

# Extracting granular information on habitats and reproductive conditions of Dipterocarps through pattern-based literature analysis

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# What are Dipterocarps?

- *Dipterocarpaceae*
- medium to large forest trees, skeletal backbone of lowland tropical forests
- ~65 species in 6 genera in the Philippines, more than 65% are endemic
- economically and ecologically important, e.g., timber value
  - exploited and affected by decline in forest cover:



## **Challenge:** Reproduction of Dipterocarps

1. Long-term (temporal)
2. Broad-scale (geographical)

Photo by: Edwino S. Fernando. 07 December 2006.

# Aims and Objectives

- **Aim:** To develop literature mining methods to automatically extract information relevant to the distribution and reproductive cycle of dipterocarps
  - in order to help predict the likelihood of their regeneration, and
  - subsequently make informed decisions regarding species for reforestation.

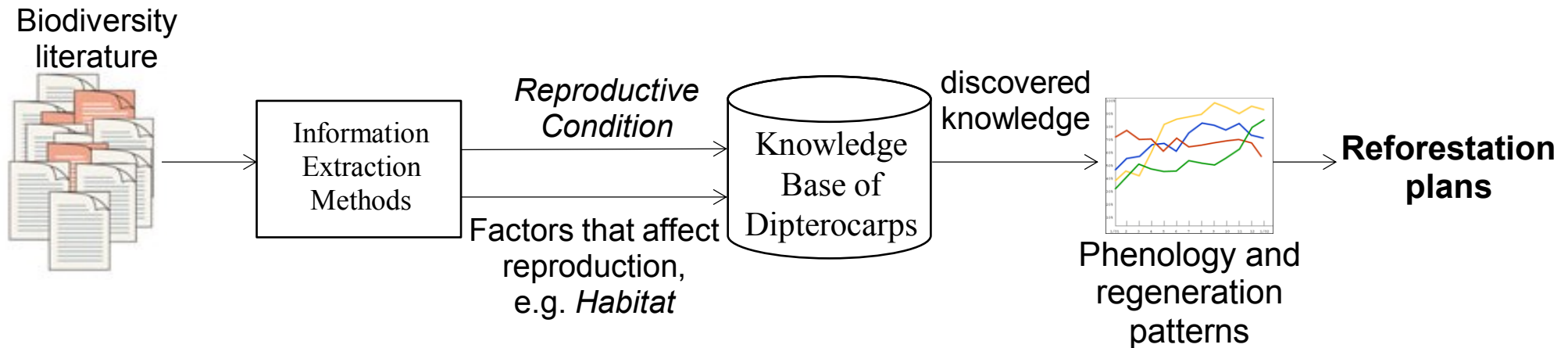


Figure 1. An overview of the research aims and objectives.

# DipteroMine Corpus



**155** abstract length documents from:

- Journal of Tropical Ecology
- Journal of Ecology
- Journal of Biosciences
- Forest Ecology and Management

	Concept	Description	Example
1	Habitat	Environments in which organisms live.	In the [lowland mixed dipterocarp forests] of Borneo the Dipterocarpaceae can comprise roughly 107 of species ...
2	Geographical Location	Any identifiable point or area in the planet. (countries, major bodies of water, named landforms, etc).	The main observation site was conserved forest at [Dongmakhai] ( [18deg20 ' 03 " N , 102deg30 ' 5 " E] , 190 m a.s.l. )
3	Reproductive Condition	Indicators of the specimens' reproductive condition.	There were two [flowerings] in March to May , and one in August during this period .
4	Temporal Expression	Spans of text pertaining to points in time.	Most fruit fall occurred from the [end of July] to [mid-August].

