

Breakout Session 6:

Scaling Up Literature Annotations with Cloud Computing in PubTator 3.0

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Scaling up literature annotations with cloud computing in PubTator 3.0

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NCBI, NLM, NIH

2024 NIH/ODSS Cloud Program PI Meeting

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Our research at NLM IRP

Research Areas

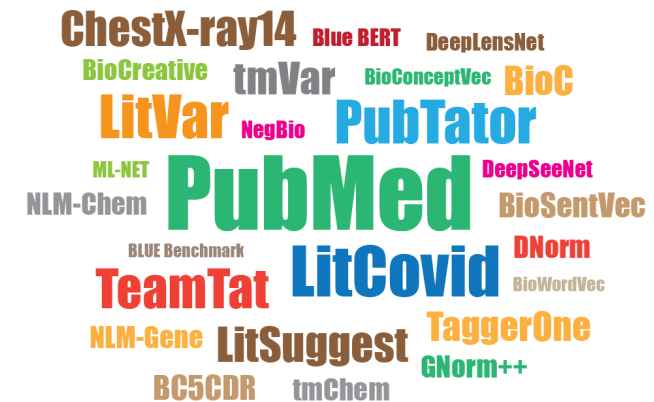
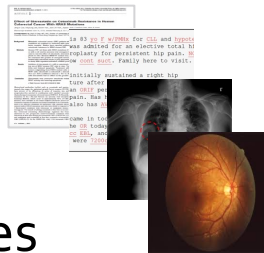
Machine Learning; Deep Learning
Natural Language Processing (NLP)
Medical Image Analysis

Text & Image data

Biomedical Literature

Clinical notes, EMRs

CT, CXR & retinal images



Application areas:

Literature Retrieval (e.g., PubMed Search; LitCovid)

Information Extraction/Curation (e.g., LitVar, PubTator, LitSuggest)

AI in Healthcare (e.g., machine diagnosis and prognosis)

Gene-disease-variant relations for genomic medicine

[J Alzheimers Dis.](#) 2012;32(2) **Disease** **A** **Gene** **Variant**

Highly pathogenic **Alzheimer's disease** **presenilin 1** **P117R** mutation causes a specific increase in p53 and p21 protein levels and cell cycle dysregulation in human lymphocytes.

[Bialopiotrowicz E](#)¹, [Szybinska A](#), [Kuzniewska B](#), [Buizza L](#), [Uberti D](#), [Kuznicki J](#), [Wojda U](#).



Rank	Gene or Protein ID	Gene SYM	WTAA	MTAA	POS	Disease	PMIDs
1	Q13131	PRKAA1	Q	R	16	Breast cancer	16959974
2	P31749	AKT1	E	K	17	Breast cancer	17611497 18954143 19713527 21793738
3	P10275	AR	H	Y	874	Prostate cancer	17591767

Automatic entity recognition is non-trivial

- Term variation
 - c.77A>C; c.77A->C; A77C;
- Synonymy
 - TP53; tumor protein p53; p53; BCC7; LFS1
- Ambiguity
 - Activated protein C (APC)
 - Antigen-presenting cell (APC)
 - Amino acid-polyamine-organocation (APC)
 - Anaphase-promoting complex (APC)
 - Argon plasma coagulation (APC)

Challenges in relation extraction

Multiple Diseases

Multiple Genes

Multiple Variants

TITLE:

Factors associated with oxidative stress and cancer risk in the Breast and Prostate Cancer Cohort Consortium.

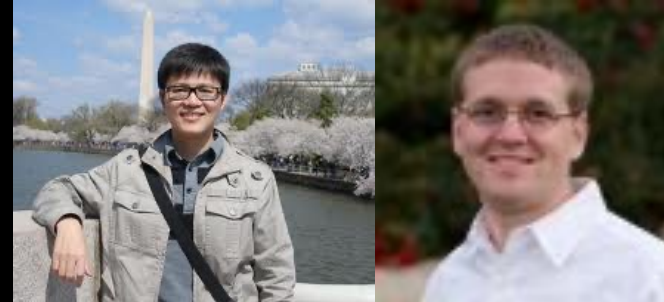
ABSTRACT:


