Università degli Studi di Trieste

Corso di Laurea Magistrale in INGEGNERIA CLINICA

NATURAL LANGUAGE PROCESSING: ESEMPIO APPLICATIVO

Corso di Informatica Medica

Docente Sara Renata Francesca MARCEGLIA





DA DOCUMENTO NON STRUTTURATO...

EXAMPLE 1 - Medical report at enrollment visit

Piacenza, Nov 12, 2015

Case History. Mr. John Doe complains having <u>difficulty in hearing</u> in both ears since 10 years ago when he had a car accident resulting in <u>head injury</u>. He suffers from <u>diabetes type 2</u>, <u>hypertension</u> and <u>arteriosclerosis</u>. He reports <u>tinnitus</u> in both ears since last 2 years. He was diagnosed with <u>Meniere</u>. <u>No family history of hearing loss</u>.

Mr. Doe denies ear pain, ear fullness and balance problems.

Evaluation.

Otoscopic inspection: normal bilaterally

Immittance: type A bilaterally

Pure tone audiometry: bilateral sensorineural hearing loss at 2000-8000 Hz, moderate at right ear, profound at

left ear.

Speech audiometry: max intelligibility 100% at 60 dB right ear and 0% at 90 dB at left.

Word discrimination: 80% Word recognition: 85%

Sound field speech audiometry in noise: max intelligibility 35%, S/N 5 dB.

CT scan: normal MRI: normal

Psychometric Results

Impact of tinnitus: THI score 76, grade 4

Conclusions

Based on history and current exams, Mr. Doe has a <u>bilateral sensorineural hearing loss</u> of <u>profound degree</u> for the <u>left ear</u> with <u>Meniere disease</u> and <u>tinnitus</u>. It is recommended to have a <u>cochlear implant</u> at the <u>left ear</u>.



... A DOCUMENTO STRUTTURATO

Section	Sub-section	Coded concept	Auditory disorders	Risk factor group
			axis (and sub-class)	
Medical history	Presenting complaint(s)	[C1384666] Hearing impairment	Hearing disorder ()	-
evidences	Significant	[C0011860] Diabetes Mellitus, Non-	=	General medical
	diseases/illnesses/disor	Insulin-dependent		conditions
	ders/signs having still	[C0020538] Hypertensive disease	-	General medical
	present relevance		6	conditions
		[C0003850] Arteriosclerosis	=	Vascular disease
		[C0040264] Tinnitus	Hearing disorder ()	-
		[C0025281] Meniere Disease	Ear disorders	
			(peripheral vertigo)	
	Traumatic injuries	[C0744612] Head injury trauma	-	General medical
				conditions
	Family history of HL	None	-	
Examinations -	Audiometric thresholds	Date: 2015/11/12.	Hearing disorder	-
audiometric	for tones	Diagnostic procedure: [C2022139]	(hearing loss)	
		Pure tone threshold audiogram.	140%	
		Type of HL: [C0018784]		
		Sensorineural Hearing Loss (disorder).		
		Laterality: [C0238767] Bilateral.		
		HL degree right ear: [C0205081]		
		Moderate (severity modifier).		
		HL degree left ear: [C0439808]		
		Profound.		
		Range of frequencies (Hz): 2000/8000.	6	



NATURAL LANGUAGE PROCESSING

- È possibile effettuare analisi su testi non strutturati?
- È possibile estrarre informazione anche se il testo non è codificato/standardizzato?



TECNICHE DI NATURAL LANGUAGE PROCESSING

Esempio: http://linguistic-annotation-tool.italianlp.it



I PASSI PRINCIPALI DEL NLP

SENTENCE TOKENIZER

- Identificazione dei confini delle frasi (token)
- Può considerare parole (congiunzioni), spazi, o segni di punteggiatura

PART OF SPEECH (POS) TAGGER

 Definizione della categoria grammaticale (nome, verbo, etc)

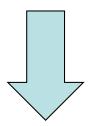
PARSER

• Identificazione delle relazioni grammaticali tra le parti identificate



SENTENCE TOKENIZER

OCULAR COMPLICATIONS OF MYASTENIA GRAVIS.

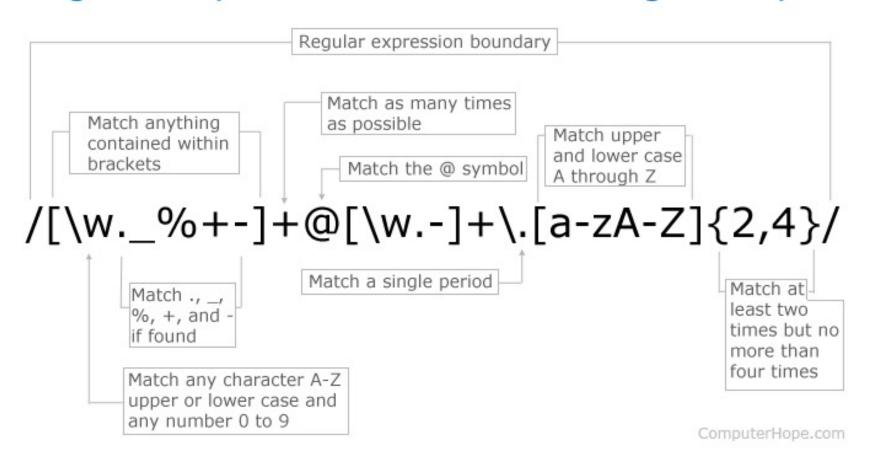


OCULAR COMPLICATIONS OF MYASTENIA GRAVIS



REGULAR EXPRESSIONS

Regular Expression E-mail Matching Example



https://regex101.com/



EHR EXAMPLE: MONICA LATTE

https://www.ahrq.gov/ncepcr/tools/pf-handbook/mod8-app-b-monica-latte.html

Review of Systems

General: denies fatigue, malaise, fever, weight loss **Eyes:** denies blurring, diplopia, irritation, discharge

