

知识图谱中的实体摘要

——基于神经网络的方法

程龚 南京大学

gcheng@nju.edu.cn

普通青年：南昌@Wikipedia

南昌市 [编辑]

维基百科，自由的百科全书



“南昌”重定向至此。关于其他用法，请见“**南昌** (消歧义)”。

南昌市（**普通话**：Nánchāng shì，**赣语白话字**：lan³¹ʈʰoŋ¹¹ si³²），简称**洪、昌**，古称**豫章**、**洪州**、**隆兴**、**钟陵**，别称“**天下英雄城**”，是**中华人民共和国江西省**省会，位于江西省北部偏北。市境北临**九江市**，西界**宜春市**，南达**抚州市**，东接**上饶市**。地处**豫章平原**腹地，东南部地势平坦，西北部为丘陵。**赣江**、**抚河**纵贯市境中部，往北注入**鄱阳湖**。境内湖泊众多，有**青岚湖**、**军山湖**、**金溪湖**、**瑶湖**、**南塘湖**等。全市总面积7,195平方公里，人口537.14万，市人民政府驻**红谷滩区**。南昌是**国家历史文化名城**，建城史逾二千二百年，有**海昏侯墓**、**滕王阁**、**八大山人纪念馆**等名胜古迹，亦为**鄱阳湖生态经济区**核心城市、全国性综合交通枢纽、航空工业基地和光电产业基地。

目录 [隐藏]

1 历史

- 1.1 史前至魏晋
- 1.2 隋唐至五代
- 1.3 宋元至明代
- 1.4 清代至民国
- 1.5 南昌国民政府（1928年—1939年）
- 1.6 1949年至今

2 地理

- 2.1 地形
- 2.2 水系
- 2.3 自然资源
- 2.4 气候
- 2.5 环境质量

3 政治

- 3.1 现任领导
- 3.2 行政区划

4 人口

- 4.1 民族

5 交通

文艺青年：南昌@DBpedia

```
1 @prefix dbp: <http://dbpedia.org/property/> .
2 @prefix dbr: <http://dbpedia.org/resource/> .
3 <http://dbpedia.org/resource/2005_Chinese_FA_Cup> dbp:stadium dbr:Nanchang .
4 @prefix dbo: <http://dbpedia.org/ontology/> .
5 dbr:Landwind_X6 dbo:assembly dbr:Nanchang .
6 dbr:Ford_Transit_Third_generation_1 dbo:assembly dbr:Nanchang .
7 dbr:Bada_Shanren dbo:birthPlace dbr:Nanchang .
8 dbr:Mei_Ju-ao dbo:birthPlace dbr:Nanchang .
9 <http://dbpedia.org/resource/Franu00E7ois_Cheng> dbo:birthPlace dbr:Nanchang .
10 dbr:Shi_Ping dbo:deathPlace dbr:Nanchang .
11 <http://dbpedia.org/resource/Peopleu0027s_Park_(Nanchang)> dbo:location dbr:Nanchang .
12 <http://dbpedia.org/resource/Nanchang,_Jianxi> dbo:wikiPageRedirects dbr:Nanchang .
13 dbr:Jianxi_Agricultural_University dbo:city dbr:Nanchang .
14 dbr:Nanchang_University dbo:city dbr:Nanchang .
15 dbr:Jiangling_Motors dbo:locationCity dbr:Nanchang .
16 dbr:Jiangxi_University_of_Traditional_Chinese_Medicine dbo:city dbr:Nanchang .
17 <http://dbpedia.org/resource/Jiangxi_Liansheng_F.C.> dbp:city dbr:Nanchang .
18 dbr:East_China_Jiaotong_University dbo:city dbr:Nanchang .
19 <http://dbpedia.org/resource/2014_Chinese_FA_Cup> dbp:location dbr:Nanchang .
20 <http://dbpedia.org/resource/Xiangtang,_Jiangxi> dbo:isPartOf dbr:Nanchang .
21 dbr:Jiangxi dbp:largestcity dbr:Nanchang ;
22 dbp:capital dbr:Nanchang .
23 @prefix foaf: <http://xmlns.com/foaf/0.1/> .
24 @prefix wikipedia-en: <http://en.wikipedia.org/wiki/> .
25 wikipedia-en:Nanchang foaf:primaryTopic dbr:Nanchang .
26 dbr:Nanchang_Jiangxi dbo:wikiPageRedirects dbr:Nanchang .
27 dbr:Medical_College_of_Nanchang_University dbo:city dbr:Nanchang .
. . . . .
479 <http://dbpedia.org/resource/1998_Guangzhou_Apollo_F.C._season> dbp:location dbr:Nanchang .
480 <http://dbpedia.org/resource/2011_Chinese_FA_Cup> dbp:stadium dbr:Nanchang .
481 dbr:Ford_Transit_China_1 dbo:assembly dbr:Nanchang .
482 dbr:Ford_Transit_Second_generation_1 dbo:assembly dbr:Nanchang .
483 dbr:Northern_Kiang-si dbo:wikiPageRedirects dbr:Nanchang .
484 <http://dbpedia.org/resource/u5357u660C> dbo:wikiPageRedirects dbr:Nanchang .
485 dbr:Capital_of_Jiangxi dbo:wikiPageRedirects dbr:Nanchang .
486 <http://dbpedia.org/resource/u5357u660Cu5E02> dbo:wikiPageRedirects dbr:Nanchang .
```