Both endogenous factors (genomic variations) and exogenous factors (environmental exposures, lifestyle) impact the balance of reactive oxygen species (ROS). Variants of the ND3 (rs2853826, G10398A) gene of the mitochondrial genome, manganese superoxide dismutase (MnSOD; rs4880 Val16Ala) and glutathione peroxidase (GPX-1; rs1050450 Pro198Leu), are purported to have functional effects on regulation of ROS balance. In this study, we examined associations of breast and prostate cancer risks and survival with these variants, and interactions between rs4880-rs1050450, and alcohol consumption-rs2853826. Nested case-control studies were conducted in the Breast and Prostate Cancer Cohort Consortium (BPC3), consisting of nine cohorts. The analyses included over 10726 post-menopausal breast and 7532 prostate cancer cases with matched controls. Logistic regression models were used to evaluate associations with risk, and proportional hazard models were used for survival outcomes. We did not observe significant interactions between polymorphisms in MnSOD and GPX-1, or between mitochondrial polymorphisms and alcohol intake and risk of either breast (p-interaction of 0.34 and 0.98, respectively) or prostate cancer (p-interaction of 0.49 and 0.50, respectively). We observed a weak inverse association between prostate cancer risk and GPX-1 Leu198Leu carriers (OR 0.87, 95% CI 0.79-0.97, p = 0.01). Overall survival among women with breast cancer was inversely associated with G10398 carriers who consumed alcohol (HR 0.66 95% CI 0.49-0.88). Given the high power in our study, it is unlikely that interactions tested have more than moderate effects on breast or prostate cancer risk. Observed associations need both further epidemiological and biological confirmation.


Positive Assertion

Negative Finding

Our Entity Taggers




Disease 
DNorm (2013) – 80.9%

Mutation
tmVar (2013) – 91.4%
tmVar 3.0 (2022) – 94.3% 

Gene/Protein
GNormPlus – 86.7% (2015)
GNorm2 – 89.4% (2023)

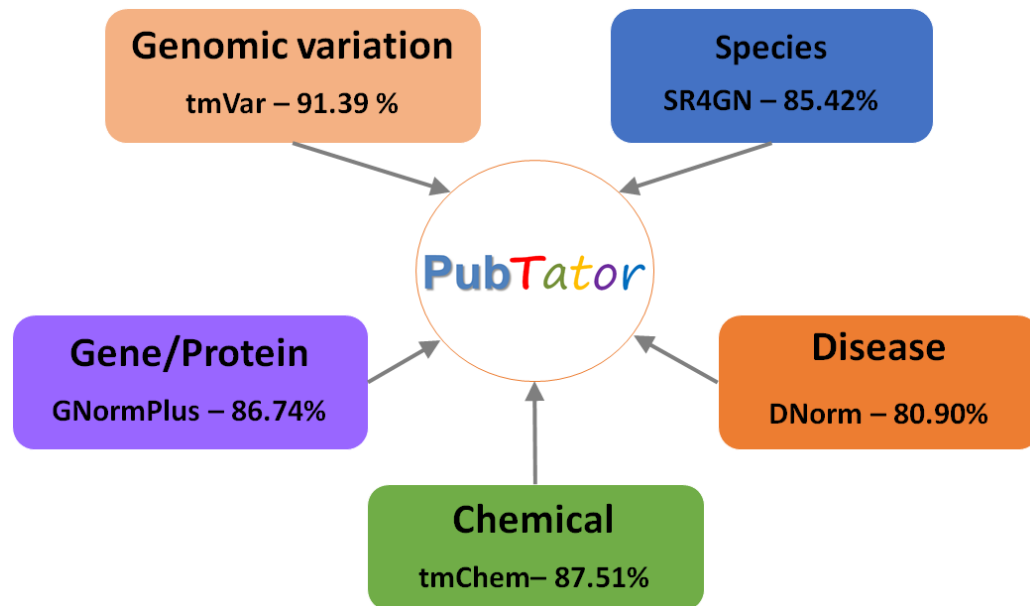
Species
SR4GN (2012) – 85.4%

Chemical/Drug 
tmChem (2015) – 88.3%

All-in-one Tagger
AIONER (2023)

