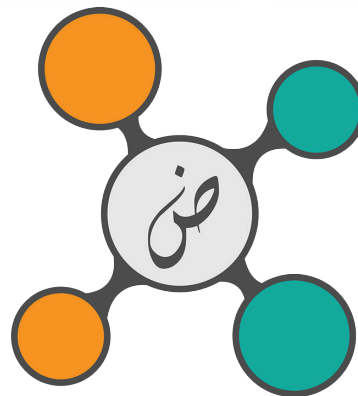




Arabic Natural Language Understanding as a Sustainable AI Research

Mustafa Jarrar
Birzeit University, Palestine

Artificial Intelligence

Opportunity
to invest in
Arabic
as **industry**
and
sustainable
R&D

The 4th Revolution

Opportunity
for
developing
countries to
compete and
impact

Huge Market

400
Million
users
(as a first
language)

1.6
Billion
users
(liturgical/
second
Language)

Other
users for
economic
and security
...

The background of the slide is a dense, out-of-focus collage of various social media and technology icons. These include recognizable symbols like the Twitter bird, a camera, a speech bubble, a hashtag, and a Wi-Fi signal, among others. The icons are in a variety of colors including blue, green, orange, red, and purple, creating a vibrant and tech-oriented visual context.

Consequences of not supporting Arabic in ICT

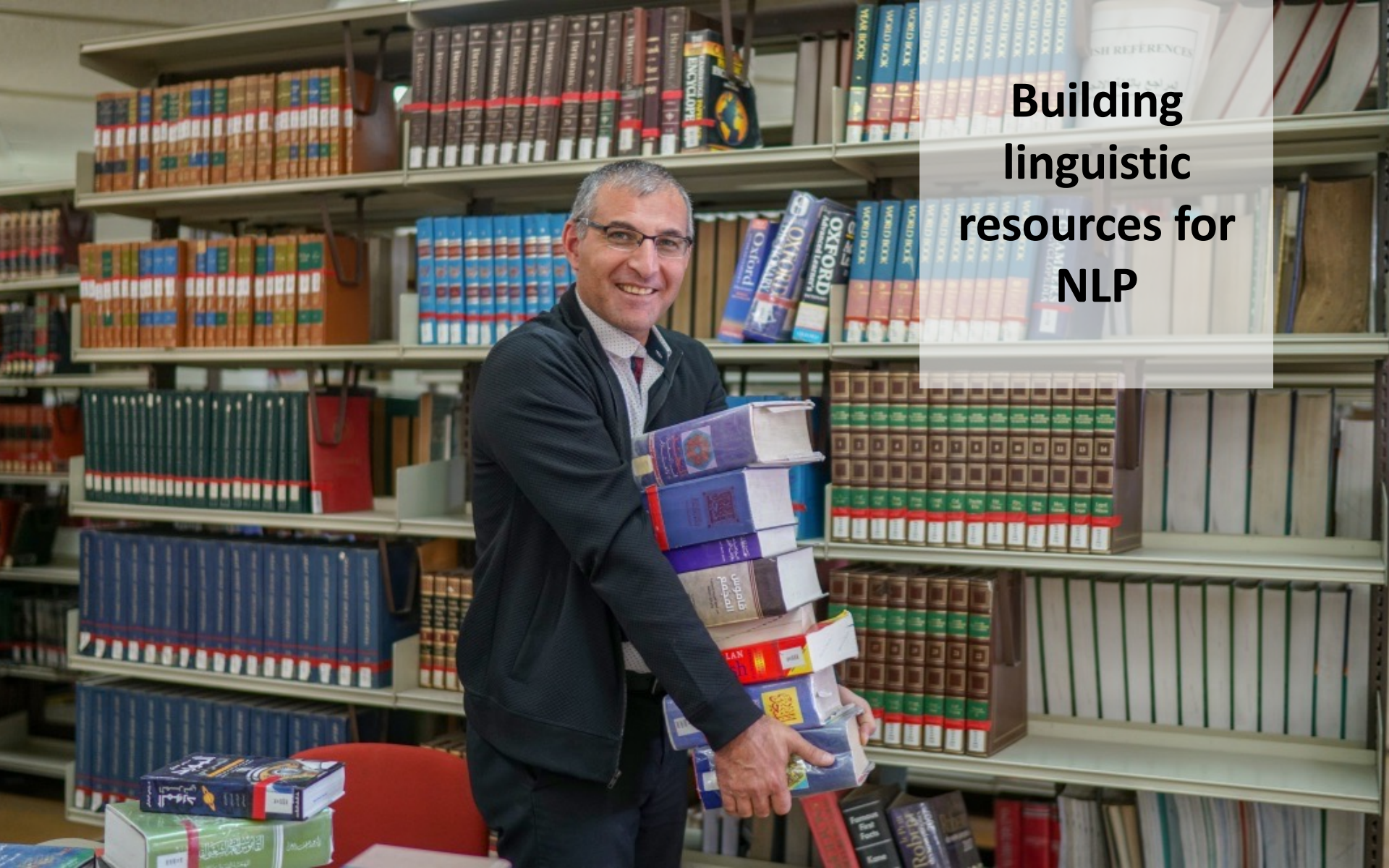
On Education, culture, economy, politics, people with special
needs,

Why Lexical Resources!

- ❖ The importance of lexical resources (dictionaries, thesauri, wordnets, linguistic ontologies) is increasing in many application areas, such as:
 - NLP tasks and applications
 - Information search and retrieval
 - Multilingual big data
 - Multilingual semantic web
 - Data integration
 - among many others.
- ❖ Lack of Arabic Lexical resources for human use!
- ❖ Lack of Arabic Lexical resources for NLP!

Digitize, Collect, Build, then clean and link

- **Make available online for people**
- **Make available through APIs for NLP applications**

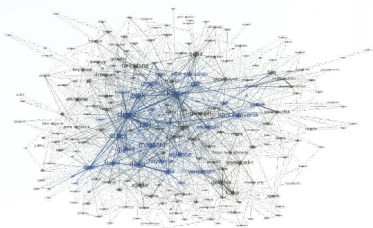
A man with glasses and a dark jacket is smiling while holding a large stack of books in a library. The shelves behind him are filled with various books, including sets of encyclopedias and dictionaries. The text 'Building linguistic resources for NLP' is overlaid on the right side of the image.

