



Offline Handwritten Amharic Word Recognition using Deep Learning

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- **Amharic alphabets, known as *Fidel* is a syllable writing system for the language [1].**
 - 34 base characters among which 7 are derived e.g. ከ from አ.
 - There are 238 core characters and 27 labialized forms.
- **HTR is transcription of handwritten text contained in scanned image(s) into digital text: ASCII or Unicode.**
 - For medical and magical texts originated from the too past.
 - For searching in a text, postal distribution of letters, payment of checks, form extraction, or machine translations, etc.



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Challenges in handwritten Amharic word recognition

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- Different ways of writing the same word.
 - E.g. አንበሳ, አምበሳ
- Formation of compound words by joining words with or without modification.
 - E.g. አገ-መንግሥት or አገመንግሥት, የአርበታት or የአር ብታ
 - People use hyphenation or space to write compound words.
- Amharic character repetition where more than one symbol is used for the same sound.
 - Sets of characters of the same sound such as: {ሀ,ኩ,ኪ,ካ}, {ወ,ኩ}, {ኅ,ኦ}, {ጋ,ኧ}
 - People use such characters for semantically similar words interchangeably.



Introduction

Motivations

- Historical documents and manuscripts are common in countries such as Ethiopia.

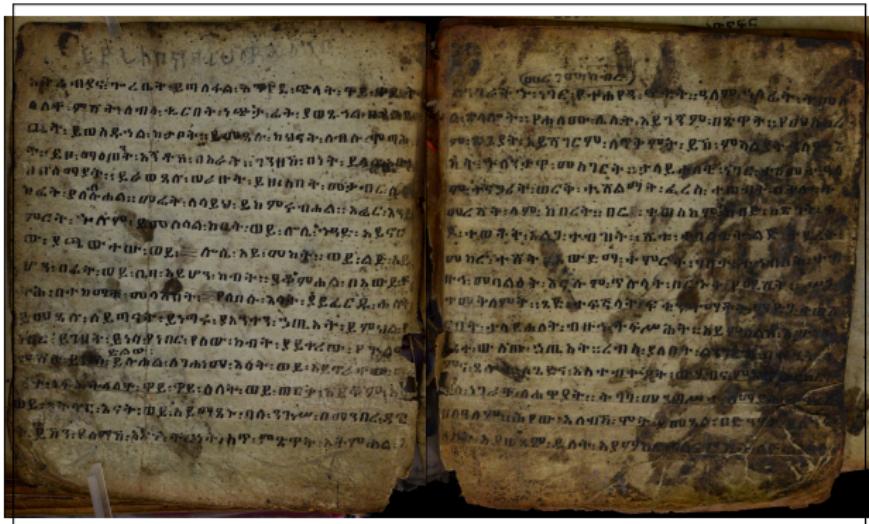


Figure 1: An old Brana poem in Amharic entitled Märgämä kēbr, *Condemnation of glory* (hence MärKL) [2].



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Problem - Statement

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■ Offline handwritten Amharic text transcription is still a research issue.

- Calligraphy and nature of handwriting differs personally in the writers.
- Amharic text is morphologically complex.

Solution

Deep learning and CTC algorithm used for transcribing handwritten documents in to digital forms with greater performance become possible.



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Objectives of the Study

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- **Main objective:** to develop offline handwritten Amharic word recognition algorithm using deep learning approaches.
- **Specific objectives:**
 - To develop the dataset of handwritten Amharic words for the language.
 - To optimize hyper-parameters' setting that works well for *AWR* model by using *Bayesian* hyper-tuning.
 - To evaluate and measure performance of *AWR* algorithm with and without augmentation, and apply *10-fold* cross validation.
 - To compare the result with pre-designed architectures such as: *VGG*, *ResNet*, *DenseNet* and *EfficientNet*.

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- **High performance in the transcription of handwritten Amharic words.**

- **Thesis contributions are:**

- Prepared handwritten Amharic word dataset, called *HAW-DB*.
- Hyper-tuned and well-performing model on the dataset.
- Less biased validation.
- Application of pre-designed CNN architectures in place.

- **Potential applications are:** preserving historical heritages, old documents, medicinal or magical books and manuscripts

- Also, bank check processing, or used to read students and lectures handwritten notes in to digital format, etc.



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- Only offline scenario is considered and recognizes handwritten Amharic words after trained.
- The system do not handle any misspellings made in the source or by classifications in the system itself.



Literature

Pilares da abordagem SDN

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Quatro pilares definem uma rede SDN, :

- Separação dos planos de controle e dados. Dispositivos de rede -> encaminhadores.
- Decisões de encaminhamento são baseadas em fluxo, ao invés de destino.
- Lógica de controle -> controlador externo.
- Rede é programável através de aplicações de *software*.