- State-of-the-art Performance
 - CHEMPROT-Elsevier Challenge Award, 2017
 - GNormPlus: 1st in BioCreative V CHEMDNER-GPRO Task
 - tmChem: 1st in BioCreative V CHEMDNER-CEMP Task
 - DNorm: 1st in ShARe/CLEF Disease Normalization Task
 - tmChem: 1st in BioCreative IV CHEMDNER-CEM Task
- Hybrid approach (mostly machine learning)
- Freely available and open source
- Scalable and interoperable
- Large user base

PubTator (2012 -): integrating text-mined results at PubMed scale



Curatable
 Not Curatable
 TBD
 PubTator
 Disease
 Species
 Mutation
 Chemical
 Gene

PMID:26022131 Selection of a novel DNA thioaptamer against HER2 structure.

Publication: Clinical _ translational oncology : official publication of the Federation of Spanish Oncology Societies and of the National Cancer Institute of Mexico; 2015 May 29 [Full text links]

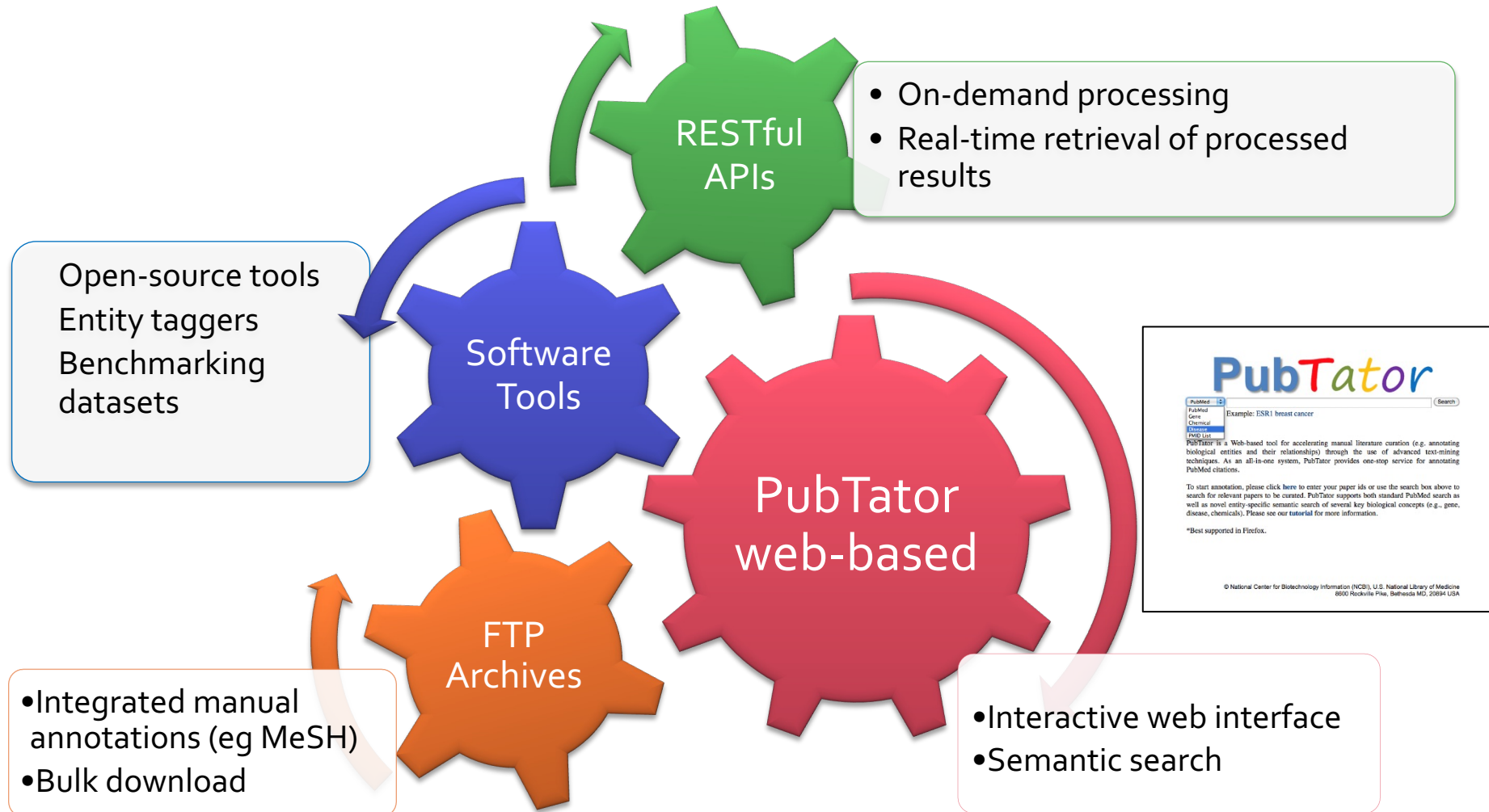
TITLE:
 Selection of a novel DNA thioaptamer against HER2 structure.