Building linguistic resources for NLP



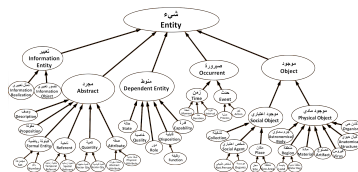
Lexical Resources at Birzeit University

Lexicographic Database



150 lexicons
Very large Arabic-multilingual database

Arabic Ontology



Formal Arabic Wordnet
with ontologically clean content

Dialect Corpora

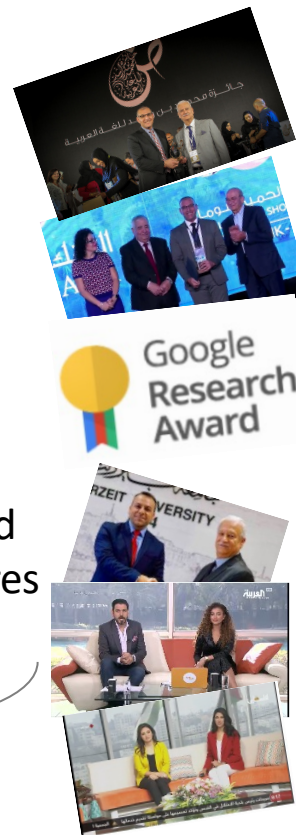
كراس
Corpus for Palestinian Arabic
مدرسة اللهجة العامية الفلسطينية

Search: Search

Annotated corpora
each word is annotated
with many morph features

Big Linguistic Data Graph

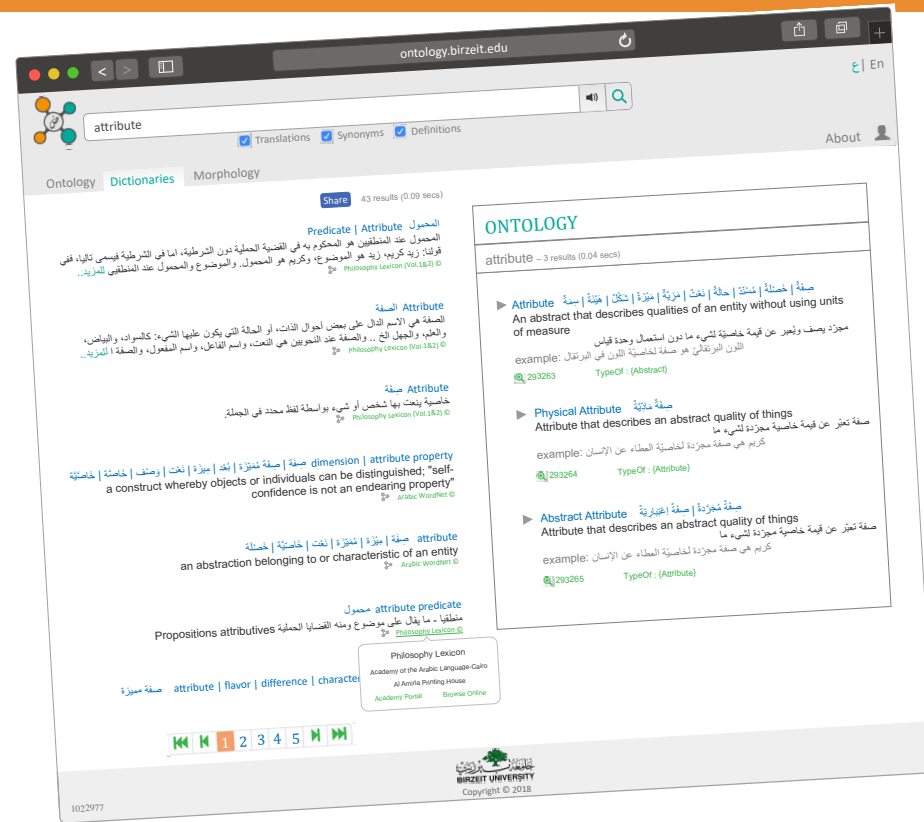
<https://ontology.birzeit.edu>



Lexicographic Search Engine

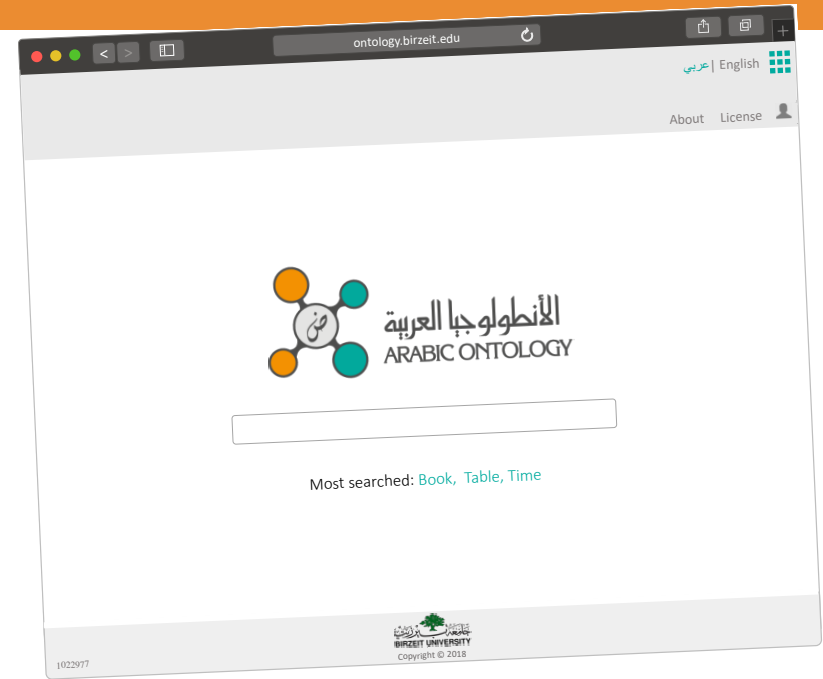
The Lexicographic Database

- The largest lexicographic Arabic database
- Contains most lexicon types: glossaries, thesauri, bi/trilingual dictionaries, morph datasets, **Arabic Ontology**, and more.
- Covers most domains: science, technology, law, business, art, philosophy, ...