文艺青年（知识图谱）也需要实体摘要

```
1 @prefix dbp: <http://dbpedia.org/property/> .
2 @prefix dbr: <http://dbpedia.org/resource/> .
3 <http://dbpedia.org/resource/2005_Chinese_FA_Cup> dbp:stadium dbr:Nanchang .
4 @prefix dbo: <http://dbpedia.org/ontology/> .
5 dbr:Landwind_X6 dbo:assembly dbr:Nanchang .
6 dbr:Ford_Transit_Third_generation_1 dbo:assembly dbr:Nanchang .
7 dbr:Bada_Shanren dbo:birthPlace dbr:Nanchang .
8 dbr:Mei_Ju-ao dbo:birthPlace dbr:Nanchang .
9 <http://dbpedia.org/resource/Franu00E7ois_Cheng> dbo:birthPlace dbr:Nanchang .
10 dbr:Shi_Ping dbo:deathPlace dbr:Nanchang .
11 <http://dbpedia.org/resource/Peopleu0027s_Park_(Nanchang)> dbo:location dbr:Nanchang .
12 <http://dbpedia.org/resource/Nanchang_Jianxi> dbo:wikiPageRedirects dbr:Nanchang .
13 dbr:Jiangxi_Agricultural_University dbo:city dbr:Nanchang .
14 dbr:Nanchang_University dbo:city dbr:Nanchang .
15 dbr:Jiangling_Motors dbo:locationCity dbr:Nanchang .
16 dbr:Jiangxi_University_of_Traditional_Chinese_Medicine dbo:city dbr:Nanchang .
17 <http://dbpedia.org/resource/Jiangxi_Liansheng_FC> dbp:city dbr:Nanchang .
18 dbr:East_China_Jiaotong_University dbo:city dbr:Nanchang .
19 <http://dbpedia.org/resource/2014_Chinese_FA_Cup> dbp:location dbr:Nanchang .
20 <http://dbpedia.org/resource/Xiangtan_Jiangxi> dbp:isPartOf dbr:Nanchang .
21 dbr:Jiangxi dbo:largestCity dbr:Nanchang ;
22 dbp:capital dbr:Nanchang .
23 @prefix foaf: <http://xmlns.com/foaf/0.1/> .
24 @prefix wikipedia-en: <http://en.wikipedia.org/wiki/> .
25 wikipedia-en:Nanchang foaf:primaryTopic dbr:Nanchang .
26 dbr:Nanchang_Jiangxi dbo:wikiPageRedirects dbr:Nanchang .
27 dbr:Medical_College_of_Nanchang_University dbo:city dbr:Nanchang .
```

...

```
479 <http://dbpedia.org/resource/1998_Guangzhou_Anglo_FC_season> dbp:location dbr:Nanchang .
480 <http://dbpedia.org/resource/2011_Chinese_FA_Cup> dbp:stadium dbr:Nanchang .
481 dbr:Ford_Transit_China_1 dbo:assembly dbr:Nanchang .
482 dbr:Ford_Transit_Second_generation_1 dbo:assembly dbr:Nanchang .
483 dbr:Northern_Kiang-si dbo:wikiPageRedirects dbr:Nanchang .
484 <http://dbpedia.org/resource/u5357u660C> dbo:wikiPageRedirects dbr:Nanchang .
485 dbr:Capital_of_Jiangxi dbo:wikiPageRedirects dbr:Nanchang .
486 <http://dbpedia.org/resource/u5357u660Cu5E02> dbo:wikiPageRedirects dbr:Nanchang .
```



南昌市 [编辑]

维基百科，自由的百科全书

◀ “南昌”重定向至此。关于其他用法，请见“南昌 (消歧义)”。

南昌市（普通话：Nánchāng shì，**赣语白话字**：lan³¹chən¹¹si³²），简称**洪、昌**，古称**豫章、洪州、隆兴、钟陵**，别称“天下英雄城”，是中华人民共和国江西省省会，位于江西省北部偏北。市境北临九江市，西界宜春市，南达抚州市，东接上饶市。地处豫章平原腹地，东南部地势平坦，西北部为丘陵。赣江、抚河纵贯市境中部，往北注入鄱阳湖。境内湖泊众多，有青岚湖、军山湖、金溪湖、瑶湖、南塘湖等。全市总面积7,195平方公里，人口537.14万，市人民政府驻**红谷滩区**。南昌是**国家历史文化名城**，建城史逾二千二百年，有海昏侯墓、滕王阁、八大山人纪念馆等名胜古迹，亦为鄱阳湖生态经济区核心城市、全国性综合交通枢纽、航空工业基地和光电产业基地。

目录 [编辑]

- 1 历史
 - 1.1 史前至魏晋
 - 1.2 隋唐至五代
 - 1.3 宋元至明代
 - 1.4 清代至民国
 - 1.5 南昌国民政府（1928年—1939年）
 - 1.6 1949年至今
- 2 地理
 - 2.1 地形
 - 2.2 水系
 - 2.3 自然资源
 - 2.4 气候
 - 2.5 环境质量
- 3 政治
 - 3.1 现任领导
 - 3.2 行政区划
- 4 人口
 - 4.1 民族
- 5 交通