ABSTRACT:
PURPOSE: Human epithelial growth factor receptor 2 (HER2) is over-expressed in several malignancies and represents an important therapeutic target. Aptamers are oligonucleotides that may potentially serve as tumor-homing ligand with excellent affinity and specificity for targeted cancer therapy. However, aptamers need to have nuclease resistance in order to function in vivo. The aim of this study was to generate a novel HER2 thioaptamer with enhanced nuclease resistance. **METHODS:** The HER2 thioaptamer is selected in an evolutionary process called systematic evolution of ligands by exponential enrichment. **RESULTS:** The thioaptamer could bind to the extracellular domain of HER2 with a K d of 172 nM and had minimal cross reactivity to trypsin or IgG. Moreover, the thioaptamer was found capable of binding with the HER2-positive breast cancer cells SK-BR-3 and MDA-MB-453, but not the HER2-negative cells MDA-MB-231. Notably, the thioaptamer HY6 largely maintained its structural integrity facing the nucleases in serum, while regular DNA aptamers were mostly digested. Additionally, the thioaptamer retained the capability of binding with the HER2-positive cells in the presence of serum, whereas non-thionated HER2 aptamer lost the binding function. **CONCLUSION:** The results indicated that the selected thioaptamer was more resistant to nuclease than regular DNA aptamers and might potentially function as a HER2-targeting ligand in complicated environment.

