases, and Biosecurity and Bioterrorism. Journals that published substantially fewer papers after 2000 included *Journal of Applied Microbiology, FEMS Microbiology Letters, and Molecular Microbiology.* The latter are all microbiology journals, while the former cover a broader variety of topics.

4.6 Most Cited Journals

Table 6 contains the 20 journals cited most frequently in the specific records extracted for this study.

The journals can be divided into four major groups. The first group comprises four most cited journals (*Infection and Immunity, Journal of Bacteriology, Journal of Biological Chemistry, and Proceedings of the National Academy of Sciences*); the second group contains the next five journals (*Nature, Science, Molecular Microbiology, Applied and Environmental Microbiology, and JAMA*); the third group contains the next four journals (*Journal of Clinical Microbiology, Biochemistry-US, Vaccine, and Emerging Infectious Diseases*); and the fourth group contains the remainder. The first group and most of the second group consist of basic science journals, whereas about half of the third and fourth groups address clinical/epidemiological/public health-related issues.

4.7 Institutions Producing Most Anthrax Research Papers

The 21 institutions producing the most anthrax research papers are shown in Table 7.

Table 7. Institutions producing most anthrax research papers (1991-2005)

| Institution | Country | # Papers | | |
|---|---------|----------|-------|-------|
| | | <2001 | >2000 | Total |
| US Army | USA | 46 | 99 | 145 |
| NIH | USA | 32 | 101 | 133 |
| Institute Pasteur | FRANCE | 65 | 42 | 107 |
| Harvard University | USA | 27 | 62 | 89 |
| CDC | USA | 4 | 85 | 89 |
| University of Texas | USA | 11 | 32 | 43 |
| US Navy | USA | 4 | 37 | 41 |
| Johns Hopkins University | USA | 3 | 29 | 32 |
| Northern Arizona University | USA | 13 | 17 | 30 |
| US FDA | USA | 1 | 26 | 29 |
| University of Maryland | USA | 5 | 20 | 25 |
| Jawaharlal Nehru University | INDIA | 4 | 20 | 24 |
| University of Chicago | USA | 1 | 22 | 23 |
| University of Michigan | USA | 4 | 18 | 22 |
| Louisiana State University | USA | 11 | 10 | 21 |
| University of Padua | ITALY | 11 | 8 | 19 |
| Israel Institute of Biological Research | ISRAEL | 1 | 17 | 18 |
| Public Health Lab Service | UK | 17 | 1 | 18 |
| Stanford University | USA | 1 | 17 | 18 |
| Emory University | USA | 1 | 15 | 16 |
| University of Oklahoma | USA | 0 | 16 | 16 |
| Lawrence Livermore National Laboratory | USA | 0 | 16 | 16 |

Five of the top 10 are government research institutions, and seven of the top 22 are government laboratories. The total number of papers was divided into those published pre-2001 and post-2000. Institute Pasteur was the most prescient of the leading producers, having generated about 2/3 of its articles before 2001. Other forward-looking organisations in this field include Northern Arizona University, Louisiana State University, and University of Padua. The bulk of the organisations (those with 5 or less articles pre-2001) increased their rate of publication of anthrax articles reactively after the anthrax attacks in the USA in 2001.

Five institutions stand out in terms of productivity: US Army (including all variants); NIH (including all institutes); Institute Pasteur; Harvard University; and CDC (a public health agency-includes all variants).

Thirteen are universities, and the others are research institutions (with the exception of CDC). The fraction of research institutions is much higher than in previous text mining studies^{6,20,21}. Seventeen of these prolific institutions are located in the USA. Of the remaining four, two are in Western Europe, and one is in India and Israel apiece.

To identify preferred institutional publishing venues, an institution-journal co-occurrence matrix was generated. Based on the leading journals in which the anthrax research is published it can be deduced. The US Army emphasizes vaccines and microbiology; NIH emphasizes biochemistry and infection; Institute Pasteur emphasizes bacteriology,

Table 8. Countries producing most anthrax research papers (2005-mid-2007).

| Country | # Papers |
|-------------|----------|
| USA | 1821 |
| France | 189 |
| England | 180 |
| Germany | 125 |
| Canada | 92 |
| India | 80 |
| Italy | 68 |
| Israel | 54 |
| Japan | 54 |
| South Korea | 52 |
| P. R. China | 40 |
| Australia | 36 |
| Turkey | 35 |
| Netherlands | 29 |
| Norway | 29 |
| Russia | 28 |
| Belgium | 27 |
| Switzerland | 27 |
| Brazil | 20 |
| Denmark | 18 |

microbiology, and infection; Harvard emphasises biochemistry and infection; and CDC emphasises the public health aspects of infectious diseases and epidemiology.