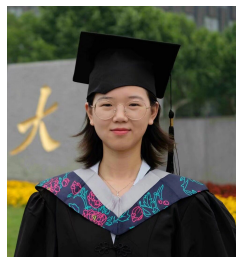
感谢合作者——他们才是智慧的源泉



刘庆霞 (应届博士生)
qxliu_nju@126.com



李俊宥



陈越



张文



陈华钧



瞿裕忠



Thanh Tran

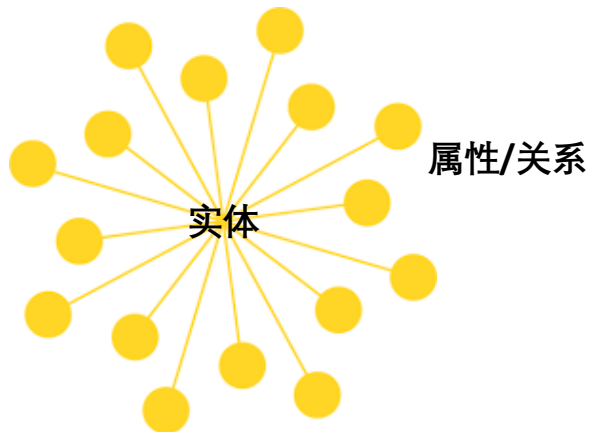


Kalpa Gunaratna



Evgeny Kharlamov

知识图谱中的实体摘要——问题提出



知识图谱中的实体摘要——问题提出

Google The Keyword Latest stories Product updates Company news

SEARCH

Introducing the Knowledge Graph: things, not strings

Amit Singhal
SVP, Engineering

Published May 16, 2012

Search is a lot about discovery—the basic human need to learn and broaden your horizons. But searching still requires a lot of hard work by you, the user. So today I'm really excited to launch the Knowledge Graph, which will help you discover new information quickly and easily.

The Knowledge Graph enhances Google Search in three main ways to start:

1. Find the right thing
2. Get the best summary

With the Knowledge Graph, Google can better understand your query, so we can summarize relevant content around that topic, including key facts you're likely to need for that particular thing. For example, if you're looking for Marie Curie, you'll see when she was born and died, but you'll also get details on her education and scientific discoveries:

3. Go deeper and broader



Nanchang (南昌市)

City in China

Nanchang is the capital and largest city of Jiangxi Province, People's Republic of China. As of November 2017, the total population in Nanchang City was 5,246,600, while the built-up area made of 6 urban districts plus Nanchang county is home to more than 4,300,000 inhabitants. [Wikipedia](#)

Area: 7,194 km²

Metropolitan area: 4,588 km²

Elevation: 37 m

Weather: 23°C, Wind N at 21 km/h, 30% Humidity

Province: [Jiangxi](#)

Local time: Sunday 1:42 pm

知识图谱中的实体摘要——问题提出

Relin: relatedness and informativeness-based centrality for entity summarization

Authors Gong Cheng, Thanh Tran, Yuzhong Qu

Publication date 2011/10/23

Conference International Semantic Web Conference

Pages 114-129

Publisher Springer, Berlin, Heidelberg

Description Linked Data is developing towards a large, global repository for structured, interlinked descriptions of real-world entities. An emerging problem in many Web applications making use of data like Linked Data is how a lengthy description can be tailored to the task of quickly identifying the underlying entity. As a solution to this novel problem of entity summarization, we propose RELIN, a variant of the random surfer model that leverages the relatedness and informativeness of description elements for ranking. We present an implementation of this conceptual model, which captures the semantics of description elements based on linguistic and information theory concepts. In experiments involving real-world data sets and users, our approach outperforms the baselines, producing summaries that better match handcrafted ones and further, shown to be useful in a concrete task.

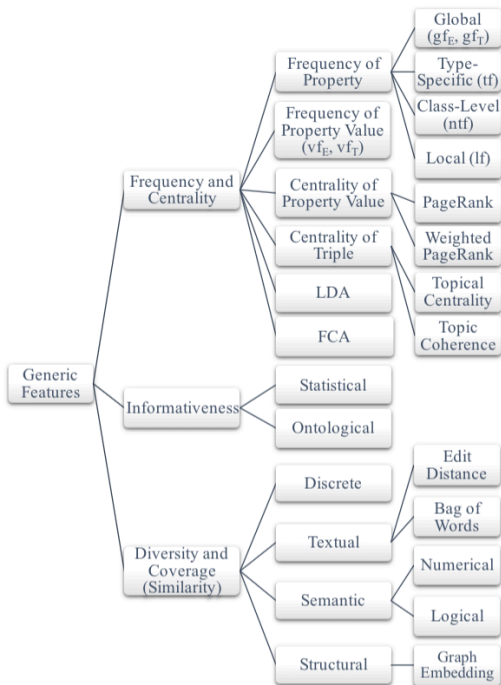
Total citations Cited by 100



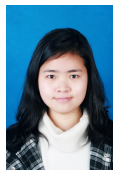
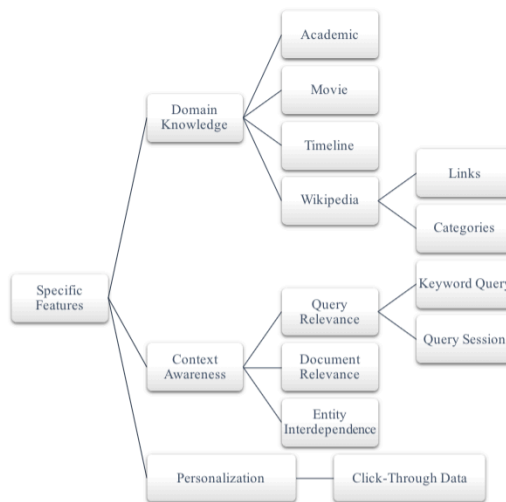
Gong Cheng, Thanh Tran, Yuzhong Qu
**RELIN: Relatedness and Informativeness-Based
Centrality for Entity Summarization**
ISWC 2011