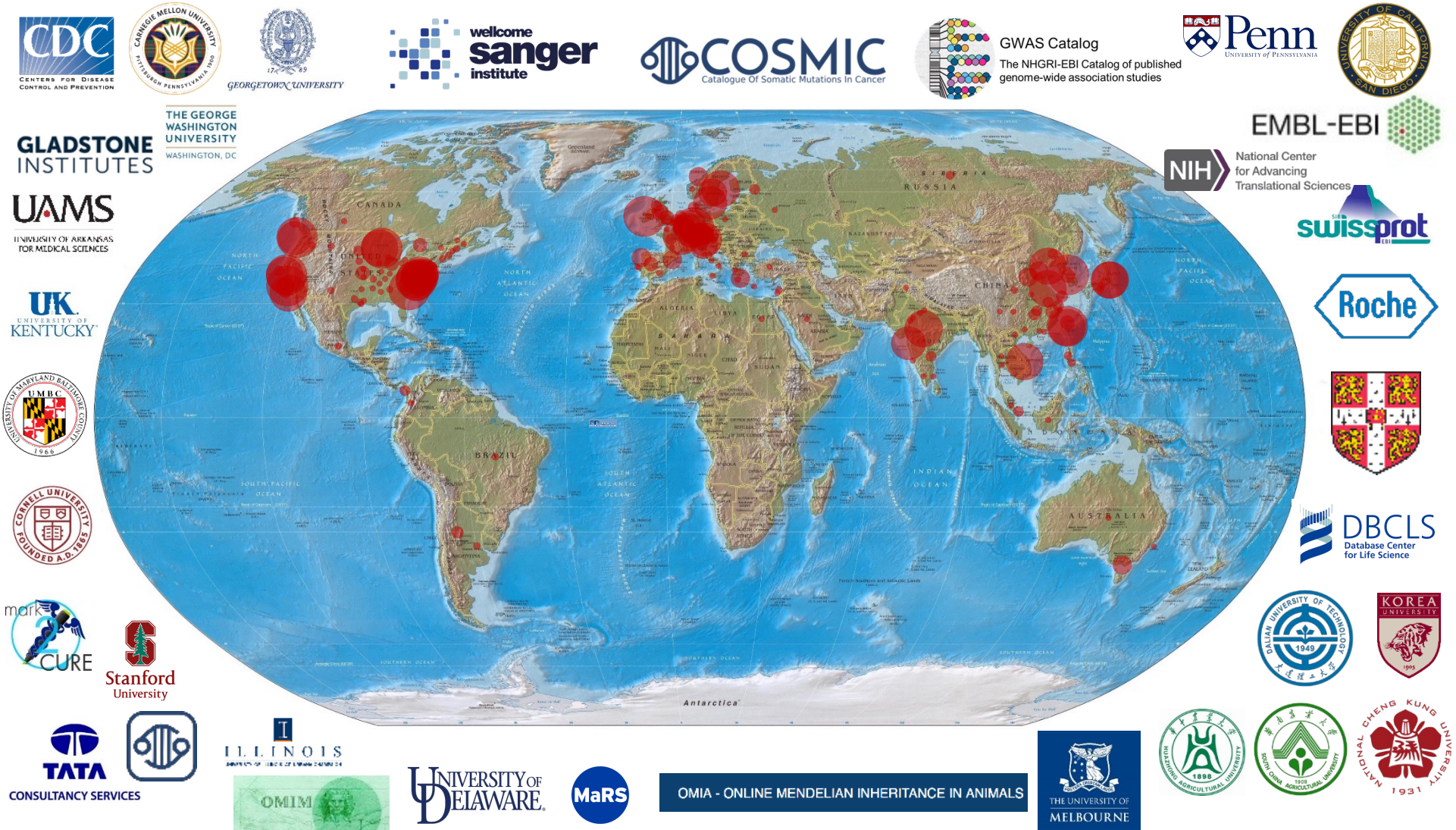
Concept View
 Mention View
 [Add bio-relation annotation to the table below.](#)

Entity type	Entity mention	Concept ID	Nomenclature	Delete
Disease	breast cancer	D001943	MEDIC	Delete
Disease	cancer tumor	D009369	MEDIC	Delete
Gene	HER2 Human epithelial growth factor receptor 2	2064	NCBI Gene	Delete

Data Sharing and Reuse



PubTator API usage: over 1 billion requests since April 2015



PubTator milestones (2012 -)

2019

Deep Learning for improved results



2016

Bulk download available via FTP



2023

Relation annotations (PubTator 3.0)

2018

Full-text PMC articles added (PubTator 2.0)