Lexicographic Search Engine

- **Free access to people:** students, translators, researchers, Arabic learners ...
- **API accessible** for NLP applications.
- **Done over 9 years (No funding!)**



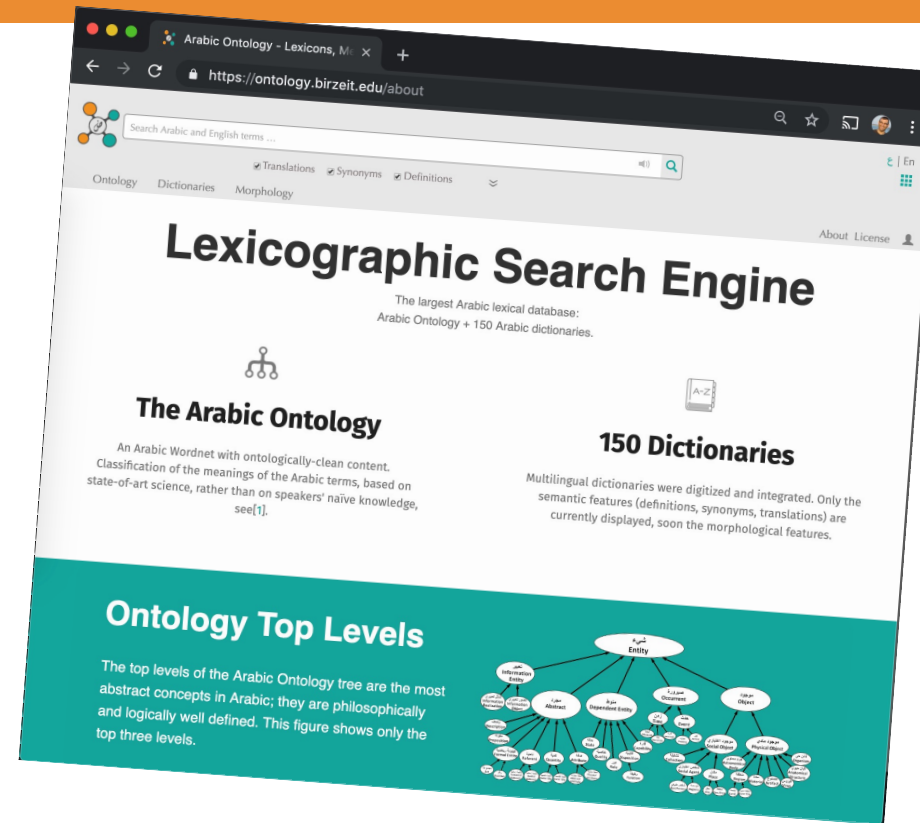
<https://ontology.birzeit.edu>

Reference:

Mustafa Jarrar, Hamzeh Amayreh: **An Arabic-Multilingual Database with a Lexicographic Search Engine.** NLDB 2019. Pages(234--246), LNCS 11608, Springer. 2019.

Lexicographic Search Engine

- **Search 150 lexicons** for definitions, synonyms, specialized translations, morphology, ontology [3,4] ...
- **Accurate!** compared with machine translation.
- **The first of its kind!** e.g., there are no similar search engines for English lexicons!



Some Statistics

Currently!

Category	Lexical Concepts	Lexical entries	Synsets	Translations pairs	Glosses	Semantic relations
Total (Millions)	1.1 M	2.4 M	1.8 M	1.5 M	0.7 M	0.5 M
Sub Counts		1,100K Arabic 1,100K English 200K French 3K Others 1,300K Single-word 1,000K Multi-word	800K Arabic 800K English 200K French 50K Others	1,000K English-Arabic 300K English-French 200K French-Arabic	400K Arabic 300K English 1K Others	170K Sub-super links 29K Part-of links 260K Has-Domain links 30K Other links

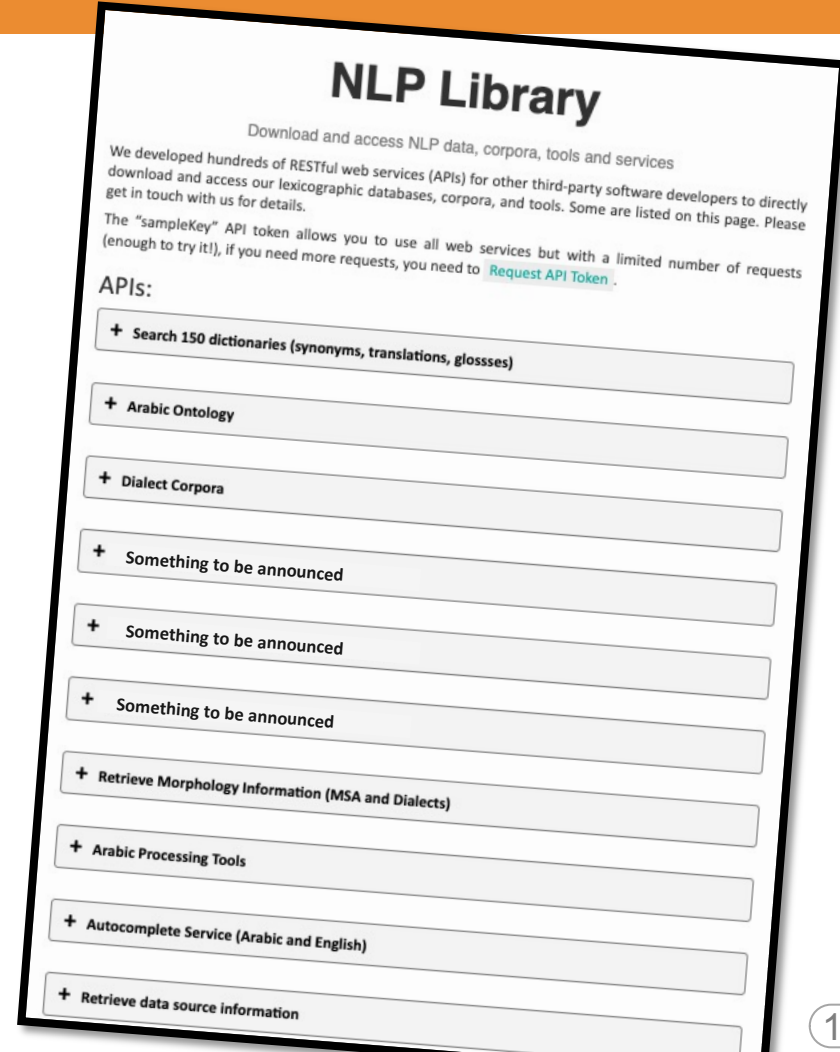
For more, see [3]