知识图谱中的实体摘要——现状总结

通用技术



专用技术

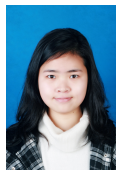


Qingxia Liu, Gong Cheng, Kalpa Gunaratna, Yuzhong Qu
Entity Summarization: State of the Art and Future Challenges
CoRR abs/1910.08252

知识图谱中的实体摘要——现状总结

Table 1. Entity Summarizers (Sorted by Publication Date) and Their Technical Features

| | Generic Features | | | Specific Features |
|---------------------------|--------------------------------|-----------------|--|--|
| | Frequency and Centrality | Informativeness | Diversity and Coverage (Similarity) | Domains, Contexts, and Personalization |
| Falcons [32] | | | bag-of-words | query relevance |
| XRed [33] | | | | entity interdependence |
| Zhang et al. [34] | weighted PageRank | | | click-through data |
| RELIN [18] | weighted PageRank | statistical | | |
| Thalhammer et al. [19] | | statistical | | movie domain |
| Yovisto [35] | tf | | | academic domain, Wikipedia links |
| MMR-QSFS [36] | | | | query relevance |
| DIVERSUM [37] | 1f | | discrete | |
| SUMMARUM [38] | PageRank | | discrete | |
| FACES [21] | vf_T | statistical | bag-of-words | |
| COMB [13] | 1f | statistical | edit-distance-like, numerical, logical | document relevance, entity interdependence |
| TimeMachine [39] | | | | timeline domain |
| C3D+P [15] | 1f | statistical | edit-distance-like, numerical, logical | entity interdependence |
| TRank++ [9] | vf_E | ontological | | document relevance |
| FACES-E [22] | vf_T | statistical | bag-of-words | |
| CD [40] | | statistical | edit-distance-like, numerical, logical | |
| Li et al. [23] | $gf_E, 1f$ | | | movie domain |
| CES [20] | weighted PageRank | statistical | | session relevance |
| LinkSUM [24] | $gf_T, 1f, PageRank$ | | discrete | Wikipedia links |
| Aemoo [41] | tf | | | |
| DynES [42] | $gf_E, gf_T, nt.f, vf_E, vf_T$ | | | query relevance |
| REMES [11] | vf_E | statistical | bag-of-words, structural | entity interdependence |
| Multi-EGS [43] | tf, nt.f, vf_T | | edit-distance-like | Wikipedia categories |
| ES-LDA [44] | LDA | | | Wikipedia categories |
| ES-LDA _{sr} [45] | LDA | | | |
| CTab [16] | gf_E | | bag-of-words, numerical | entity interdependence |
| BAFREC [46] | gf_T, vf_T | ontological | bag-of-words | |
| KAFCA [47] | FCA | | | |
| MPSUM [48] | LDA | | discrete | Wikipedia categories |
| Gottschalk et al. [49] | | | | timeline domain, Wikipedia links |
| VISION-KG [50] | $gf_E, gf_T, nt.f, vf_E, vf_T$ | | structural | query relevance |



Qingxia Liu, Gong Cheng, Kalpa Gunaratna, Yuzhong Qu
Entity Summarization: State of the Art and Future Challenges
 CoRR abs/1910.08252

知识图谱中的实体摘要——现状总结

■ Entity Summarization BenchMark (ESBM)