2015

APIs released



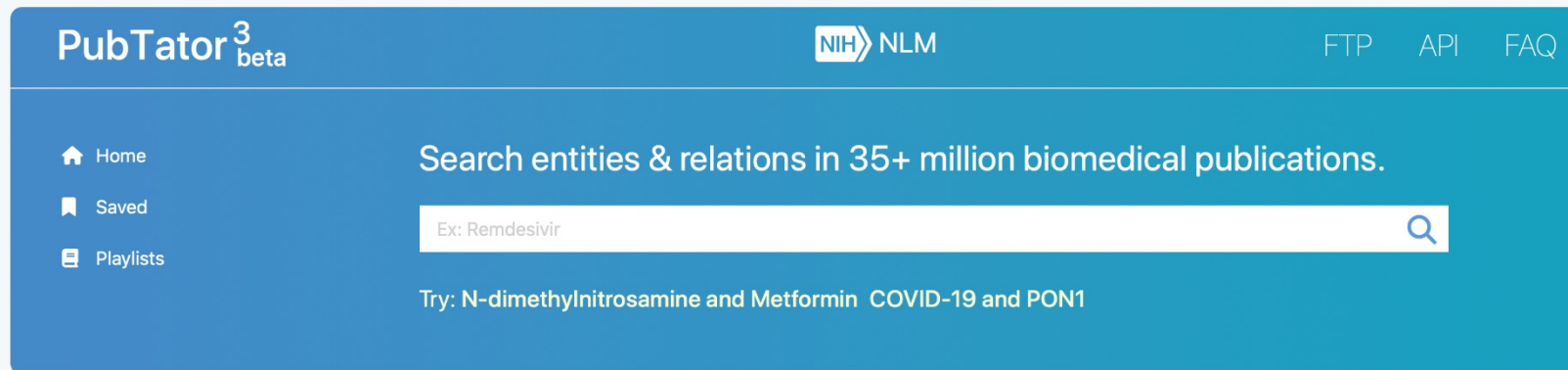
2012

PubTator first launched at BioCreative IV

PubTator interface showing search results for a novel DNA thioaptamer against HER2 structure. The interface includes a search bar, filters (Curatable, Not Curatable, TBD), and a list of results. The first result is highlighted, showing the title, abstract, and a table of bio-relationships.

Entity type	Entity mention	Concept ID	Nomenclature	Delete
Disease	breast cancer	0001941	MEDIC	Delete
Disease	cancer tumor	0009388	MEDIC	Delete
Gene	HER2 Human epithelial growth factor receptor 2	2594	NCBI Gene	Delete

PubTator 3.0 beta is now available



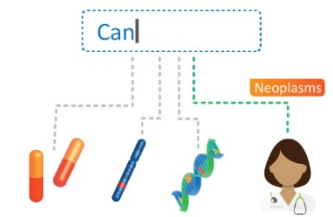
PubTator³_{beta} NIH/NIH FTP API FAQ

Home Saved Playlists

Search entities & relations in 35+ million biomedical publications.

Ex: Remdesivir

Try: N-dimethylnitrosamine and Metformin COVID-19 and PON1



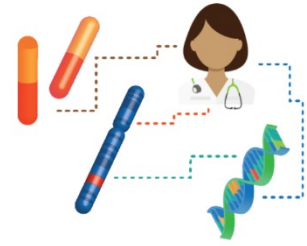
Entities Autocomplete

PubTator3 uses a high-performance entities search engine, to normalize different forms of the same entity into a unique standardized name to returned all matching articles.



Full Text Search

PubTator3 provides unified access to the entire 35+ million abstracts in PubMed and nearly 6 million full-text articles in the PMC Text Mining subset.