Accessible

To download and access NLP data, corpora, tools and services

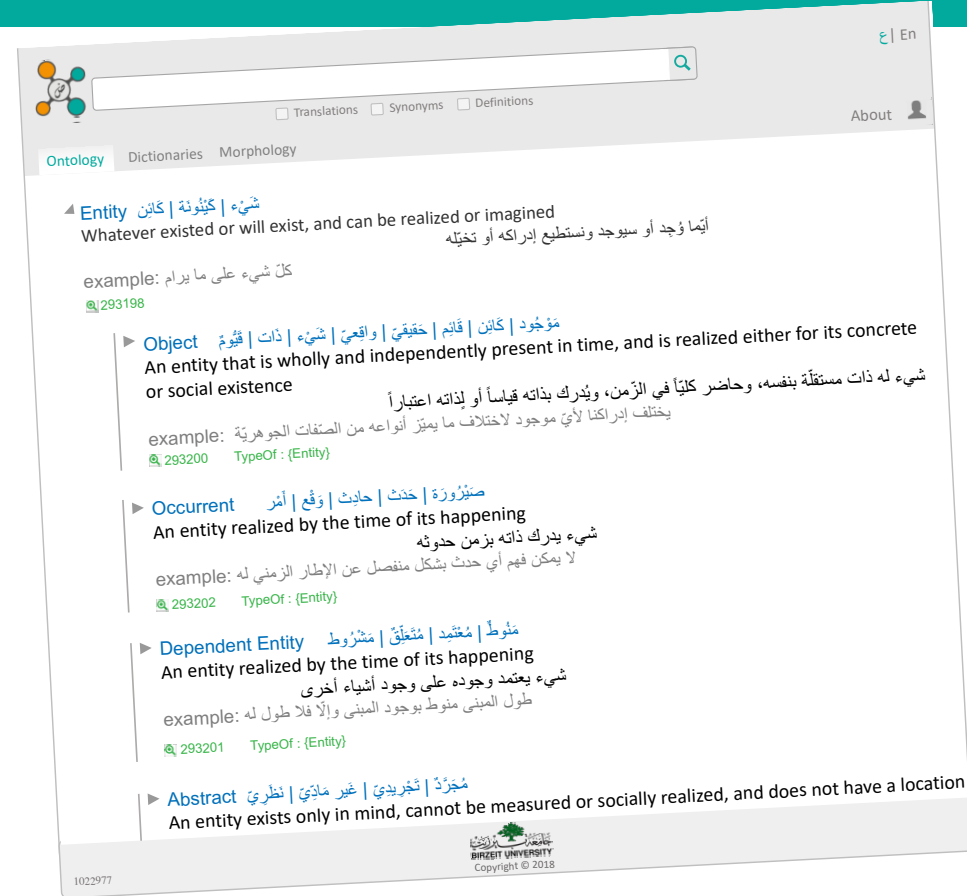
RESTful web services

Ask us for an API Key!



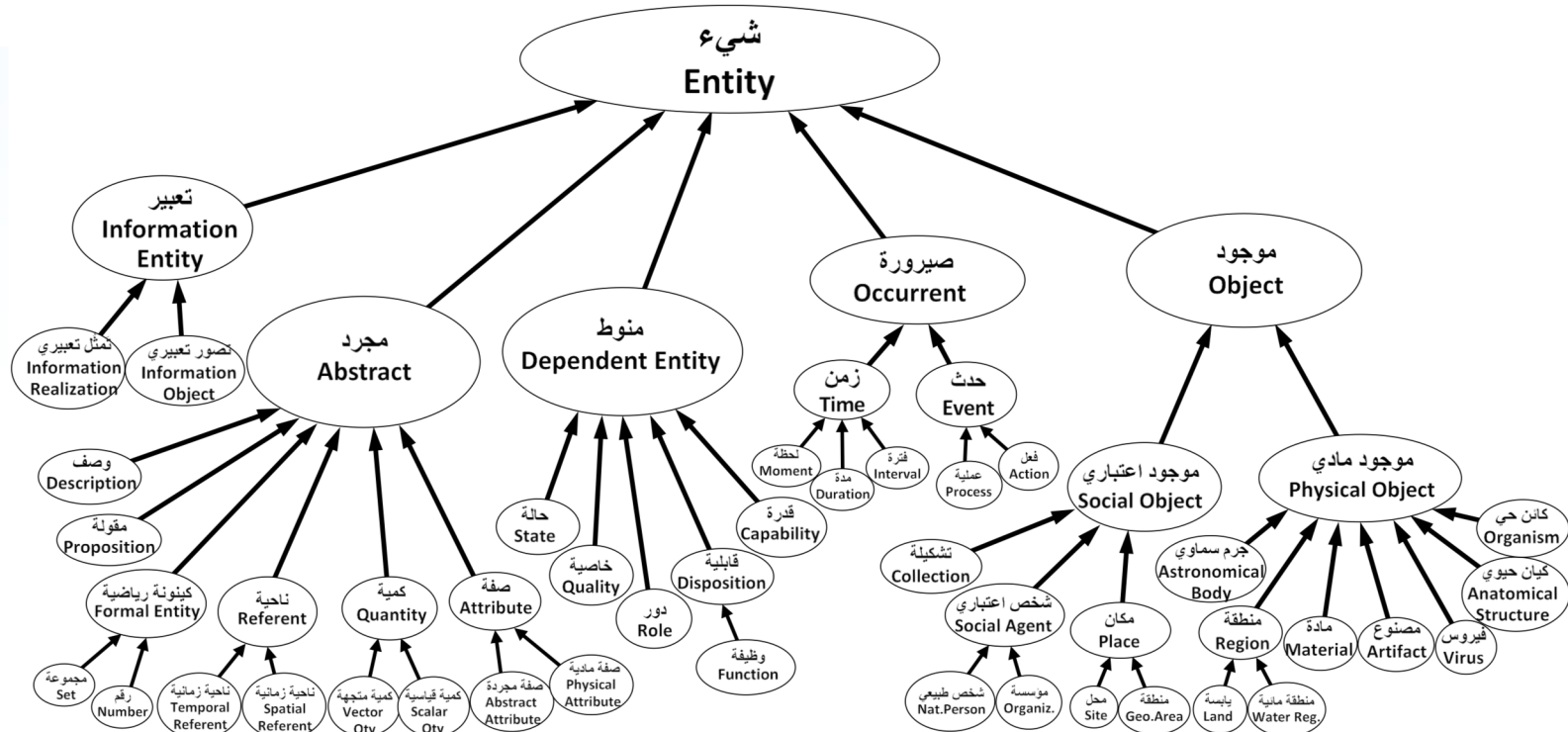
Arabic Ontology

- To enable machine understand semantics.
- Classification of the meanings of the Arabic terms, specified in D. Logic
- Benchmarked to scientific advances rather than to speakers' naïve beliefs as wordnets do.