Ear/Nose/Throat: denies ear pain or discharge, nasal obstruction or discharge, sore throat **Cardiovascular:** denies chest pain, palpitations, paroxysmal nocturnal dyspnea, orthopnea, edema Respiratory: denies coughing, wheezing, dyspnea, hemoptysis

Gastrointestinal: denies abdominal pain, dysphagia, nausea, vomiting, diarrhea, constipation **Genitourinary:** denies hematuria, frequency, urgency, dysuria, discharge, impotence,

incontinence

Musculoskeletal: denies back pain, joint swelling, joint stiffness, joint pain

Skin: denies rashes, itching, lumps, sores, lesions, color change

Neurologic: denies syncope, seizures, transient paralysis, weakness, paresthesias

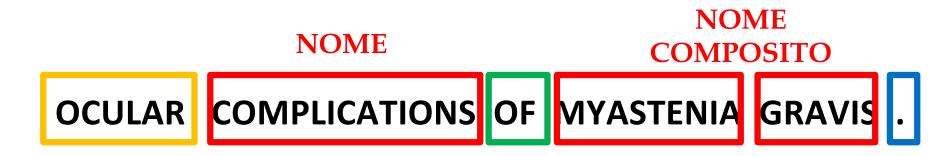
Psychiatric: denies depression, anxiety, mental disturbance, difficulty sleeping, suicidal ideation, hallucinations, paranoia

Endocrine: denies polyuria, polydipsia, polyphagia, weight change, heat or cold intolerance Heme/Lymphatic: denies easy or excessive bruising, history of blood transfusions, anemia, bleeding disorders, adenopathy, chills, sweats

Allergic/Immunologic: denies urticaria, hay fever, frequent UTIs; denies HIV high risk behaviors



PART OF SPEECH TAGGER



AGGETTIVO

PREPOSIZIONE

INTERPUNZIONE



CORPUS e ANNOTAZIONI

IN INGLESE:

- Brown University Standard Corpus of Present-Day American English (o Brown Corpus)
- Project Gutenberg
- Corpus of Contemporary American English (COCA)

• ...

IN ITALIANO: ACCADEMIA DELLA CRUSCA!

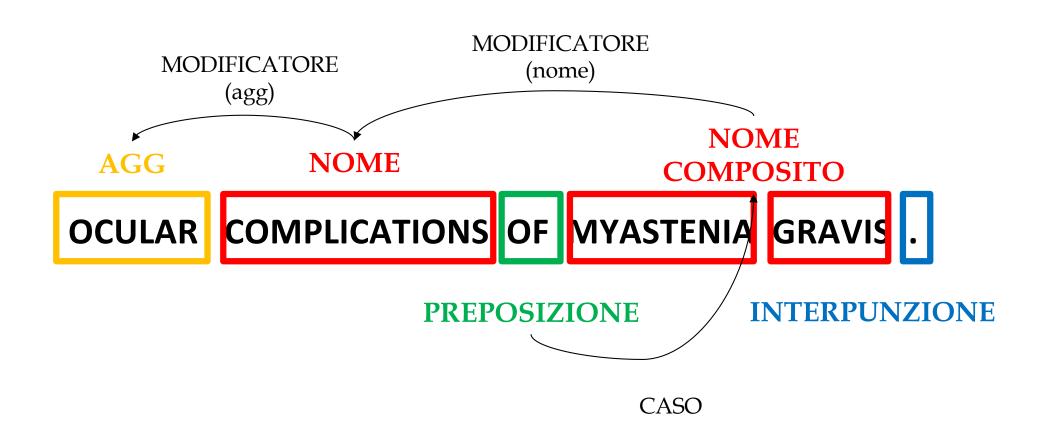
https://accademiadellacrusca.it/it/contenuti/banche-dati-corpora-e-archivi-testuali/6228

Esempio:

LIS - Lessico dell'Italiano Scritto



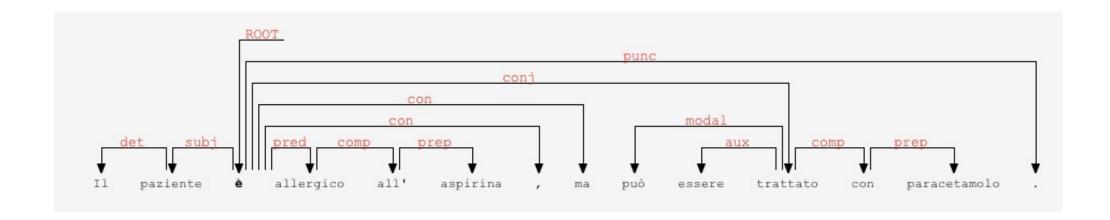
PARSER





ESEMPIO

Il paziente è allergico all'aspirina, ma può essere trattato con paracetamolo.