Literature

Comparação redes convencionais *versus* SDN

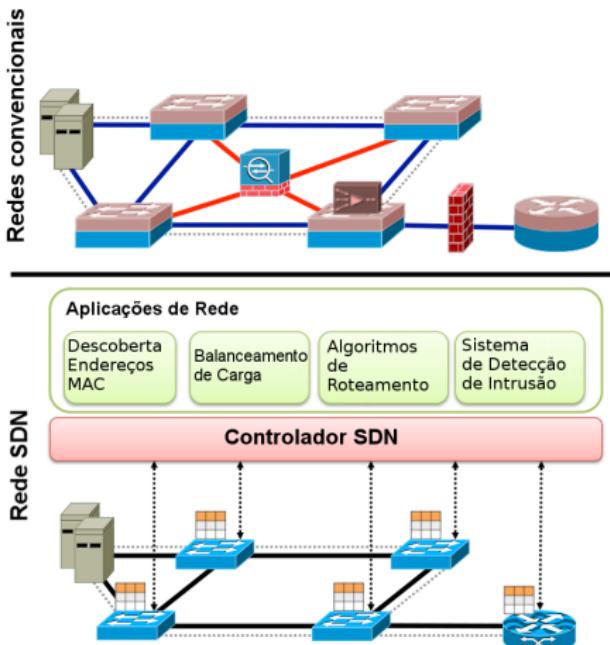


Figure 2: Redes convencionais *versus* SDN, adaptado de .



Methodology

Bayesian optimization

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- Crescimento exponencial de equipamentos e aplicações.
- Complexidade de configuração.
- Provisionamento de QoS nas redes convencionais:
 - Alocação fixa de recursos rede.
 - Configurações manuais.



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- Parâmetros de desempenho da rede só são restaurados após a degradação da QoE.
- Prestação e entrega de serviços independentemente do grau de criticidade do usuário/serviço.
- Necessita-se uma arquitetura de rede flexível.
- Adaptar-se a diferentes demandas.
- Ação pro-ativa no gerenciamento dos recursos.



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- *OpenFlow*, não é suficiente para provimento de QoS em redes SDN.
 - *OpenFlow Management and Configuration Protocol* (OF-CONFIG)
 - *Open vSwitch Database (OVSDB) Management Protocol*



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■ Composição do ambiente:

- Banco de Dados – *Knowledge Base*.
- Controlador e módulos SDN.
- Emulador de rede e *switch OpenFlow*.

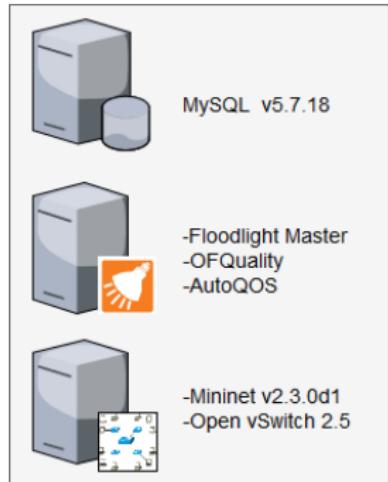


Figure 3: Composição do ambiente experimental.

Amb. Experimental - Emulador e switch

Emulador de rede

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■ Emulador Mininet:

- Documentação e comunidade (baixo custo).
- Virtualização a nível de processo.
- Implementar *scripts*.
 - Criação de topologias de rede.
 - Inicialização de gravadores de *log*.
 - Testes de vazão (*Iperf*).
 - ..entre outros..

■ Switch Open vSwitch:

- Impl. *software* (aberto) de um *switch* multi camadas virtual.
- Documentação e comunidade (baixo custo).
 - OVSDB
 - OVSDB *Management Protocol*
 - interfaces, portas, filas, VLANs, políticas QoS
 - ..entre outros..

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- Proposta de uma arquitetura para gerenciamento autônomo, para prover QoS de maneira pró-ativa em ambientes de redes definidas por software (SDN).
- Validação da arquitetura através de duas contribuições importantes: a aplicação *AutoQoS* e o módulo *OFQuality*.
- Gerenciamento automatizado de banda dos fluxos, prioridade e mudança de caminhos de rede quando os *links* estavam congestionados ou com problemas de latência.
- Otimização do uso de recursos.

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- Compilação de um trabalho exclusivo sobre o módulo *OFQuality*.
- Comparar e avaliar o uso de outra API *Southbound* para gerenciamento de configurações de QoS no plano de dados (ex. OF-CONFIG).
- Propor um modelo de abstração (ponto de vista do controlador) do gerenciamento dos recursos no plano de dados.



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- A ampliação do escopo das métricas de QoS para além do que foi usado neste trab. (ex. *jitter*).
- Comparar e avaliar métodos diferentes (ex. DSCP, *meter table*), de implementação de QoS em SDN e seus resultados.
- A análise e consideração de CPU e memoria (no *switch*) para auxiliar na tomada de decisão de mudanças de rotas.



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- Experimentos em um ambiente não virtual, utilizando *switches* de hardware.
- Idealizar uma estratégia de detecção automática da camada de aplicação dos fluxos, para posterior configuração de QoS.
- Disponibilização de código *OFQuality* e *AutoQoS*.



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