Awesomeness with job ads

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Your abstract in English. Try to keep the abstract short; approximately 100 words should be enough. The abstract explains your research topic, the methods you have used, and the results you obtained. Your abstract in English. Try to keep the abstract short; approximately 100 words should be enough. The abstract explains your research topic, the methods you have used, and the results you obtained. Your abstract in English. Try to keep the abstract short; approximately 100 words should be enough. The abstract explains your research topic, the methods you have used, and the results you obtained. Your abstract in English. Try to keep the abstract short; approximately 100 words should be enough. The abstract explains your research topic, the methods you have used, and the results you obtained.

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Preface

I want to thank bla bla bla

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Symbols and abbreviations

Symbols

B magnetic flux density

c speed of light in vacuum $\approx 3 \times 10^8$ [m/s]

 $\omega_{\rm D}$ Debye frequency

 ω_{latt} average phonon frequency of lattice

↑ electron spin direction up↓ electron spin direction down

Operators

 $\nabla \times \mathbf{A}$ curl of vectorin \mathbf{A}

 $\frac{\mathrm{d}}{\mathrm{d}t}$ derivative with respect to variable t

 ∂

 $\frac{\partial}{\partial t}$ partial derivative with respect to variable t

 \sum_{i} sum over index i

 $\mathbf{A} \cdot \mathbf{B}$ dot product of vectors \mathbf{A} and \mathbf{B}

Abbreviations

AC alternating current

APLAC an object-oriented analog circuit simulator and design tool

(originally Analysis Program for Linear Active Circuits)

BCS Bardeen-Cooper-Schrieffer

DC direct current

TEM transverse eletromagnetic

1 Background / Context

1.1 Research objectives

main objective interim objectives

- 1.2 Related work
- 1.2.1 Feature extraction from Text
- 1.2.2 Text classification

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