Named Entity Recognition

- Categorizzazione dei sostantivi (persona, sostanza, entità geografica, ...)
- Es: Adam Smith lavora alla NASA → Adam Smith = persona, NASA = azienda

Semantic Role Recognition

- Riconoscimento del ruolo semantico
- Es: Adam Smith sta alzando la mano → Adam = agent; la mano=parte del corpo; alzare = azione

Entity Relation Recognition

- Identificazione delle relazioni tra le entità
- Es: Adam Smith lavora alla NASA → Adam Smith = persona, lavora per = relazione, NASA = azienda

Timex and Time Line Recognition

- Riconoscimento delle espressioni temporali
- Es: oggi, domani, settimana scorsa, 11 maggio, etc

Word Sense Disambiguation

- Discriminazione degli omografi
- Es: Il bambino mangia la pesca vs Il bambino pesca la trota

Negation Detection Identification

- Comprensione della negazione
- Es: il paziente non presenta segni di infarto \rightarrow infarto = assente



IL VALORE DEL TESTO LIBERO

Journal of the American Medical Informatics Association, 26(11), 2019, 1189–1194 doi: 10.1093/jamia/ocz119 Advance Access Publication Date: 12 August 2019 Research and Applications



Research and Applications

Real world evidence in cardiovascular medicine: ensuring data validity in electronic health record-based studies

Tina Hernandez-Boussard, 1,2,3 Keri L Monda, 4,5 Blai Coll Crespo, 4 and Dan Riskin 1,3,6

ABSTRACT

Objective: With growing availability of digital health data and technology, health-related studies are increasingly augmented or implemented using real world data (RWD). Recent federal initiatives promote the use of RWD to make clinical assertions that influence regulatory decision-making. Our objective was to determine whether traditional real world evidence (RWE) techniques in cardiovascular medicine achieve accuracy sufficient for credible clinical assertions, also known as "regulatory-grade" RWE.

Design: Retrospective observational study using electronic health records (EHR), 2010–2016.

Methods: A predefined set of clinical concepts was extracted from EHR structured (EHR-S) and unstructured (EHR-U) data using traditional query techniques and artificial intelligence (AI) technologies, respectively. Performance was evaluated against manually annotated cohorts using standard metrics. Accuracy was compared to pre-defined criteria for regulatory-grade. Differences in accuracy were compared using Chi-square test.

Results: The dataset included 10 840 clinical notes. Individual concept occurrence ranged from 194 for coronary artery bypass graft to 4502 for diabetes mellitus. In EHR-S, average recall and precision were 51.7% and 98.3%, respectively and 95.5% and 95.3% in EHR-U, respectively. For each clinical concept, EHR-S accuracy was below regulatory-grade, while EHR-U met or exceeded criteria, with the exception of medications.

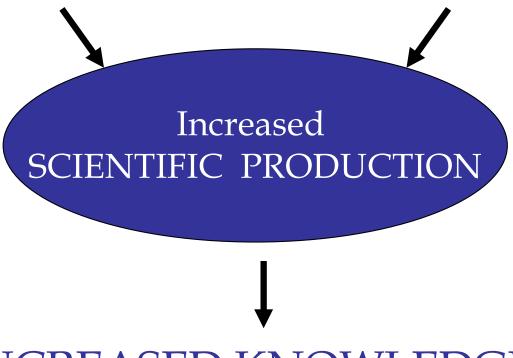
Conclusions: Identifying an appropriate RWE approach is dependent on cohorts studied and accuracy required. In this study, recall varied greatly between EHR-S and EHR-U. Overall, EHR-S did not meet regulatory grade criteria, while EHR-U did. These results suggest that recall should be routinely measured in EHR-based studes intended for regulatory use. Furthermore, advanced data and technologies may be required to achieve regulatory grade results.



THE INCREASING SCIENTIFIC KNOWLEDGE

Increased number of scientific papers published

New journals



INCREASED KNOWLEDGE?



BIBLIOGRAPHIC RESEARCH

The bibliographic research is essential to:

- Start the research (state-of-the-art evaluation/review)
- Create new answers to specific needs according to the available literature (new applications based on previous knowledge)

NEED OF BIBLIOGRAPHIC SOURCES



- PROMPTLY AVAILABLE
- RELIABLE



BIBLIOGRAPHY DATABANKS

Increased medical Need of bibliographic knowledge research

Easy access and availability

Web-based BIBLIOGRAPHY DATABANKS



EXAMPLES (1/2)

BANCHE DI BIBLIOGRAFIA IN BIOMEDICINA					
Nome	Aree coperte	Copertura temporale	Fonti considerate	Frequenza di aggiornamento	Accesso
Medline	Tutte	Dal 1966	4592 riviste	Settimanale	Gratuito
Embase (Excerpta medica)	Tutte (settore farmaceutico)	Dal 1974	4168 riviste	Settimanale	Pagamento
Pascal Biomed	Tutte	Dal 1973	6885 riviste	Settimanale (online)	Pagamento
Cochrane Library	Tutte (in modo parziale)	-	Tende alla esaustività	Trimestrale	Pagamento
Best Evidence	Tutte (in modo parziale)	Dal: 1991(ACPJC) 1995 (EBM)	ACP JC EBM	Annuale	Pagamento



EXAMPLES (2/2)

Nome	Aree coperte	Copertura	Numero	Frequenza di	Accesso
		temporale	documenti	aggiornamento	
Aidsline	Aids	Dal 1980	186000	Settimanale	Gratuito
Cancerlit	Oncologia	Dal 1966	1.5 mln	Mensile	Gratuito
Bioethicsline	Etica medica	Dal 1973	60000	Bimensile	Gratuito
Toxline	Tossicologia	Dal 1965	2.6 mln	Mensile	Gratuito
HealthStar	Servizi e gestione sanitaria	Dal 1975	3.1 mln	Settimanale	Gratuito
BDSP	Salute pubblica	Dal 1970	214828	-	Pagamento
PsychINFO	Psicologia	Dal 1967	1.6 mln	Mensile	Pagamento
Allyed & Complementary Medicine	Medicine parallele	Dal 1985	103600	Mensile	Pagamento
Belit	bioetica	-	150000	-	Gratuito