- <https://w3id.org/esbm/>
- 175个实体, 175*6*2=2100份金标摘要

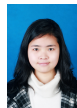
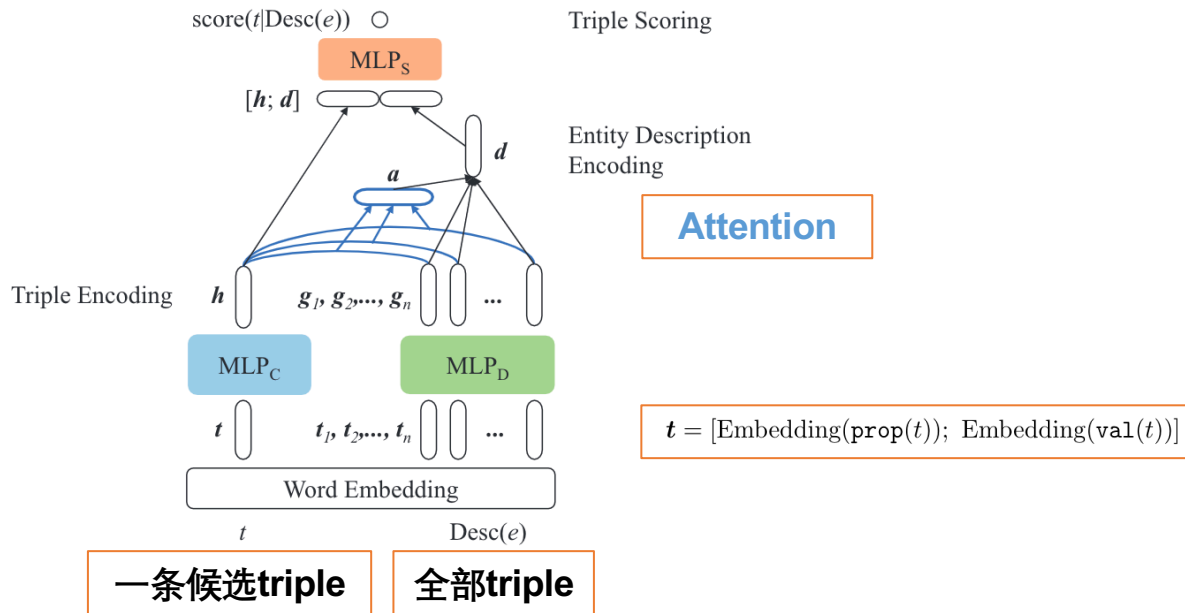
| | DBpedia | | LinkedMDB | |
|----------|-----------------|------------------|-----------------|-----------------|
| | $k = 5$ | $k = 10$ | $k = 5$ | $k = 10$ |
| RELIN | 0.242 -○○▼▼▼▼▼ | 0.455 -▼○○▼○○▼▼ | 0.203 -○○▼○▲▼○▼ | 0.258 -▼○○▼○○▼▼ |
| DIVERSUM | 0.249 ○-○○▼▼▼▼ | 0.507 ▲-▲○○○○○○ | 0.207 ○-○▼○▲▼○▼ | 0.358 ▲-▲○○▲▼○▼ |
| FACES | 0.270 ○○-○○○▼▼ | 0.428 ○▼-▼▼▼▼▼ | 0.169 ○○-▼▼○○▼▼ | 0.263 ○▼-▼▼○○▼▼ |
| FACES-E | 0.280 ▲○○-○○▼▼ | 0.488 ○○▲-○○○○ | 0.313 ▲▲▲-▲▲▼▲○ | 0.393 ▲○▲-▲▲○○ |
| CD | 0.283 ▲▲○○-○▼○○ | 0.513 ▲○▲○-○○○○ | 0.217 ○○▲▼-▲▼○▼ | 0.331 ▲○▲▼-▲▼▼▼ |
| LinkSUM | 0.287 ▲▲○○○-▼○○ | 0.486 ○○▲○○-○○ | 0.140 ▼▼○▼▼-▼▼ | 0.279 ○▼○○▼▼-▼▼ |
| BAFREC | 0.335 ▲▲▲▲▲-○○ | 0.503 ▲○▲○○○-○○ | 0.360 ▲▲▲▲▲-▲▲ | 0.402 ▲▲▲○▲▲-○○ |
| KAFCA | 0.314 ▲▲▲▲○○○-○ | 0.509 ▲○▲○○○○○-○ | 0.244 ○○▲▼○▲▼-○ | 0.397 ▲○▲○▲▲○-○ |
| MPSUM | 0.314 ▲▲▲▲○○○○- | 0.512 ▲○▲○○○○○- | 0.272 ▲▲▲○▲▲▼○- | 0.423 ▲▲▲○▲▲○○- |
| ORACLE | 0.595 | 0.713 | 0.619 | 0.678 |



Qingxia Liu, Gong Cheng, Kalpa Gunaratna, Yuzhong Qu
ESBM: An Entity Summarization BenchMark
ESWC 2020 (Best Resource Paper Nominee)



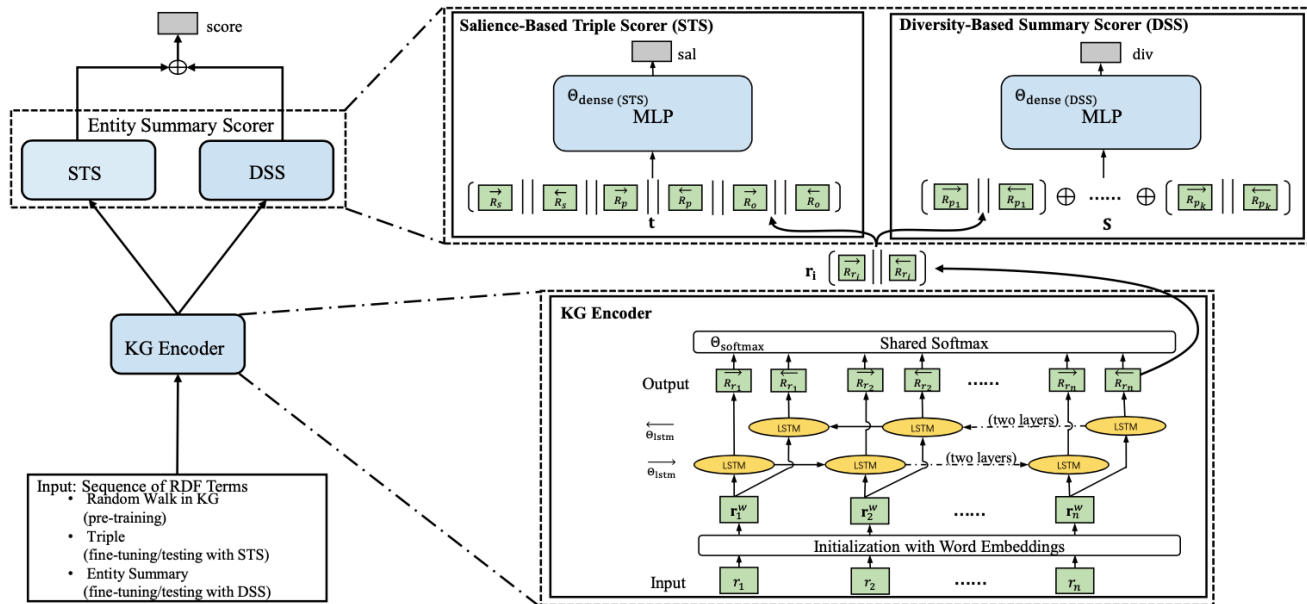
DeepLENS：一种基本的神经网络方法



Qingxia Liu, Gong Cheng, Yuzhong Qu
 DeepLENS: Deep Learning for Entity Summarization
 DL4KG 2020