<https://ontology.birzeit.edu/concept/293198>

Arabic Ontology

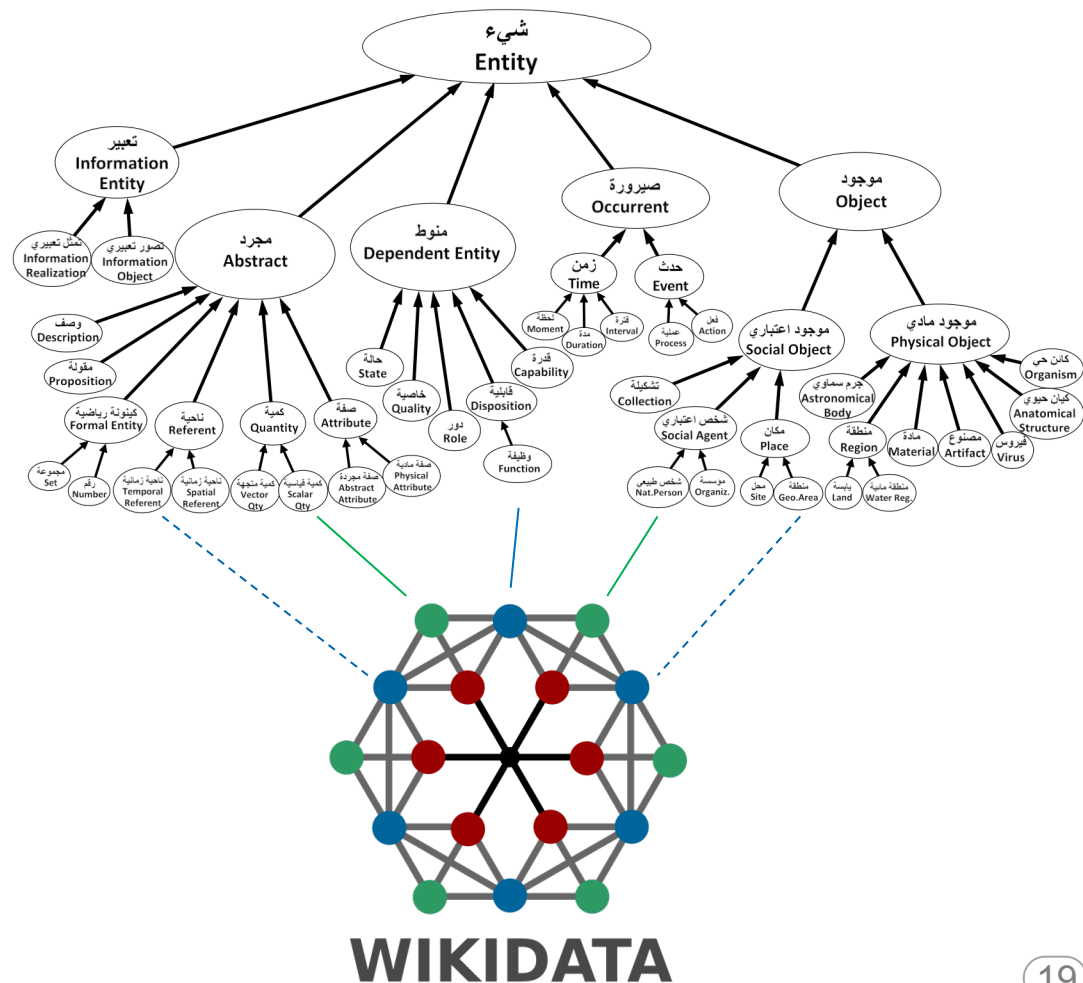


Based on:

Mustafa Jarrar: **The Arabic Ontology - An Arabic Wordnet with Ontologically Clean Content.** Applied Ontology Journal, IOS Press. (Forthcoming).

Linking the Ontology with Knowledge Graphs

- Every concept in the ontology is linked with a node in the Wikidata
- In this way, one can access the the world knowledge as an Arabic knowledge graph
- So, we can build applications like chatbots and question answering, ...



Dialect Corpus

<http://portal.sina.birzeit.edu/curras>

- To enable machines understand dialects.
- We collected a corpus written in Palestinian dialect (60k words).
- Described and annotate each word with 16 tags.



Based on:

Mustafa Jarrar, Nizar Habash, Faeq Alrimawi, Diyam Akra, Nasser Zalmout: Curras: **An Annotated Corpus for the Palestinian Arabic Dialect**. Journal Language Resources and Evaluation. Volume(51), Issue(3). Springer. 2017