INFORMATION QUALITY

- It is easy to implement references databanks using available ICTs and web technologies
- Bibliography databanks refer only to quality information
- •Scientific papers to be published need to be:
 - ✓ Peer-reviewed to obtain the comments from expert colleagues
 - ✓ If the comments are all positive, the paper is accepted
 - ✓ If the comments are negative \rightarrow
 - ✓ Request for paper revision (major/minor)
 - ✓ Reject
 - ✓ After the revision
 - ✓ New review
 - ✓ Direct acceptance/rejection



SCIENTIFIC PAPER ARCHITECTURE

- Journal name
- Publication date (volume, issue, pages)
- Authors
- Affiliations
- Title
- Keywords
- Abstract

- Body
 - ✓ Introduction
 - ✓ Material and methods
 - **✓** Results
 - ✓ Discussion
 - ✓ Conclusions
- Acknowledgements
- References



THE SCIENTIFIC PAPER

Citation

Journal of Biomedical Informatics 52 (2014) 92–104

Contents lists available at ScienceDirect

Journal of Biomedical Informatics

journal homepage: www.elsevier.com/locate/yjbin



Journal name

Title

WebBioBank: A new platform for integrating clinical forms and shared neurosignal analyses to support multi-centre studies in Parkinson's Disease



Elena Rossi ^{a,1}, Manuela Rosa ^{b,1}, Lorenzo Rossi ^b, Alberto Priori ^b, Sara Marceglia ^{a,*}

*Dipartimento di Elettronica, Informazione e Bioingegneria, Politecnico di Milano, piazza Leonardo da Vinci 32, 20133 Milan, Italy

b Centro Clinico per la Neurostimolazione, le Neurotecnologie ed i Disordini del Movimento, Fondazione IRCCS Ca' Granda, Ospedale Maggiore Poliglipico, Milan, Italy

Authors

ARTICLE INFO

Article history: Received 3 October 2013 Accepted 28 August 2014 Available online 7 September 2014

Keywords: Web-based platform Database Multi-centrectinical study Operative unit Parkinson's Diseases Signal processing

Information on acceptance

ABSTRACT

Background: The web-based systems available for multi-centre dinical trials do not combine clinical data collection (Electronic Health Records, EHRs) with signal processing storage and analysis tools. However, in pathophysiological research, the correlation between clinical data and signals is crucial for uncovering the underlying neurophysiological mechanisms. A specific example is the investigation of the mechanisms of action for Deep Brain Stimulation (DBS) used for Parkinson's Disease (PD); the neurosignal recorded from the DBS target structure and clinical data must be investigated.

Objective: The aim of this study is the development and testing of a new system dedicated to a multicentre study of Parkinson's Disease that integrates biosignal analysis tools and data collection in a shared and secure environment.

Methods: We designed a web-based platform (WebBioBank) for managing the clinical data and biosignals of PD patients treated with DBS in different clinical research centres. Homogeneous data collection was ensured in the different centres (Operative Units, OUs). The anonymity of the data was preserved using unique identifiers associated with patients (ID BAC). The patients' personal details and their equivalent ID BACs were archived inside the corresponding OU and were not uploaded on the web-based platform; data sharing occurred using the ID BACs. The system allowed researchers to upload different signal processing functions (in a .dll extension) onto the web-based platform and to combine them to define dedicated algorithms.

Results: Four clinical research centres used WebBioBank for 1 year. The clinical data from 58 patients treated using DBS were managed, and 186 biosignals were uploaded and classified into 4 categories based on the treatment (pharmacological and/or electrical). The user's satisfaction mean score exceeded the satisfaction threshold.

Conclusions: WebBioBank enabled anonymous data sharing for a clinical study conducted at multiple centres and demonstrated the capabilities of the signal processing chain configuration as well as its effectiveness and efficiency for integrating the neurophysiological results with clinical data in multicentre studies, which will allow the future collection of homogeneous data in large cohorts of patients.

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Affiliations

Abstract



THE PEER-REVIEW PROCESS (1)

View Review Comments for Manuscript CBM-D-14-00776R1

"A Novel Dual Culibration Confecul Imaging for Hieromana Early Dreast Tamor detection in HR

Images Based Model"

Click the Reviewer recommendation term to view the Reviewer comments.

	Revision 1	Original Submission
(Reviewer 1)	(None)	Minor Revision
(Reviewer 2)	Reject	Reject
Sara Renata Francesca Marceglia, Ph.D. (Reviewer 3)	Major Revision	(None)
(Reviewer 4)	Reject	(None)

Close



Scale Rating

THE PEER-REVIEW PROCESS (2)

CBM-D-14-00776R1

Revision 1

Sara Renata Francesca Marceglia, Ph.D. (Reviewer 3)

Reviewer Recommendation

Major Revision

Term:

Manuscript Rating Question(s):

Please rate on a scale of 1-3 whether the Highlights are a meaningful and accurate representation of the article. 1 = Meaningful; 2 = Not Meaningful; 3 = Not Provided. For more [1-3] N/A information, see www.elsevier.com/highlights

Please rate on a scale of 1-3 whether the Graphical Abstract is a meaningful and an accurate representation of the article. 1 = Meaningful; 2 = Not Meaningful; 3 = Not Provided. [1-3] N/A For more information, see www.elsevier.com/graphicalabstracts

Comments to Editor:

