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Analyzing online job portal data for the ICT sector in Bangladesh: what can we infer?

Prof. M. Sohel Rahman CSE, BUET, Bangladesh Fellow, Bangladesh Academy of Sciences





REGIONAL HIGHER EDUCATION FORUM
Higher Education of the Future:
Leading Digital and Green Transformations through Collaboration
10–12 May 2023, Bangkok, Thailand







4.5K Software Firm



Average ICT Sector Growth is 40%+ from 2015 -2020



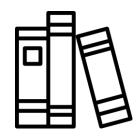
300K+ ICT Professionals



HEIs don't necessarily update curriculum regularly



10K+ IT Graduates



Develop ways to assess Nation-wide ICT Demand and Update Curricula



N1

2 Identified Needs: N1 and N2





develop a methodology to assess nation-wide ICT skills demand



Incorporate and leverage that assessment in the curricula update mechanism of the HEIs



The overarching goal is to cater for the ICT industry in Bangladesh.



### Research Questions



Can we analyze and infer the job demands?

(What job titles are in the highest demand?)



Can we identify the changing trends in terms of demand and supply of a particular job position?



Can the primary skills sought in the ICT sector be identified through an appropriate analysis? How the answers of these question affect the CSE curricula?





- Data from BDjobs.com
- job postings from January 1, 2016 to December 15, 2021
- 31,526 posts in total







The largest job-matching site in Bangladesh



2.5 million registered jobseekers



25 thousand registered firms



200,000 visitors per day



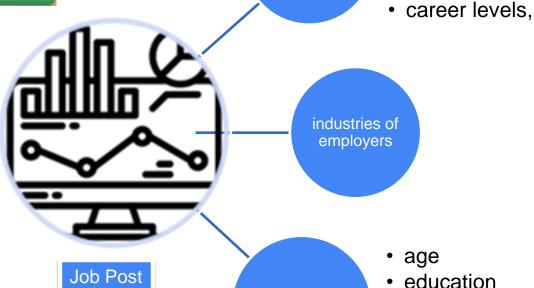
40 million page views per month



- Data from BDjobs.com
- job postings from January 1, 2016 to December 15, 2021
- 31,526 post in total

Dataset





Titles

sex

years of experience.