Dialect Corpus

<http://portal.sina.birzeit.edu/curras>



Curras
Corpus for Palestinian Arabic
مدونة اللهجة العامية الفلسطينية



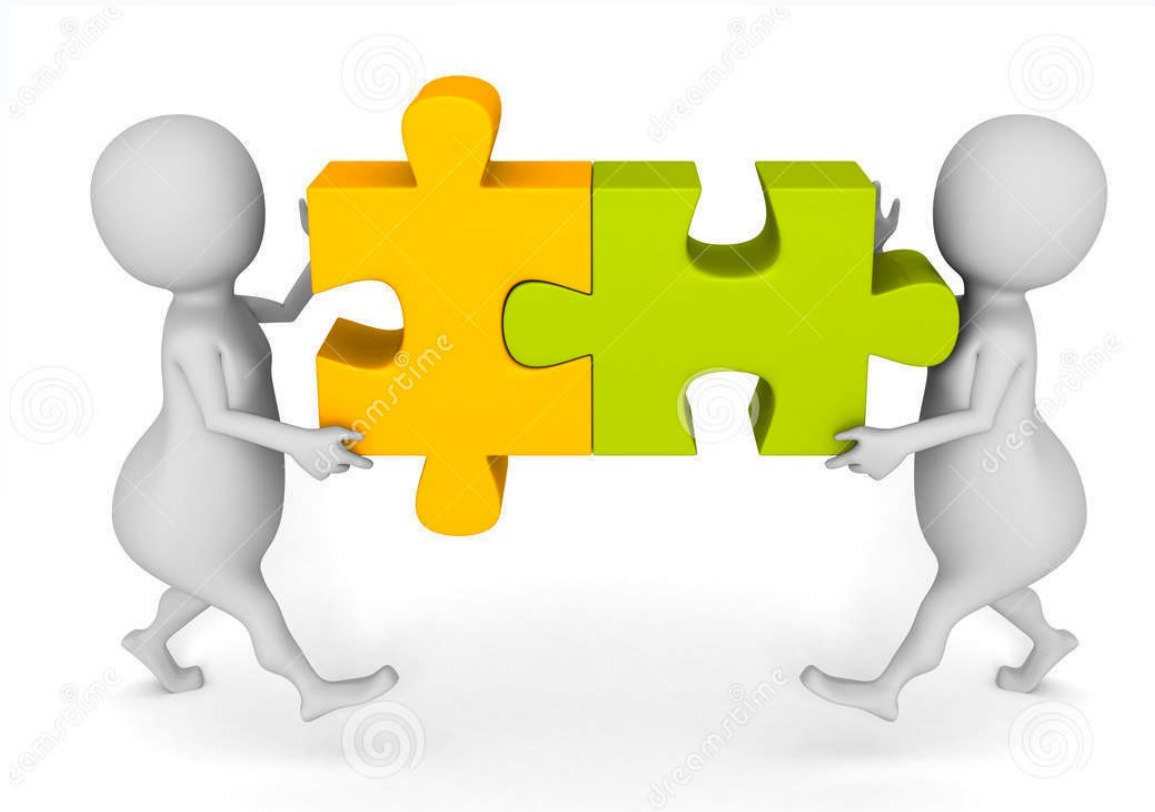
BIRZEIT UNIVERSITY

☒ Word
 ☒ Stem
 ☒ MSA
 ☒ Surface
 ☒ Gloss

☐ Whole Word
 ☒ Substring

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بقولكوا	قول	قال 1	قال 1	باقولكو	b/PROG_PART+A/IV 1S+qwl/IV+kwl/IVSUF F_DO:2P	said:say;be_said; (for_example)_[CALIMA]	Verb	1	M	بنتنا زي كعك العيد بنتفق بسرعة. العريس : والله انتو عيلة ما بشتريكووا بقمعة سيجارة , اخر اثني بقولكو اياه غروس مالبورو شو قلتوا ؟ الام : اسمع ولا , خاي ا
بقولك	قول	قال 1	قال 1	بيقولك	b/PROG_PART+y/IV 3MS+qwl/IV+k/IVSUF F_DO:2MS	said:say;be_said; (for_example)_[CALIMA]	Verb	3	M	زيون يا بقتل امي . منال : عنا بتطلع بالتكسي . . . ايه ازمة . بتسأل الشوفير شوف س ليش مازمة ؟ بقولك ما هو اليوم الخميس هيك . بتطلع السبت يا زلمة شو القص
بقولك	قول	قال 1	قال 1	بيقولك	b/PROG_PART+y/IV 3MS+qwl/IV+k/IVSUF F_DO:2MS	said:say;be_said; (for_example)_[CALIMA]	Verb	3	M	ير شوف س ليش مازمة ؟ بقولك ما هو اليوم الخميس هيك . بتطلع السبت يا زلمة شو القصه ليش مازمة ؟ بقولك يوم السبت عادة هيك , بتطلع الاثنين له له له له شوه الأز
بقولك	قول	قال 1	قال 1	بيقولك	b/PROG_PART+y/IV 3MS+qwl/IV+k/IVSUF F_DO:2MS	said:say;be_said; (for_example)_[CALIMA]	Verb	3	M	مة شو القصه ليش مازمة ؟ بقولك يوم السبت عادة هيك , بتطلع الاثنين له له له له شوه الأزمة شو في ؟ بقولك يوم الاثنين فش مجال دايم هيك . بتطلع الثلاثاء ول لي
بقولك	قول	قال 1	قال 1	بيقولك	b/PROG_PART+y/IV 3MS+qwl/IV+k/IVSUF F_DO:2MS	said:say;be_said; (for_example)_[CALIMA]	Verb	3	M	الثلاثاء ول ليش كل هالأزمة . يوم الثلاثاء بختي معروف فس نفس . بتطلع الخميس ليش هالقدة الأزمة بقولك يوم الخميس دايم هيك , هذا يوم في الاسبوع طايير . بتر
بقولك	قول	قال 1	قال 1	بيقولك	b/PROG_PART+y/IV 3MS+qwl/IV+k/IVSUF F_DO:2MS	said:say;be_said; (for_example)_[CALIMA]	Verb	3	M	اط@@صتند @@اط@@@ة منال. عنا بتطلع بالتكسي . . . ايه ازمة . بتسأل الشوفير شوف س ليش مازمة ؟ بقولك ما هو اليوم الخميس هيك . بتطلع السبت يا زلمة شو القص
بقولك	قول	قال 1	قال 1	بيقولك	b/PROG_PART+y/IV 3MS+qwl/IV+k/IVSUF F_DO:2MS	said:say;be_said; (for_example)_[CALIMA]	Verb	3	M	الثلاثاء ول ليش كل هالأزمة . يوم الثلاثاء بختي معروف فس نفس . بتطلع الخميس ليش هالقدة الأزمة بقولك يوم الخميس دايم هيك , هذا يوم في الاسبوع طايير . L@@@



Connecting
lexical resources

W3C Lemon RDF Model Standard

Lexicon Model for Ontologies: Community Report, 10 May 2016



Final Community Group Report 10 May 2016

Editors:

Philipp Cimiano (Cognitive Interaction Technology Excellence Center, Bielefeld University)

John P. McCrae (Insight Centre for Data Analytics, National University of Ireland, Galway)

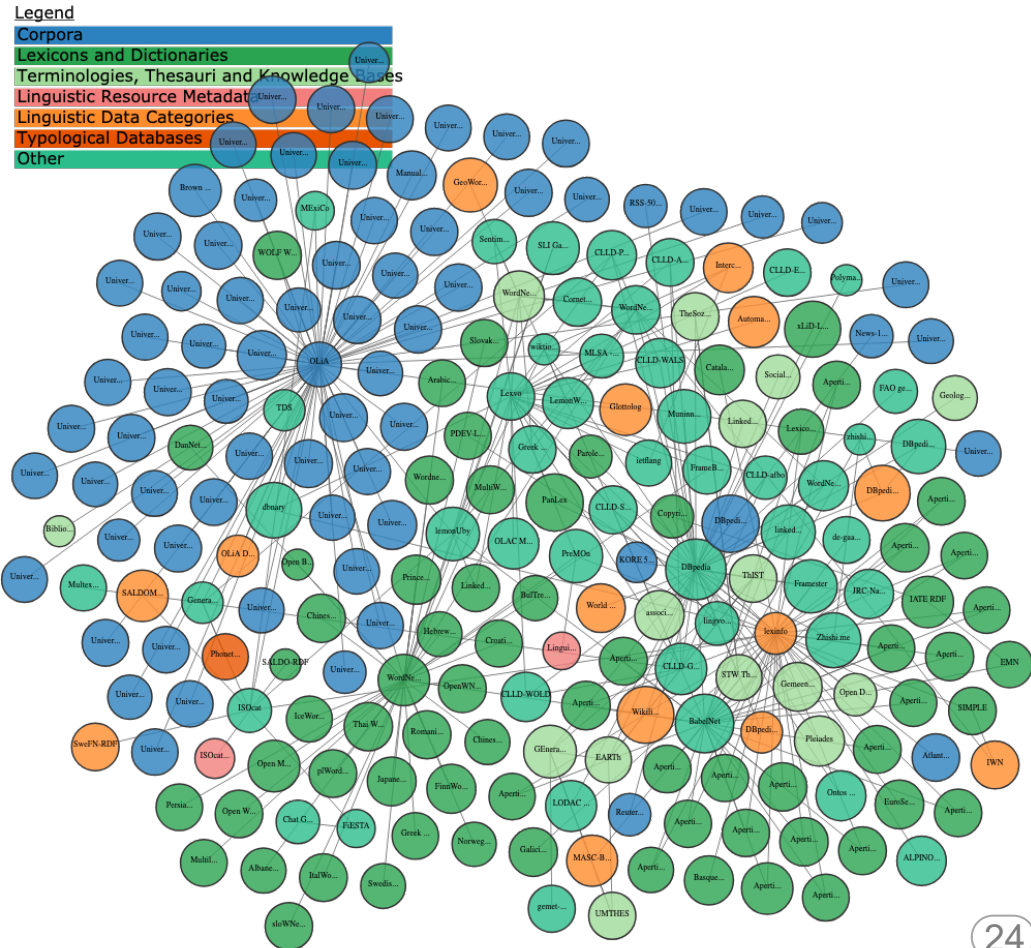
Paul Buitelaar (Insight Centre for Data Analytics, National University of Ireland, Galway)