REVIEWER: Please indicate to the Editor whether any of the following apply, by deleting 'Y' or 'N' as appropriate:

- * The writing needs substantial improvement grammar and spelling Y
- * Improper formatting was used (figures, tables, legends too small) N
- * The work is too incremental compared to authors' or others' prior work N
- * The manuscript is for the most part previously published by the authors N
- The study is too biological and not quantitative/computational enough N

Dear Editor,

I read the manuscript and I believe that it worths to let the authors re-revise it. It still have a language problem (I can tell it even though I am not a native English speaker) and I totally agree with the other reviewer that it still lacks the contextualization and comparison with the other approaches. I don't agree, conversely, on the fact that it lacks novelty. It is anyway a different and simpler way to treat the problem of skin reflection, and it could be useful for the imaging community. I would suggest to let them revise it. With kind regards,

Sara

Comments to Author:

The paper "A Novel Dual Calibration Confocal Imaging for Microwave Early Breast Tumor detection in MR Images Based Model" describes a dual calibration technique for microwave breast tumour detection. The model is based on 3D breast MR images and uses a uniformly spaced moving antenna array.

The method is described in details and the simulation model is valuable. Also, the figures are informative and well presented in the text.

I have two major critiques related to the manuscript:

1- the language needs a deep revision from a native English speaker. There are many grammar and syntax mistakes (e.g., in the highlights, "Confocal algorithm use ..." should be "The confocal algorithm uses..."; in the introduction "Mammography and magnetic resonance imaging (MRI) are most common" should be "Mammography and magnetic resonance imaging (MRI) are the most common").

2- even though the authors describe the available literature on the current state of the art of artefact removal techniques, they do not explain why the proposed methodology differs from the others and how it contributes to overcome the current limitations. Despite the detailed "Methods" and "Results" sections, the manuscript completely lacks the discussion of the results in the light of the current state-of-the-art. The "Conclusions" just provide a summary of the results and do not contextualize the authors' findings.



THE DECISION LETTER

22-Feb-2015

Dear Dr. Marceglia:

Manuscript ID ACI-2014-12-RA-0115 entitled "A Standards-Based Architecture Proposal for Integrating Patient mHealth Apps to Electronic Health Record Systems" which you submitted to the Applied Clinical Informatics, has been reviewed. The comments of the reviewer(s) and Associate Editor (if applicable) are included at the bottom of this letter.

The reviewer(s) have recommended publication with Minor Revisions to your manuscript. Therefore, I invite you to respond to the reviewer(s)' comments and revise your manuscript.

The revised manuscript must be UNBLINDED and must contain a section on Human Subject Research Approval and a section on Conflict of Interest.

We encourage you to revise your manuscript within the next 3 weeks to optimize turn-around. Revisions received more than 8 weeks from the date of the decision letter will be considered new submissions, subject to a full round of reviews.

Please log into https://mc.manuscriptcentral.com/acij and enter your Author Center, where you will find your manuscript title listed under "Manuscripts with Decisions." Under "Actions," click on "Create a Revision." Your manuscript number has been appended to denote a revision. You will be unable to make your revisions on the originally submitted version of the manuscript. Instead, revise your manuscript using a word processing program and save it on your computer. Please also highlight the changes to your manuscript within the document by using the track changes mode in MS Word or by using bold or colored text. Once the revised manuscript is prepared, you can upload it and submit it through your Author Center.

When submitting your revised manuscript, you will be able to respond to the comments made by the reviewer(s) in the space provided. You can use this space to document any changes you make to the original manuscript. In order to expedite the processing of the revised manuscript, please be as specific as possible in your response to the reviewer(s).

While Applied Clinical Informatics focuses on the applied aspects of information, we aim to give our readers some methodological background as well. In our experience, Methods of Information in Medicine (http://www.schattauer.de/en/magazine/subject-areas/journals-a-z/methods.html) is useful in providing such theoretical background and we encourage references to this journal where appropriate.

IMPORTANT: Your original files are available to you when you upload your revised manuscript. Please delete any redundant files before completing the submission. Because we are trying to facilitate timely publication of manuscripts submitted to the Applied Clinical Informatics, your revised manuscript should be uploaded as soon as possible. If it is not possible for you to submit your revision in a reasonable amount of time, we may have to consider your paper as a new submission.

Once again, thank you for submitting your manuscript to the Applied Clinical Informatics and I look forward to receiving your revision.

Sincerely,

Dr. Christoph Lehmann Editor in Chief, Applied Clinical Informatics culehmann@gmail.com

Reviewer(s)' Comments to Author:

Reviewer: 1

Comments to the Author In reading this, I had several considerations.