NEST：基于联合编码和弱监督的神经网络方法

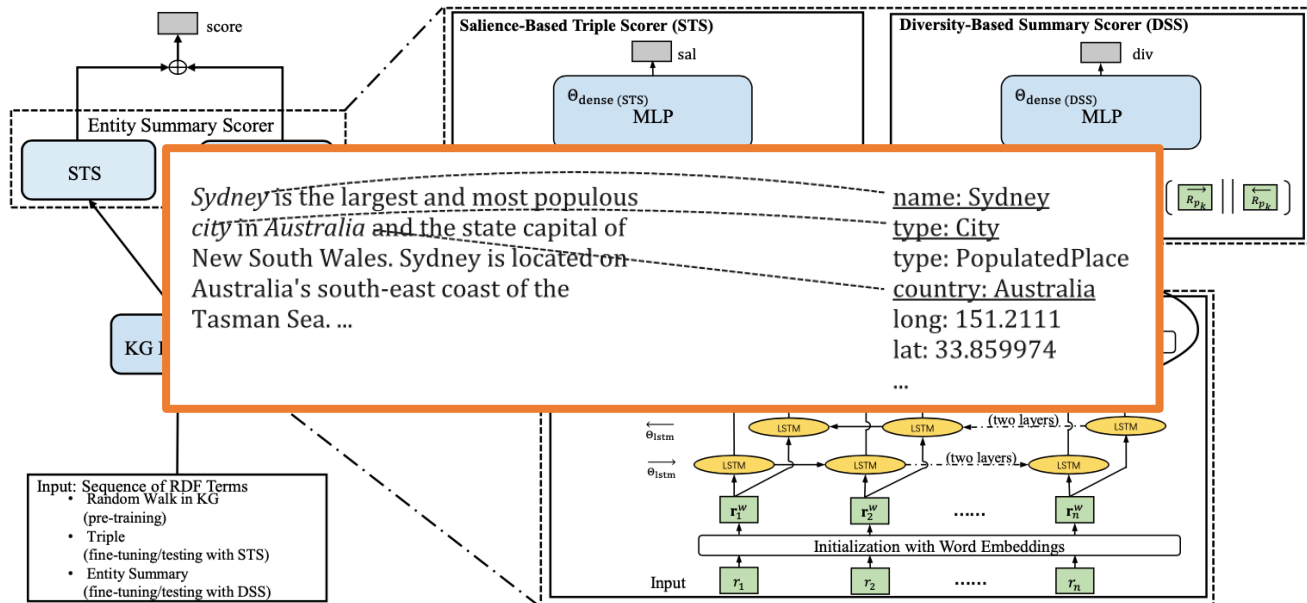
微调：弱监督 (以维基百科文本摘要为金标) 微调：自训练 (以启发式多样性为金标)



Junyou Li, Gong Cheng, Qingxia Liu, Wen Zhang, Evgeny Khramov,
Kalpa Gunaratna, Huajun Chen
Neural Entity Summarization with Joint Encoding and Weak Supervision
IJCAI 2020

NEST : 基于联合编码和弱监督的神经网络方法

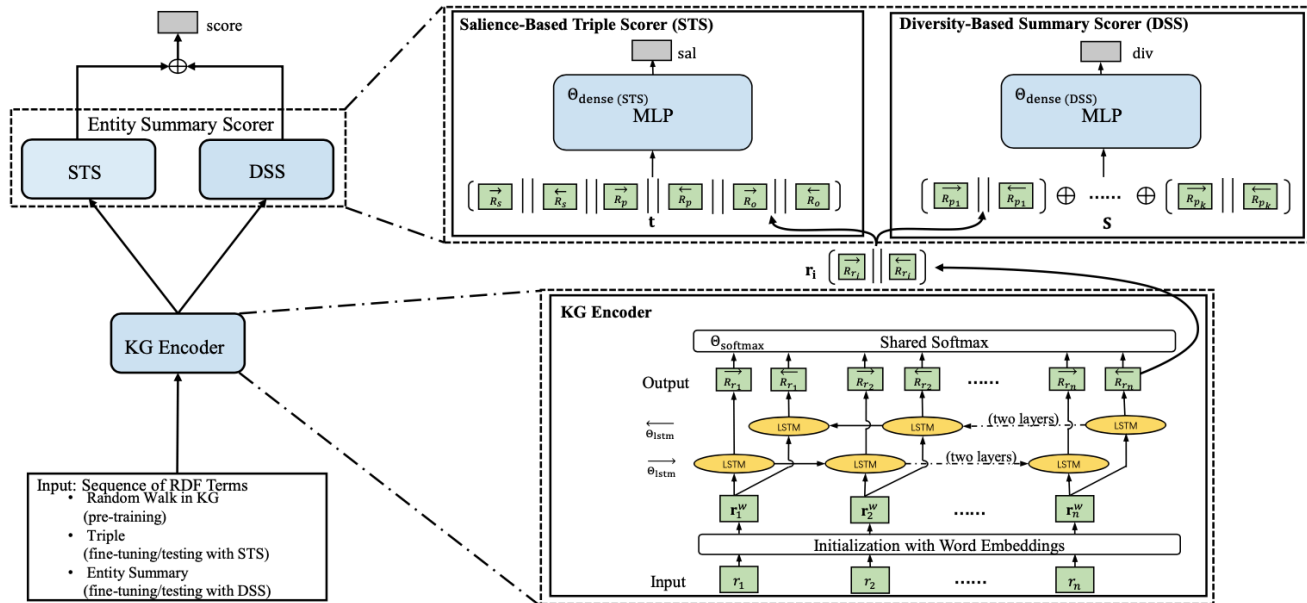
微调：弱监督 (以维基百科文本摘要为金标) 微调：自训练 (以启发式多样性为金标)