[Copyright](#) © 2016 the Contributors to the Lexicon Model for Ontologies: Community Report, 10 May 2016 Specification, published by the [Ontology-Lexicon Community Group](#) under the [W3C Community Final Specification Agreement \(FSA\)](#). A human-readable [summary](#) is available.

Abstract

This document describes the lexicon model for ontologies (*lemon*) as a main outcome of the work of the Ontology Lexicon (Ontolex) community group.

The Linguistic Linked Open Data Cloud



- A collaborative effort to develop a Linked Open Data (sub-)cloud of linguistic resources.
- Represent (lexical entries, concepts, synsets, and other) using Lemon RDF model, then interlinked.

Linking All linguistics levels

خمس دكايك بوصل الكمر

Sentence in
MSA/Dialect

CODA: القمر
POS_ar: اسم/قمر + تعريف
POS_bw: Al/DET + qmr/NOUN
Gender: مذكر
Number: مفرد
Lemma: قَمَر_1
....

CODA: دقائق
POS_ar: اسم/ادقايق
POS_bw: dqAyq/NOUN
Gender: مؤنث
Number: جمع
Lemma: دَقِيقَة_1
....

Morphology
Level

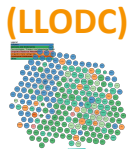
المدخلة: قَمَر_1
(المصدر: قاعدة بيانات سما)
اللغة: فصحي حديثة
نوع المدخلة: اسم
تصريفات أخرى: قَمَر، قَمَر، قَمَر، قَمَر، قَمَر، قَمَر،
المعنى:
(AO_51587) moon ◦

المدخلة: دَقِيقَة_1
(المصدر: قاعدة بيانات سما)
اللغة: فصحي حديثة
صيغة المفرد المؤنث: دَقِيقَة
صيغة المثنى المؤنث: دَقِيقَتَيْنِ / دَقِيقَتَيْنِ /
تصريفات أخرى: دَقَائِق، دَقَائِق، دَقَائِق، دَقَائِق،
المعنى:
(AO_293582) minute ◦

Lexical/
Ontology
Semantics

جسم سماوي | جسم فلكي
Astronomical Body
A Physical object exists naturally in space
موجود مادي يتواجد بشكل طبيعي في الفضاء
example: النجم هو جسم سماوي متوهج وممتدح ومضيء بذاته
293258 TypeOf: (physical object)
قمر | تابع satellite
جسم سماوي يدور حول كوكب آخر، لا يشمل ذلك الكواكب التي تدور حول شمس
example: نيل ارمنسترونغ هو اول رجل خطا على قمر الأرض
51587 TypeOf: (Astronomical Body)

دَقِيقَة
فترة زمنية تشكل جزءاً من ستين جزءاً متساوياً من الساعة
example: توجد 1436 دقيقة في اليوم الواحد
293582 TypeOf: (Interval)



Example Case Study

Word Sense Disambiguation

Moustafa Al-Hajj, Mustafa Jarrar: [ArabGlossBERT: Fine-Tuning BERT on Context-Gloss Pairs for WSD](#). In Proceedings of the International Conference on Recent Advances in Natural Language Processing (RANLP 2021). PP 40--48, 2021

The Word Sense Disambiguation (WSD) Task

Given a word in a context, which sense (i.e. meaning) this word denotes?

قصيدة من عيون الشعر

Set of senses

1. عُضُو الإِبْصَارِ فِي الْإِنْسَانِ وَالْحَيَوَانَ: لَهُ عَيْنَانِ كَعَيْنَيْ الصَّقْرِ - أَلَا إِنَّمَا الْعَيْنَانِ لِلْقَلْبِ رَائِدٌ ...
2. جَاسُوسٌ، "كَانَ عَيْنًا لِدَوْلَةٍ أجنبيَّةٍ . بَثَّ الْعَيُونُ : تَجَسَّسَ، رَاقِبَ - فَلَانٌ عَيْنٌ عَلَى فَلَانٍ : نَاطِرٌ عَلَيْهِ
3. أَجُودُ كُلِّ شَيْءٍ وَأَحْسَنُهُ وَنَفِيسُهُ: عَيُونُ الْفَنِّ.
4. حَارِسٌ: فَلَانٌ عَيْنٌ عَلَى الْمَكَانِ.
5. الْحَاضِرُ مِنْ كُلِّ شَيْءٍ أَصْبَحَ أَثَرًا بَعْدَ عَيْنٍ ...
6. عَيْنُ الْمَاءِ:- يَنْبُوعُهُ، تُحَلِّقُ الطَّيُورُ فَوْقَ عَيُونِ الْمَاءِ
7. عَيْنُ الشَّيْءِ:- نَفْسُهُ، ذَاتُهُ (تَسْتَعْمَلُ لِلتَّوَكِيدِ): جَاءَ الْقَوْمُ أَعْيُنَهُمْ - كُنَّا فِي الْمَكَانِ عَيْنَهُ.
8. عَيْنُ الْعَقْلِ:- قُدْرَةُ ذَهْنِيَّةٍ مَوْرُوثَةٍ عَلَى التَّخْيِيلِ وَتَذَكُّرِ الْأَحْدَاثِ.
9.

WSD has been a challenging task for many years but has gained recent attention due to the advances in contextualized word embedding models such as BERT.