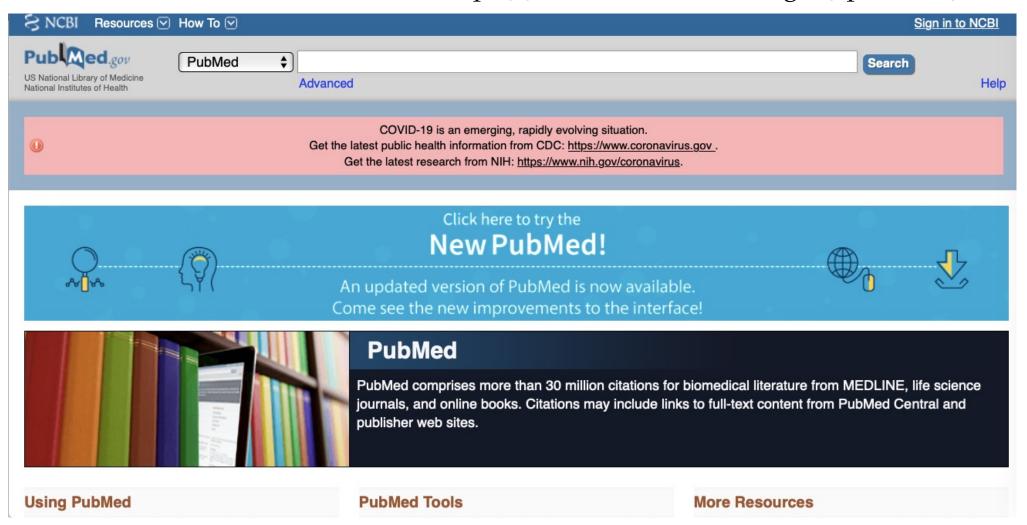
The communication between the mobile application and EHR are encrypted and deidentified, using only a patient ID (which I assume is random). Does the mobile application itself include the patient's name, physician's name, etc.? If someone were to find the mobile device, then easy deduction can allow one to discover the patient's name and medical condition. I know your paper says you do not store health information on the device, but this was left a little unclear to me. Does the application have password or TouchID validation to abate this? Additionally, at what point is the information re-identified, and how is this done? It seems that the logical place would be on the EMR side, but this is not apparent in the paper.

Since no health information is stored on the mobile device, how does this contribute to patient health information tracking? Would these data (which are stored in the multiple repositories, per Figure 2A/B) then be accessible to the mobile platform for longitudinal tracking? As it stands, communication looks to be only one-way in terms of this.



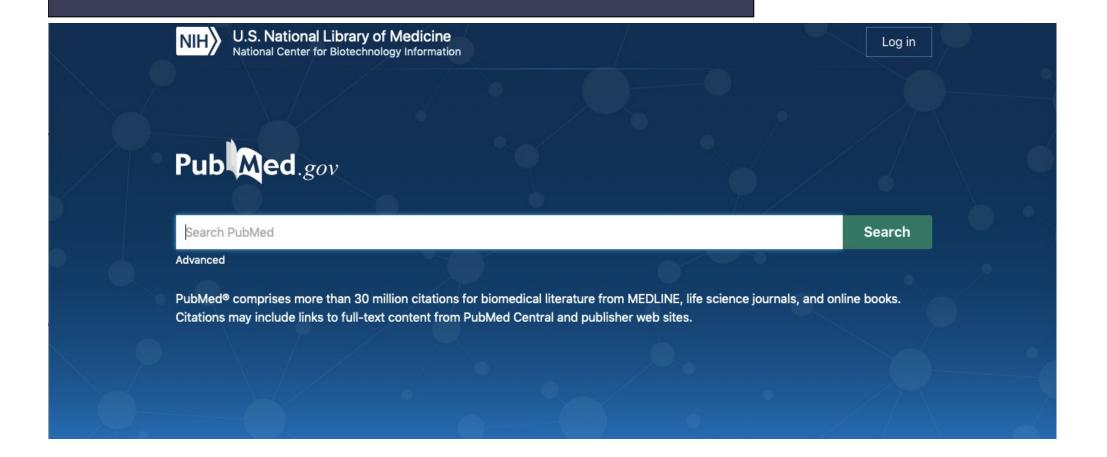
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https://www.ncbi.nlm.nih.gov/pubmed/