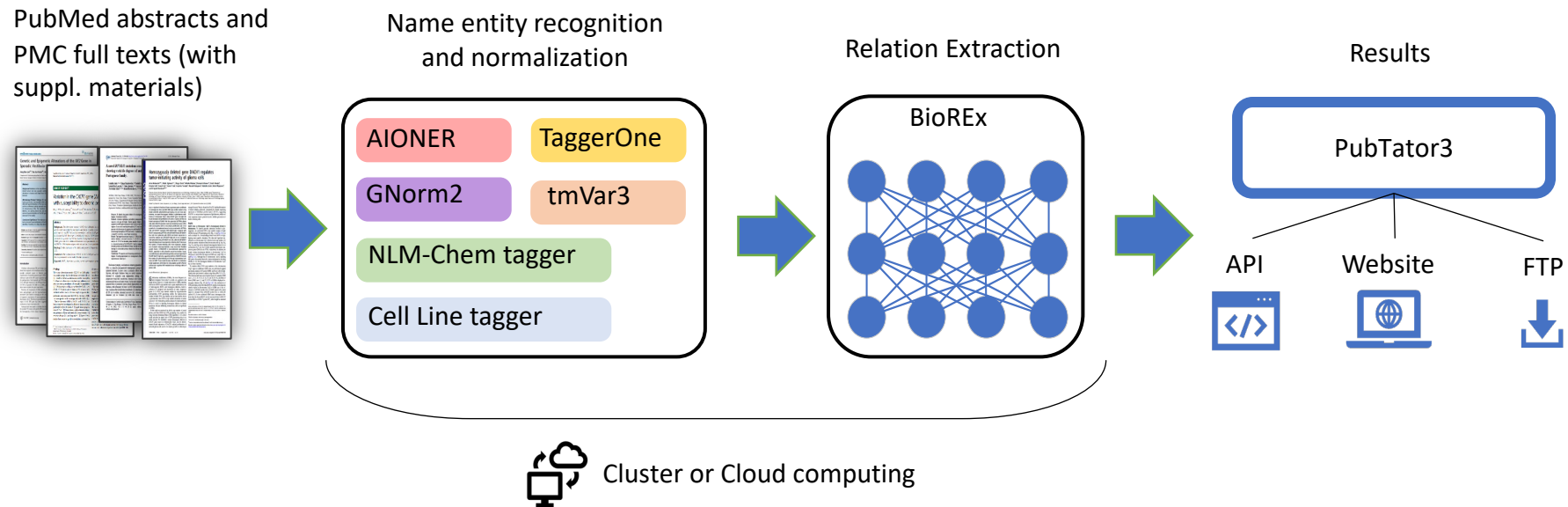


Relations

PubTator3 allows to filter results to only return publications containing specific relations between two entities, such as diseases, chemicals, genes or variants.

<https://www.ncbi.nlm.nih.gov/research/pubtator3/>
Supported by NIH ODSS Exploratory Cloud Program

Computational tasks need GPU access



- IE methods enhancement
- (Re-)process the entire PubMed/PMC datasets
- Annotate new articles each day
 - 5k-100K PubMed abstracts / 1-5K full texts (daily)

Available computing resources

CPU/GPU	#	Resource
Nvidia A100	0-1	Biowulf
Nvidia V100	0-1	Biowulf
Nvidia Tesla K80	0-5	Biowulf
CPU	0-400	Biowulf
CPU	0-300	NCBI computer cluster



CPU/GPU	#	Resource
Nvidia A100	2	Google cloud
CPU	24	Google cloud

- Most of our IE tools are developed using deep learning, which rely on GPUs.
- The availability of NCBI/Biowulf resources is unstable and often occupied by other users.

Comparison

Tasks	NCBI Cluster/BioWulf	Google Cloud
Re-process the entire PubMed/PMC	100-600 CPUs + 1 K80 GPU	2 A100 + 24 CPUs
	5+ months	1-2 months
Method improvement	GPU (not guaranteed)	2 A100
	Days to Weeks	Hours to Days
Regularly process new articles	100-300 CPUs	1 A100 + 24 CPUs
	1-5 days	Daily

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ClinVar: Melissa Landrum

UniProt: Cecilia Arighi, Alex Bateman, Alan Bridge, Livia Famiglietti, Michele Magrane, Sylvain Poux, Cathy Wu, Ioannis Xenarios, etc.

GWAS Catalog: Aoife McMahon, Jackie MacArthur, Fiona Cunningham, Helen Parkinson

And many others at NLM/NIH and beyond!!

Data Sharing and Open Science

A word cloud featuring various datasets and models in the field of bioinformatics and natural language processing. The words are arranged in a roughly circular pattern, with 'PubMed' being the largest and most central word. Other prominent words include 'LitCovid', 'LitVar', 'PubTator', 'TeamTat', 'TaggerOne', 'LitSuggest', 'BioCreative', 'tmVar', 'BioConceptVec', 'BioC', 'DeepLensNet', 'Blue BERT', 'DeepSeeNet', 'ML-NET', 'NLM-Chem', 'BioSentVec', 'DNorm', 'BioWordVec', 'BLUE Benchmark', 'NLM-Gene', 'BC5CDR', 'tmChem', 'NegBio', and 'GNorm++'.

ChestX-ray14 Blue BERT DeepLensNet
BioCreative tmVar BioConceptVec BioC
LitVar NegBio PubTator
ML-NET PubMed DeepSeeNet
NLM-Chem BioSentVec
BLUE Benchmark LitCovid DNorm
TeamTat BioWordVec
NLM-Gene LitSuggest TaggerOne
BC5CDR tmChem GNorm++

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