job

requirements

descriptions

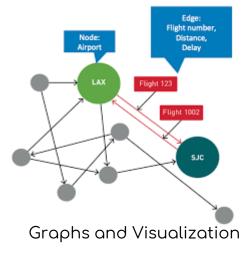
locations,

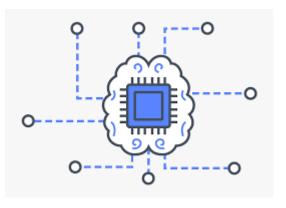
responsibilities



## Methodology







NLP Based Analysis



### Methodology



Job Description



Tokenize & Train Unigram, Bigram & Trigram Model



Find the most common Unigram, Bigram & Trigram





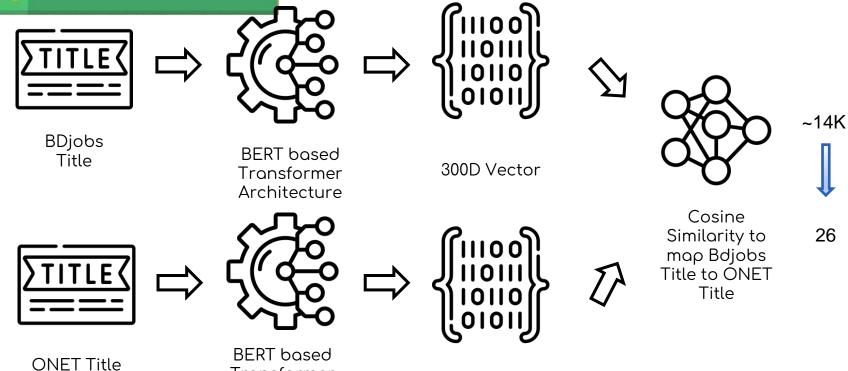
Manually Inspect for IT Skills



Further Correlational Analysis

## HOW

## Methodology

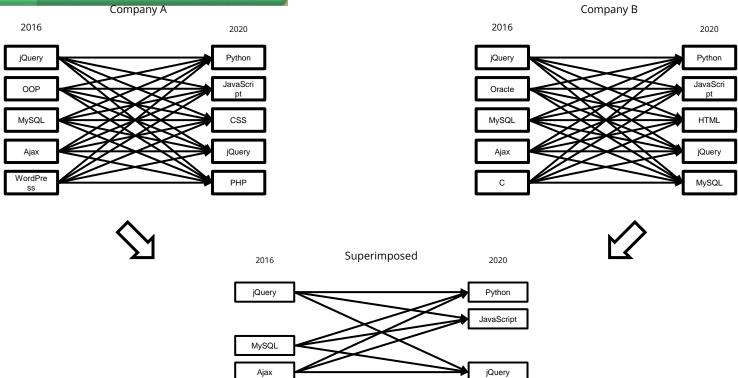


Transformer Architecture

300D Vector

## HOW

## Methodology



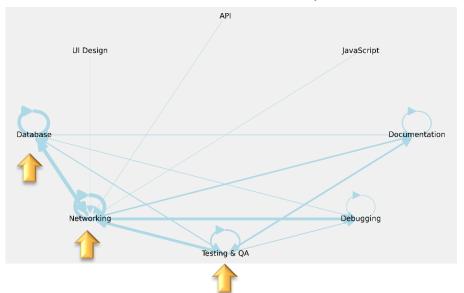
```
Web Developers
Data Warehousing Specialists Computer Systems Analysts
Network and Computer Systems Administrators
Database Architects
                     Database Administrators
              Search Marketing Strategists
           Computer Network Architects
Web and Digital Interface Designers
           Video Game Designers
    Computer Occupations, All Other
                Document Management Specialists
Software Quality Assurance Analysts and Testers
 Computer User Support Specialists
Project Management Specialists
      Computer Network Support Specialists
         Information Security Analysts
       Software Developers
  Business Intelligence Analysts
Computer Systems Engineers/Architects
Telecommunications Engineering Specialists
```

Word cloud of the frequency of O\*NET job titles in data

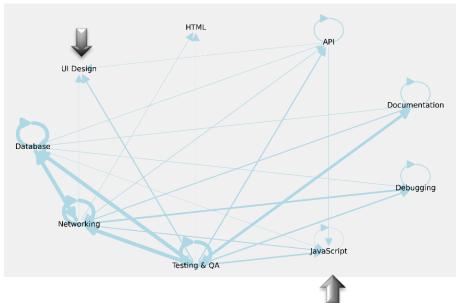


Word cloud of computer skills extracted from different job posts

2016-19 Skills shift Graph

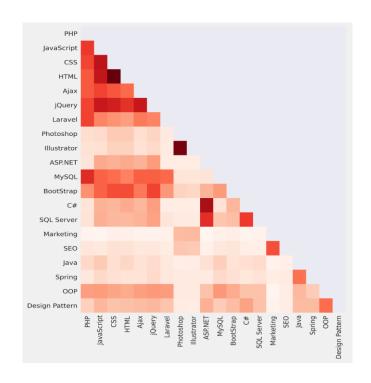


#### 2019-21 Skills shift Graph

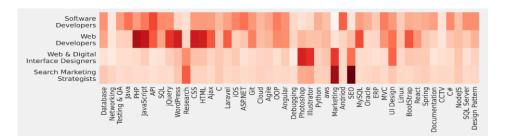


2016 -> 2019: moving towards Networking, Database and Testing & QA related services.

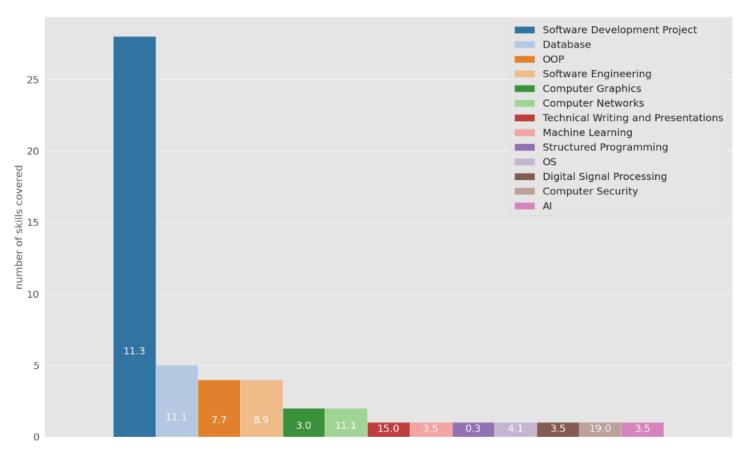
2019 -> 2021: more focus on JavaScript and UI Design with Networking, Testing and Database.



Correlation heatmap between ICT skills



Correlation heatmap between skills and job titles



#### Main Conclusions



While the high demand for Software Developers remained constant throughout the study period, an interesting trend is observed through the steady (and perhaps somewhat surprising) increase in the demand for Computer Systems Engineers/Architects.



Our analysis suggests that there are jobs with an apparent low demand that are receiving a lot of interest from the job seekers. One such striking example is the Network and Computer Systems Administrator (NCSA) post.



By collaborating with Bdjobs.com, it is recommended that BUET and other leading HEIs in Bangladesh regularly monitor the fast-changing IT industry skills demand through data analysis of online job postings to fine tune, revise and perhaps create new courses/programs, curricula and syllabi.

# Remarks on the discord between Industry and Academia



- life long
- Independent
- New tech.
- Emerging tech

learning



Adaptability



 On one's own



### Acknowledgement



Article

## An Exploratory Study of Online Job Portal Data of the ICT Sector in Bangladesh: Analysis, Recommendations and Preliminary Implications for ICT Curriculum Reform

Sheikh Saifur Rahman Jony <sup>1</sup>, Tsuyoshi Kano <sup>2</sup>, Ryotaro Hayashi <sup>3,\*</sup>, Norihiko Matsuda <sup>4</sup> and M. Sohel Rahman <sup>1,\*</sup>



**ASIAN DEVELOPMENT BANK** 

## Looking Beyond:

Three characteristics of Tertiary Learning in 2040

## Micromasters and nano degrees

Ubiquitous individualized learning

(international) (virtual) learning groups Will traditional University programs be replaced (by online/offline shorter programs)?



XYZ bagged a job of a school teacher for Bengali subject when Tagore gave a certificate: "My XYZ knows Bengali well"