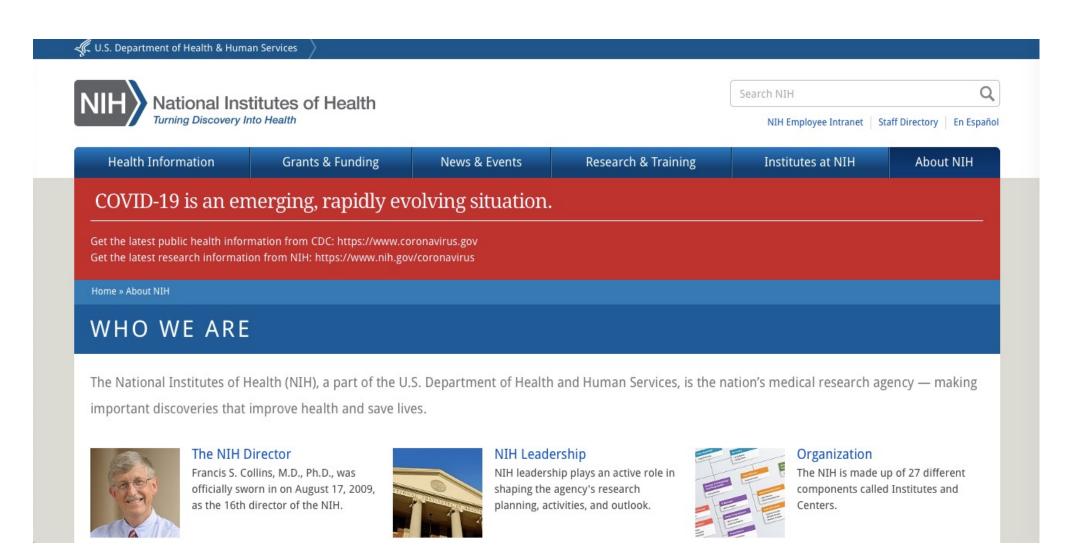


PUBMED.GOV



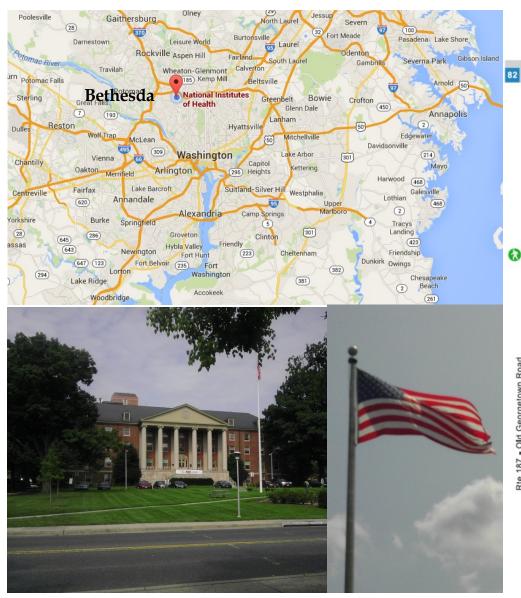
THE NIH - NATIONAL INSTITUTES OF HEALTH

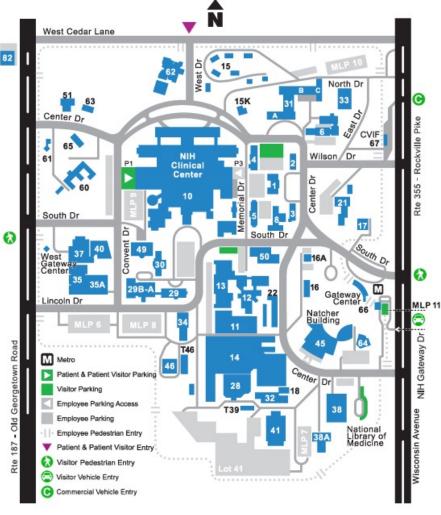






WHERE IS THE NIH







THE NIH CAMPUS













THE NATIONAL LIBRARY OF MEDICINE



NATIONAL LIBRARY OF MEDICINE

Founded in 1836 as the Library of the Surgeon-General's Office, United States Army+developed as a national resource under the leadership of John Shaw Billings, Librarian from 1865 to 1895+named Army Medical Library in 1922, and Armed Forces Medical Library in 1952+made a part of the Public Health Service of the Department of Health, Education, and Welfare in 1956+established on this site in 1961, the one hundred and twenty-fifth anniversary of its founding.



NLM PUBLIC RESOURCES











Clinical Trials.gov

Images from the History of Medicine (IHM) U.S. National Library of Medicine





Unified Medical Language System® (UMLS®)



- It is the mostly used databank in medicine
- The article is retrieved as citation (not "full text")
- US National Library of Medicine (NLM, www.ncbi.nlm.nih.gov)
- Free access
- •74% papers in English
- •40% of the journals are published in the US





MEDLINE

MEDLINE is the NLM's premier bibliographic database that contains references to journal articles in the life sciences with a concentration on biomedicine. A distinctive feature of MEDLINE is that the records are indexed with NLM's Medical Subject Headings (MeSH). The database contains citations from 1950 to the present, with some older material. New citations that have been indexed with MeSH terms, publication types, GenBank accession numbers, and other indexing data are available daily (Tuesday through Saturday) and display with the tag [PubMed - indexed for MEDLINE]. See also the MEDLINE/PubMed Resources Guide.





Introduction

PubMed, available via the NCBI Entrez retrieval system, was developed by the National Center for Biotechnology Information (NCBI) at the National Library of Medicine (NLM), located at the U.S. National Institutes of Health (NIH). Entrez is the text-based search and retrieval system used at NCBI for services including PubMed, Nucleotide and Protein Sequences, Protein Structures, Complete Genomes, Taxonomy, OMIM, and many others. PubMed provides access to citations from biomedical literature. LinkOut provides access to full-text articles at journal Web sites and other related Web resources. PubMed also provides access and links to the other Entrez molecular biology resources.



United States National Library of Medicine National Institutes of Health

Return to Web Version

Fact Sheet

What's the Difference Between MEDLINE® and PubMed®?



- MEDLINE[®]
- National Library of Medicine® (NLM®) journal citation database.
- Started in the 1960s, it now provides over 21 million references to biomedical and life sciences journal articles back to 1946.
- MEDLINE includes citations from over 5,600 scholarly journals published around the world.
- Publishers submit journals to an NIH-chartered advisory committee, the Literature Selection Technical Review Committee (LSTRC), which reviews and recommends journals for MEDLINE.
- The MEDLINE database is directly searchable from NLM as a subset of the PubMed® database as well as through other numerous search services that license the data.



PUBMED

- Has been available since 1996 (now 23 mln references)
- Include the MEDLINE database plus the following types of citations:
 - In-process citations, which provide records for articles before those records go through quality control and are indexed with MeSH or converted to out-of-scope status.
 - Citations to articles that are out-of-scope from certain MEDLINE journals (general science and general chemistry journals)
 - "Ahead of Print" citations .
 - Citations that precede the date that a journal was selected for MEDLINE indexing and Pre-1966 citations.
 - Citations to some additional life sciences journals that submit full text to PMC® (PubMed Central®) and receive a qualitative review by NLM.
 - Citations to author manuscripts of articles published by NIH-funded researchers amd Citations for the majority of books available on the NCBI Bookshelf.