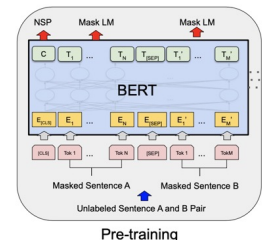
❖ Arabic context-gloss pairs Dataset (167k)

- Extracted from Birzeit University's Lexicographic database
- Annotated target words in context;

Gloss	Context	Label
[SEP] أجود كل شيء وأحسنه ونفيسه [SEP]	[CLS] قصيدة من عيون الشعر [SEP]	True
[SEP] أجود كل شيء وأحسنه ونفيسه [SEP]	[CLS] قصيدة من عيون الشعر [SEP]	False
[SEP] أجود كل شيء وأحسنه ونفيسه [SEP]	[CLS] جاء القوم أعينهم [SEP]	True
[SEP] أجود كل شيء وأحسنه ونفيسه [SEP]	[CLS] جاء القوم أعينهم [SEP]	False

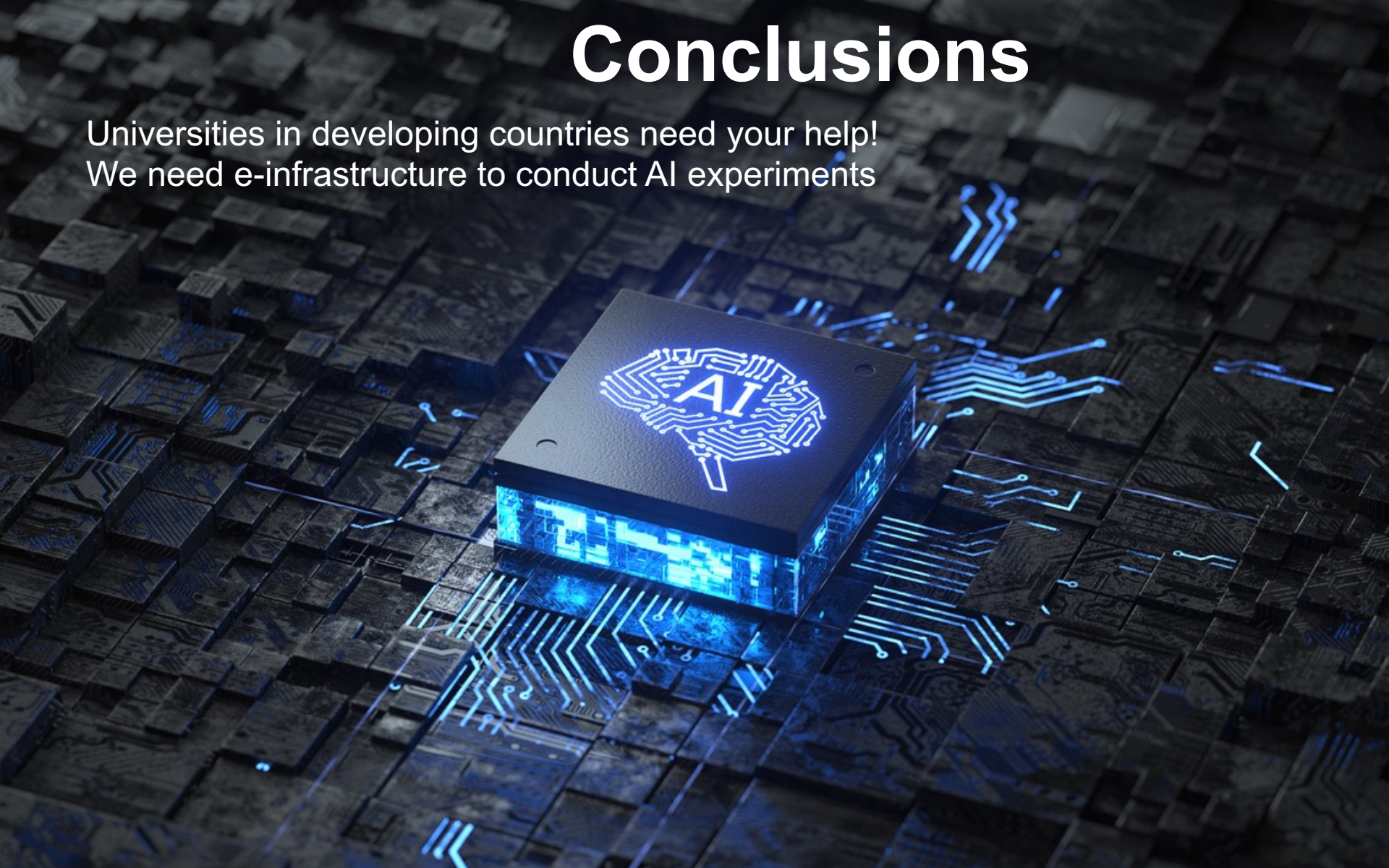
❖ Three Fine-tuned BERT Models

- WSD into **binary sequence-pair classification task**
- **Accuracy 84%**
- 4 types of signals to emphasize target words in context



Conclusions

Universities in developing countries need your help!
We need e-infrastructure to conduct AI experiments



References

1. Moustafa Al-Hajj, Mustafa Jarrar: [ArabGlossBERT: Fine-Tuning BERT on Context-Gloss Pairs for WSD](#). In Proceedings of the International Conference on Recent Advances in Natural Language Processing (RANLP 2021). PP 40--48, 2021
2. Mustafa Jarrar. [The Arabic Ontology - An Arabic Wordnet with Ontologically Clean Content](#). Applied Ontology Journal, IOS Press, 2021.
3. Mustafa Jarrar, Hamzeh Amayreh. [An Arabic-Multilingual Database with a Lexicographic Search Engine](#). Proceedings of the 24th International Conference on Applications of Natural Language to Information Systems (NLDB), 2019.
Mustafa Jarrar: [Search Engine for Arabic Lexicons](#). Proceedings of the 5th Conference on Translation and the Problematics of Cross-cultural Understanding. The Forum for Arab and International Relations. Doha, Qatar. 2018
4. Hamzeh Amayreh, Mohammad Dwaikat, and Mustafa Jarrar. [Lexicon Digitization -A Framework for Structuring, Normalizing and Cleaning Lexical Entries](#). Technical Report, Birzeit University. 2018.
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6. Mustafa Jarrar, Nizar Habash, Faeq Alrimawi, Diyam Akra, and Nasser Zalmout. [Curras: An Annotated Corpus for the Palestinian Arabic Dialect](#). Journal Language Resources and Evaluation, 51(3):745--775, 2017.
7. Mustafa Jarrar, Nizar Habash, Diyam Akra, Nasser Zalmout: [Building a Corpus for Palestinian Arabic: a Preliminary Study](#). In proceedings of the EMNLP 2014 Workshop on Arabic Natural Language Processing. Association for Computational Linguistics (ACL), Pages (18-27). October 25, 2014, Doha, Qatar. ISBN: 978-1-937284-96-1
8. Mustafa Jarrar. [Building a Formal Arabic Ontology \(Invited Paper\)](#). In Proceedings of the Experts Meeting on Arabic Ontologies and Semantic Networks. ALECSO, Arab League, 2011

Thank You

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