

# Unsupervised Models of Synchronous Grammar Induction for SMT

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# Statistical machine translation

## Arabic → English

بغداد 1-1 ( افب ) - ذكرت وكالة الانباء العراقية الرسمية ان نائب رئيس  
مجلس قيادة الثورة في العراق عزة ابراهيم استقبل اليوم الاربعاء في بغداد  
رئيس مجلس ادارة المركز السعودي ل- تطوير الصادرات عبد الرحمن الزامل .



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- Statistical machine translation: Learn how to translate from parallel corpora.

# Statistical machine translation: successes

## Arabic → English

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Baghdad 1-1 (AFP) - official Iraqi news agency reported that vice-chairman of the revolution command council Izzat Ibrahim received in Iraq on Wednesday in Baghdad, board chairman of the Saudi center for developing exports Abdel Rahman Al-Zamil.

- Statistical machine translation: Learn how to translate from parallel corpora

# Statistical machine translation: limitations

Chinese → English

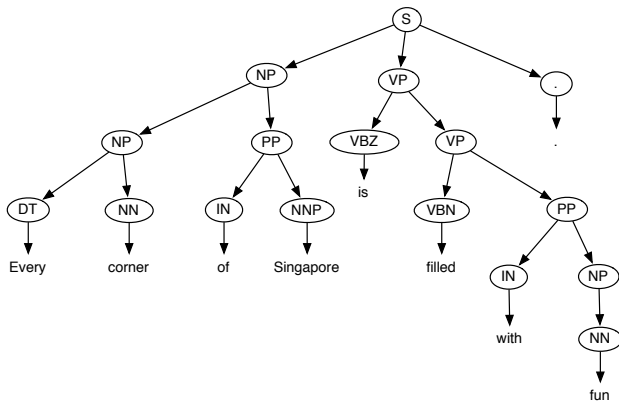
加拿大与欧盟和澳洲一样 都在十一月二十八日关闭它们的大使馆,并在本周稍早重新开放。



Canada and the EU and Australia have closed on 28 November at the same as the Chinese embassy in their earlier this week, and re-opening up.

- But sometimes this doesn't work so well ...

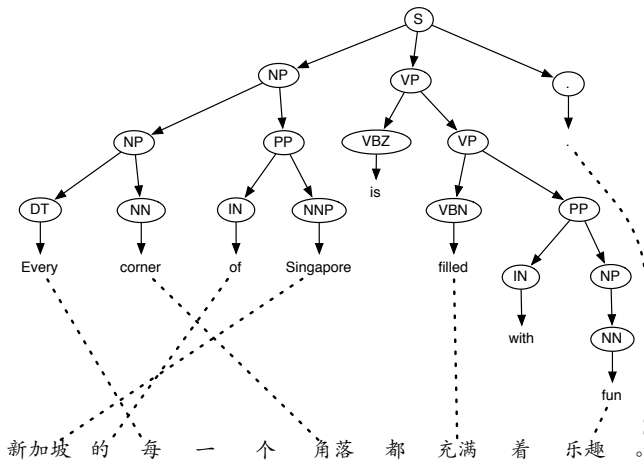
# Inducing a STSG given an observed tree:



新加坡 的 每 一 个 角 落 都 充 满 着 乐 趣 。

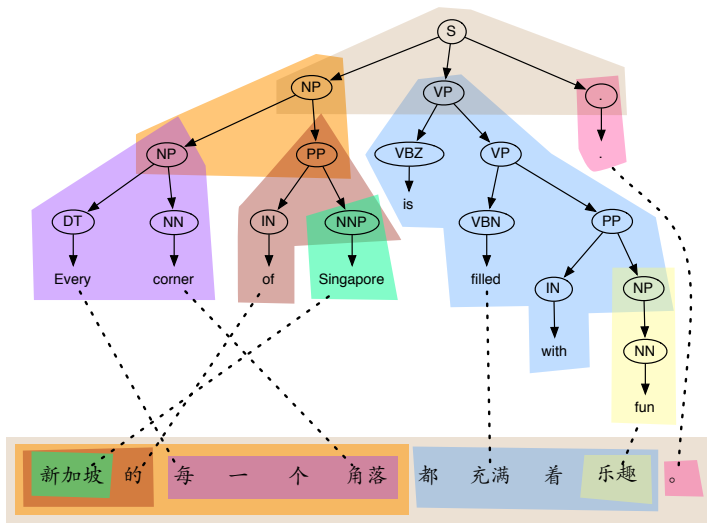
Training instance

## Existing approach (Galley et al. 2004):



Step 1: word alignment

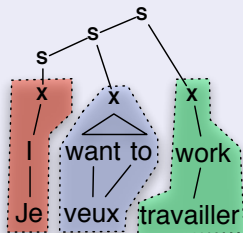
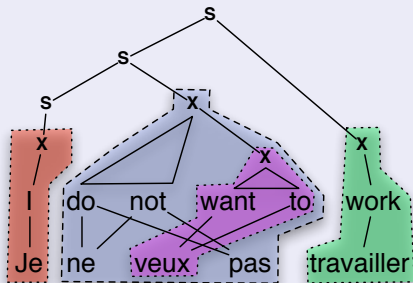
## Existing approach (Galley et al. 2004):



Step 2: rule extraction heuristic

# Models of translation

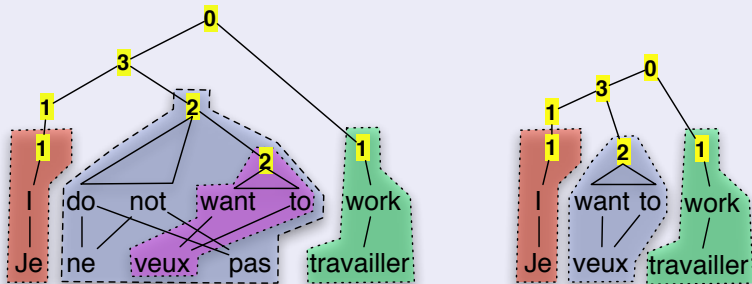
## Hierarchical





# Models of translation

## Hierarchical



- AIM: Implement a large scale open-source synchronous constituent labelling system.
- AIM: Investigate and understand the relationship between synchronous constituency and SMT performance.

# Constituency and context



There has been significant research into monolingual grammar induction:

- Alexander Clark. Unsupervised induction of stochastic context-free grammars using distributional clustering, 2001
- Dan Klein and Chris Manning. A Generative Constituent-Context Model for Improved Grammar Induction, 2002

Constituent context is a prime indicator of constituency.

# Constituency and context



- Apply large scale clustering and topic modelling algorithms,
- identify sets of frequent contexts that distinguish synchronous constituent properties.
- Motivated by successful models of monolingual grammar induction,
- deep connections to unsupervised word sense disambiguation, thesaurus extraction etc.

# The team

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Alex Clark

Trevor Cohn

Chris Dyer

Adam Lopez

A unique opportunity to bring together researchers operating at the coal face of SMT development with leading theoreticians in the field of formal grammar induction.