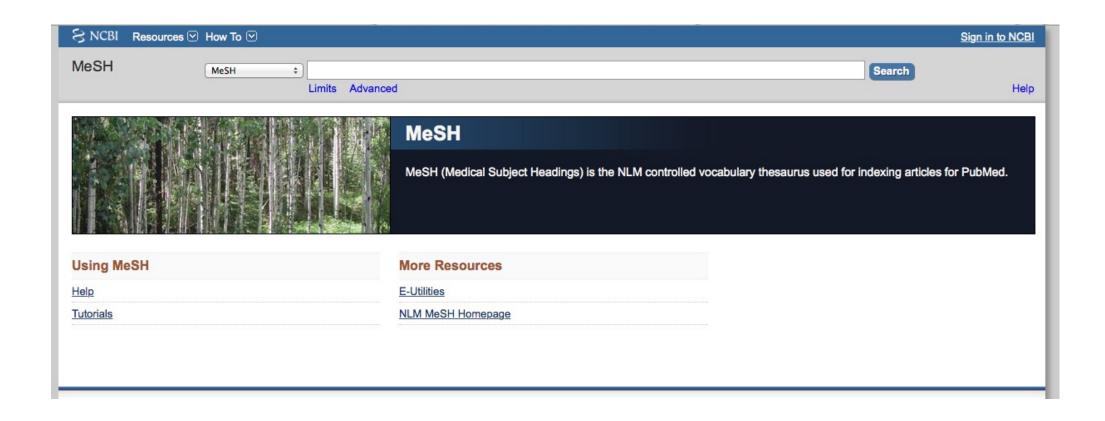


PUBMED CENTRAL (PMC)

- Launched in 2000
- Free archive for full-text biomedical and life sciences journal articles.
- Repository for journal literature deposited by participating publishers, as well as for author manuscripts that have been submitted in compliance with the NIH Public Access Policy and similar policies of other research funding agencies.
- Although free access is a requirement for PMC deposit, publishers and individual authors may continue to hold copyright on the material in PMC and publishers can delay the release of their material in PMC for a short period after publication.
- There are reciprocal links between the full text in PMC and corresponding citations in PubMed.



MESH TERMS





GENERAL RESEARCH PRINCIPLES

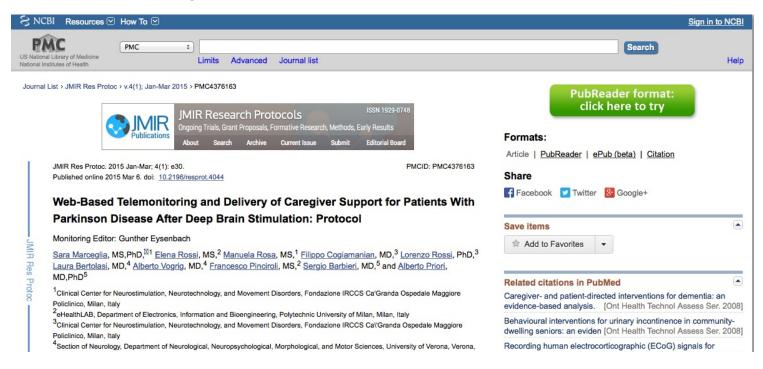
- Definition of the research object
- Definition of the key concepts
- Definition of the type of reserach (free text or coded).
- Boolean operators AND, OR, NOT to link the research keywords
- Use of the "limits/constraints" →
 - Publication year
 - Type of paper
 - Paper language
 - Availability of the abstract
 - Free article



HOW TO FIND THE "FULL TEXT"

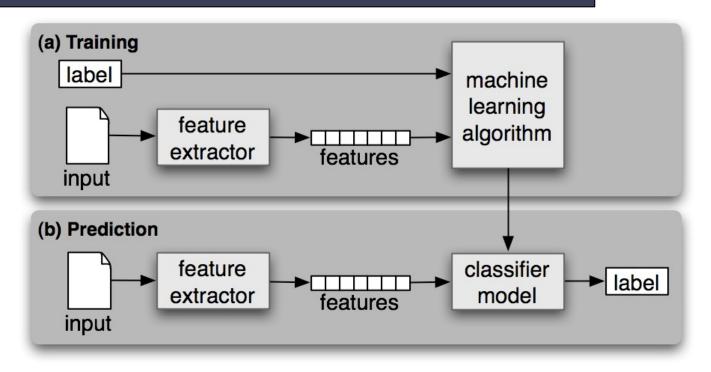


Redirects to the journal website





MACHINE LEARNING EXAMPLE



NÄIVE BAYES CLASSIFIER

$$P(A|B) = \frac{P(B|A)P(A)}{P(B)} \qquad y = argmax_y P(y) \prod_{i=1}^n P(x_i|y)$$



MACHINE LEARNING EXAMPLE

```
from nltk.corpus import movie reviews
# Total reviews
print (len(movie reviews.fileids())) # Output: 2000
# Review categories
print (movie reviews.categories()) # Output: [u'neg', u'pos']
[...]
print (classifier.show most informative features(10))
1 1 1
Output:
Most Informative Features
                                                      = 14.7 : 1.0
  contains(outstanding) = True
                                          pos : neg
                                                      = 7.8 : 1.0
        contains(mulan) = True
                                          pos : neg
                                                      = 7.7 : 1.0
       contains(poorly) = True
                                          neq : pos
                                                      = 7.5 : 1.0
  contains(wonderfully) = True
                                          pos : neg
                                                      = 6.5 : 1.0
       contains(seagal) = True
                                          neg : pos
        contains(awful) = True
                                                      = 6.1 : 1.0
                                          neq : pos
                                                      = 6.1 : 1.0
       contains(wasted) = True
                                          neg : pos
                                                      = 5.6 : 1.0
        contains(waste) = True
                                          neq : pos
                                                      = 5.3 : 1.0
        contains(damon) = True
                                          pos : neg
        contains(flynt) = True
                                                      = 5.1 : 1.0
                                          pos : neg
```