Junyou Li, Gong Cheng, Qingxia Liu, Wen Zhang, Evgeny Khramov,
Kalpa Gunaratna, Huajun Chen
Neural Entity Summarization with Joint Encoding and Weak Supervision
IJCAI 2020

NEST：基于联合编码和弱监督的神经网络方法

微调：弱监督 (以维基百科文本摘要为金标) 微调：自训练 (以启发式多样性为金标)



Junyou Li, Gong Cheng, Qingxia Liu, Wen Zhang, Evgeny Khramov, Kalpa Gunaratna, Huajun Chen
Neural Entity Summarization with Joint Encoding and Weak Supervision
 IJCAI 2020

NEST : 基于联合编码和弱监督的神经网络方法

| | ESBM-D | | ESBM-L | | FED | |
|----------|--------------|--------------|--------------|--------------|--------------|--------------|
| | $k = 5$ | $k = 10$ | $k = 5$ | $k = 10$ | $k = 5$ | $k = 10$ |
| RELIN | 0.250 | 0.468 | 0.210 | 0.260 | 0.102 | 0.235 |
| DIVERSUM | 0.260 | 0.522 | 0.222 | 0.365 | 0.112 | 0.266 |
| FACES | 0.272 | 0.439 | 0.160 | 0.259 | 0.145 | 0.273 |
| FACES-E | 0.285 | 0.527 | 0.252 | 0.348 | 0.145 | 0.273 |
| CD | 0.299 | 0.531 | 0.215 | 0.326 | 0.147 | 0.271 |
| LinkSUM | 0.290 | 0.498 | 0.117 | 0.255 | 0.236 | 0.332 |
| NEST | 0.354 ▲▲▲▲▲▲ | 0.540 ▲△○○▲▲ | 0.332 ▲▲▲▲▲▲ | 0.465 ▲▲▲▲▲▲ | 0.272 ▲▲▲▲▲○ | 0.346 ▲▲▲▲▲○ |
| ORACLE | 0.601 | 0.721 | 0.631 | 0.680 | 0.530 | 0.582 |

Table 2: Comparison with existing methods for general-purpose entity summarization (F1). Significant improvements ($p < 0.01$ and $p < 0.05$) achieved by NEST over 6 baselines are indicated by ▲ and △, respectively. Insignificant differences are indicated by ○.



Junyou Li, Gong Cheng, Qingxia Liu, Wen Zhang, Evgeny Kharlamov,
Kalpa Gunaratna, Huajun Chen
Neural Entity Summarization with Joint Encoding and Weak Supervision
IJCAI 2020

DRESSED : 支持用户反馈的神经网络方法

One Summary Does Not Fit All



Nanchang (南昌市)

City in China

Nanchang is the capital and largest city of Jiangxi Province, People's Republic of China. As of November 2017, the total population in Nanchang City was 5,246,600, while the built-up area made of 6 urban districts plus Nanchang county is home to more than 4,300,000 inhabitants. [Wikipedia](#)

Area: 7,194 km²

Metropolitan area: 4,588 km²

Elevation: 37 m

Weather: 23°C, Wind N at 21 km/h, 30% Humidity

Province: [Jiangxi](#)

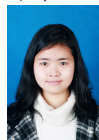
Local time: Sunday 1:42 pm

DRESSED : 支持用户反馈的神经网络方法



- MDP**
- state: $Z_i = \langle S_i, F_i, C_i, f_i \rangle$,
 - action: $A_i = r_i$,
 - policy: $\pi_\theta(t|Z_i) = \frac{\exp(\text{score}(t|Z_i, \theta))}{\sum_{t' \in C_i} \exp(\text{score}(t'|Z_i, \theta))}$,
 - reward: $R_{i+1} = \rho(Z_i, A_i) = \frac{\text{rel}(r_i)}{\log(i+2)}$,
 - transition: $Z_{i+1} = \tau(Z_i, A_i) = \langle S_{i+1}, F_{i+1}, C_{i+1}, f_{i+1} \rangle$,
 - initialization: $Z_0 = \langle S_0, \emptyset, (\text{Desc}(e) \setminus S_0), f_0 \rangle$.

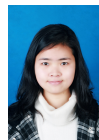
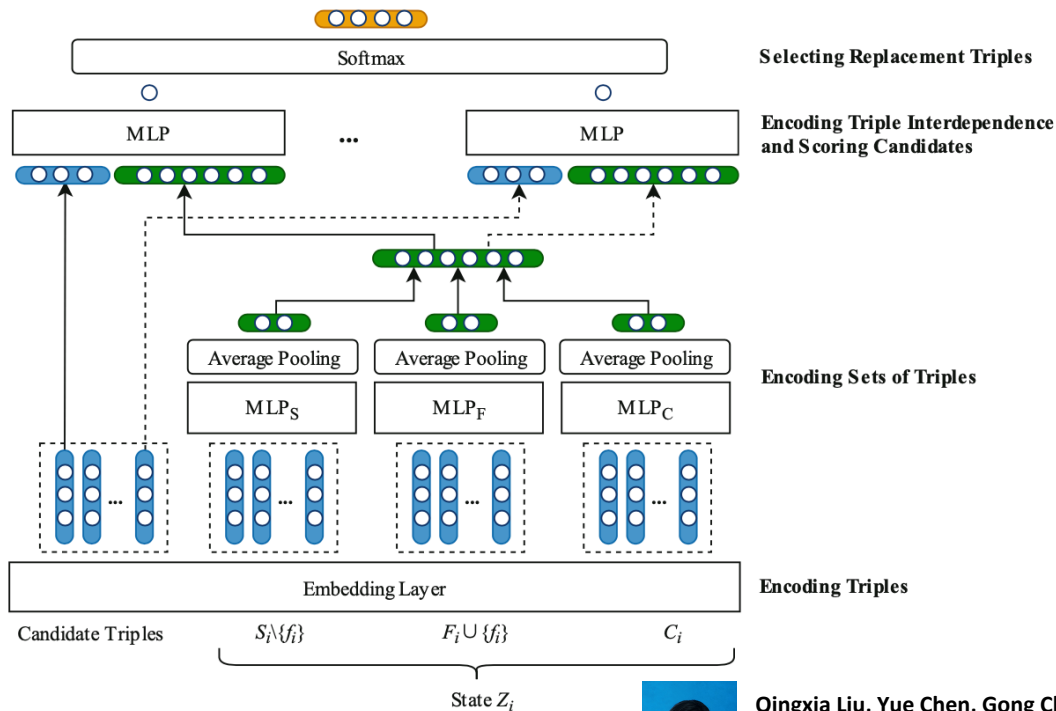
- S_i : 当前摘要
- F_i : 早前删除的全部triple
- C_i : 当前可替入的全部候选triple
- f_i : 当前删除的triple
- r_i : 当前替入的triple