4.8 Countries Producing Most Anthrax Research Papers

The 20 countries producing the most anthrax research papers are shown in Table 8.

The USA has dominated the output, contributing over 64 of the open research article literature on anthrax (N=2858) between 1991 and 2007. Following are France (N=189), England (N=180), and Germany (N=125), with other countries far behind. The low numbers of articles from China are interesting. In recent text mining studies of different technical disciplines (e.g., Kostoff⁶, *et al*), China has been near the top in country, institution, and author listings. Here, China appears 11 in the top 20 countries.

5. COMPUTATIONAL LINGUISTICS RESULTS

5.1 Anthrax Taxonomy

The first three levels of the hierarchical taxonomy of the retrieved anthrax literature are presented in Table 9. The following describe the first two levels of the hierarchical taxonomy of the anthrax literature. Subsequently, the third level is treated as a flat taxonomy (eight separate non-hierarchical categories). The themes of the elemental clusters in each category are shown in greatly expanded form, including bibliometrics for each cluster, in Kostoff⁵, *et al*.

The first taxonomy level (N=1779 records with abstracts) can be sub-divided into two categories: Anthrax clinical medicine/animal epidemiology; bio-terrorism (N=461 records)

Table 9. Anthrax literature taxonomy (records with abstracts - 1991-2005)

| Level I | Level II | Level III |
|---|--|---|
| Anthrax clinical medicine/ animal epidemiology; bio-terrorism (461) | Anthrax bioterrorism (219) | Biological agent threat/ attack/ detection (97) Planning/ surveillance/ communication/ preparedness/ response for bioterrorist attacks (122) |
| | Anthrax clinical medicine/ animal epidemiology (242) | Evolution, transmission, and impact of infectious disease on animal populations (108) Inhalation and cutaneous anthrax, and anthrax meningitis and meningoencephalitis (134) |
| Anthrax biology (1318) | Anthrax spore detection/ prevention (956) | Vaccination/ immunisation and spore detection (498) <i>Bacillus cereus/ anthracis</i> strain identification (458) |
| | Toxin lethality pathways (362) | Binding of anthrax lethal toxin to host cell receptors (228) |
| | | Lethal toxin inactivation of macrophages and protein kinase (134) |

and anthrax biology (N=1318 records). The anthrax clinical medicine/animal Epidemiology; bio-terrorism category focuses on anthrax patient modalities of treatment, as well as more general public health preparedness and emergency care issues resulting from potential bio-terrorist attacks. The anthrax biology category focuses on the mechanisms and pathways, from detection to final intoxication. The boundaries between the two categories are relatively sharp, reflecting the quality of the clustering approach used, and especially the tripling of trivial words compared to past text mining studies.

For the second level taxonomy, each first level category is divided into two sub-categories. Anthrax Clinical Medicine/ Animal Epidemiology; Bioterrorism is divided into Anthrax Bioterrorism (N=219 records) and Anthrax Clinical Medicine/ Animal Epidemiology (N=242 records), while Anthrax Biology is divided into Anthrax Detection/ Prevention (N=956 records) and Toxin Lethality Pathways (N=362 records). The Anthrax Bioterrorism category focuses on potential public health responses to bio-terrorist attacks such as preparedness, emergency care, and the required underlying logistics, while the Anthrax clinical medicine/ animal epidemiology category focuses on non-bioterrorism clinical medicine and bioterrorism case studies in treating anthrax. The Anthrax detection/ prevention category focuses on vaccine development for protection and spore/strain identification for detection, while the toxin lethality pathways category focuses on the binding, activation, and delivery of the toxins to the cell at both the aggregate toxin level and the component factor level.

The second level categories are further sub-divided to form eight third level categories. The third level is discussed in detail, including themes and metrics, by Kostoff⁵, *et al.*

In summary, the open anthrax scientific literature has expanded enormously since the terrorist attacks in the USA in 2001, with much of the expansion coming from the USA itself. In contrast to some of the emerging physical sciences areas like nanotechnology, the leading nations in anthrax paper production (and most cited papers as well) are the Western democracies, not the Far Eastern nations.

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