Qingxia Liu, Yue Chen, Gong Cheng, Evgeny Kharlamov, Junyou Li, Yuzhong Qu
Entity Summarization with User Feedback
 ESWC 2020 (Best Research Paper Award)



DRESSED : 支持用户反馈的神经网络方法



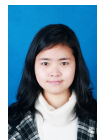
Qingxia Liu, Yue Chen, Gong Cheng, Evgeny Kharlamov,
Junyou Li, Yuzhong Qu
Entity Summarization with User Feedback
ESWC 2020 (Best Research Paper Award)



DRESSED : 支持用户反馈的神经网络方法

Table 2. Overall results of offline evaluation (mean \pm standard deviation). For each method, significant improvements and losses over other methods are indicated by \blacktriangle ($p < 0.01$) or \triangle ($p < 0.05$), and by \blacktriangledown ($p < 0.01$) or \triangledown ($p < 0.05$), respectively. Insignificant differences are indicated by \circ .

| | ESBM-D | | ESBM-L | | FED | |
|---------|--|--|--|--|--|--|
| | NDCF@I | NDCG@I | NDCF@I | NDCG@I | NDCF@I | NDCG@I |
| FACES-E | .435 \pm .022 $\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown$ | .620 \pm .017 $\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown$ | .373 \pm .028 $\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown$ | .585 \pm .027 $\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown$ | .263 \pm .067 $\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown$ | .573 \pm .063 $\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown$ |
| IPS | .405 \pm .026 $\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown$ | .553 \pm .023 $\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown$ | .278 \pm .030 $\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown$ | .410 \pm .042 $\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown$ | .212 \pm .027 $\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown$ | .497 \pm .009 $\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown$ |
| NRF | .407 \pm .021 $\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown$ | .554 \pm .016 $\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown$ | .325 \pm .029 $\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown$ | .503 \pm .034 $\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown$ | .218 \pm .033 $\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown$ | .510 \pm .019 $\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown\blacktriangledown$ |
| PDGD-L | .445 \pm .037 $\blacktriangle\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown$ | .632 \pm .029 $\blacktriangle\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown$ | .446 \pm .027 $\blacktriangle\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown$ | .699 \pm .030 $\blacktriangle\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown$ | .300 \pm .031 $\blacktriangle\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown$ | .628 \pm .025 $\blacktriangle\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown$ |
| PDGD-N | .447 \pm .037 $\blacktriangle\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown$ | .636 \pm .030 $\blacktriangle\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown$ | .446 \pm .025 $\blacktriangle\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown$ | .698 \pm .034 $\blacktriangle\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown$ | .303 \pm .033 $\blacktriangle\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown$ | .630 \pm .030 $\blacktriangle\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown$ |
| DRESSED | .455 \pm .032 $\blacktriangle\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown$ | .645 \pm .028 $\blacktriangle\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown$ | .481 \pm .030 $\blacktriangle\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown$ | .760 \pm .029 $\blacktriangle\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown$ | .316 \pm .038 $\blacktriangle\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown$ | .644 \pm .042 $\blacktriangle\blacktriangle\blacktriangle\blacktriangledown\blacktriangledown\blacktriangledown$ |



Qingxia Liu, Yue Chen, Gong Cheng, Evgeny Kharlamov,
Junyou Li, Yuzhong Qu
Entity Summarization with User Feedback
ESWC 2020 (Best Research Paper Award)



知识图谱中的实体摘要——未来探讨

- 知识图谱的语义
 - 文本语义、结构语义
 - 本体/逻辑语义
 -
- 非通用型实体摘要
 - 针对具体任务
 - 面向具体用户
 - 依赖具体上下文
 -
- 非抽取式实体摘要
 - 生成式
 - 聚合式
 -
- 从一到多
 - 多实体
 - 多图谱
 -



Nanchang (南昌市)

City in China

Nanchang is the capital and largest city of Jiangxi Province, People's Republic of China. As of November 2017, the total population in Nanchang City was 5,246,600, while the built-up area made of 6 urban districts plus Nanchang county is home to more than 4,300,000 inhabitants. [Wikipedia](#)

Area: 7,194 km²

Metropolitan area: 4,588 km²

Elevation: 37 m

Weather: 23°C, Wind N at 21 km/h, 30% Humidity

Province: [Jiangxi](#)

Local time: Sunday 1:42 pm