# DipteroMine Corpus

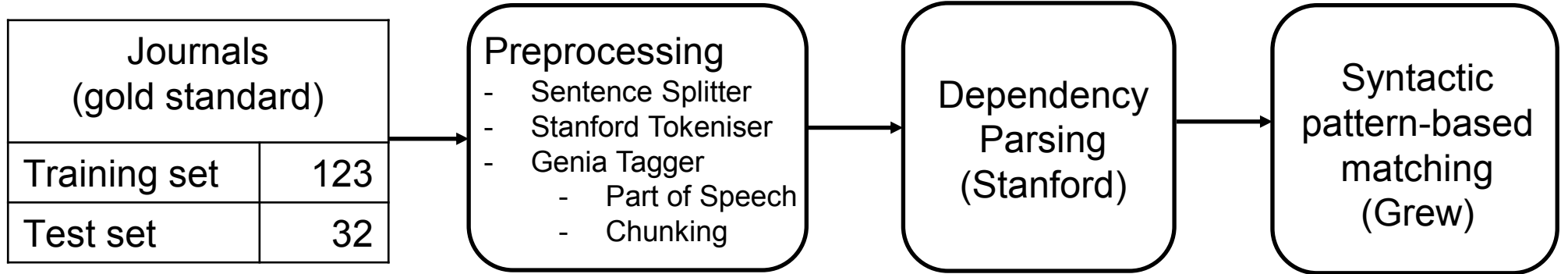


Double annotation: 79  
Single annotation: 76

## Inter-Annotator Agreement

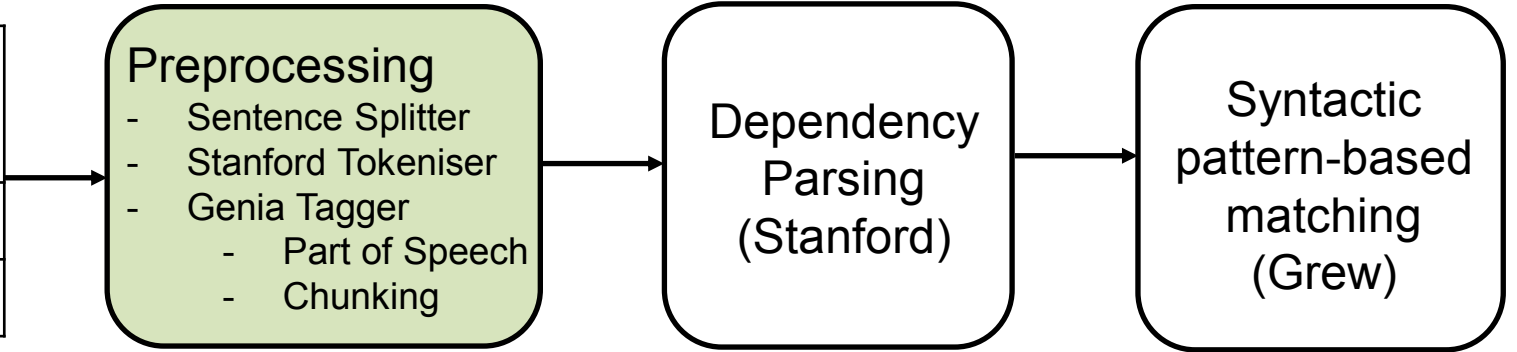
	size	F score
Geographical Location	711	92%
Habitat	475	75%
Temporal Expression	787	91%
Reproductive Condition	539	64%

# Methodology

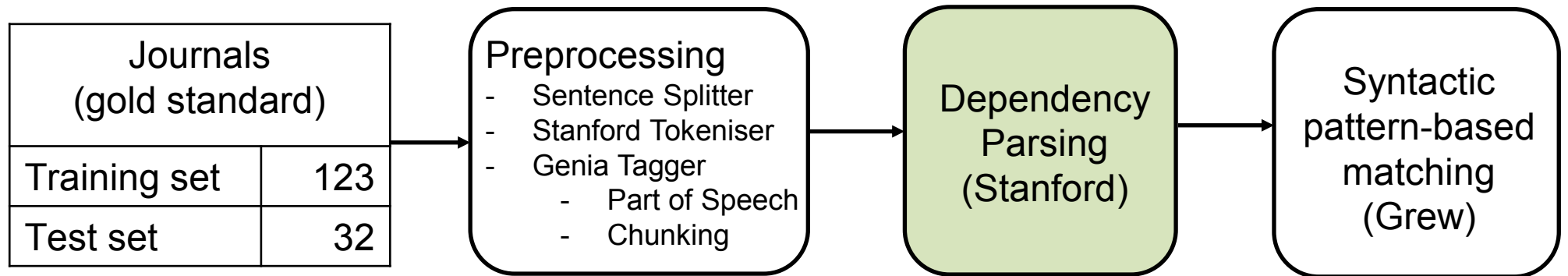


# Methodology

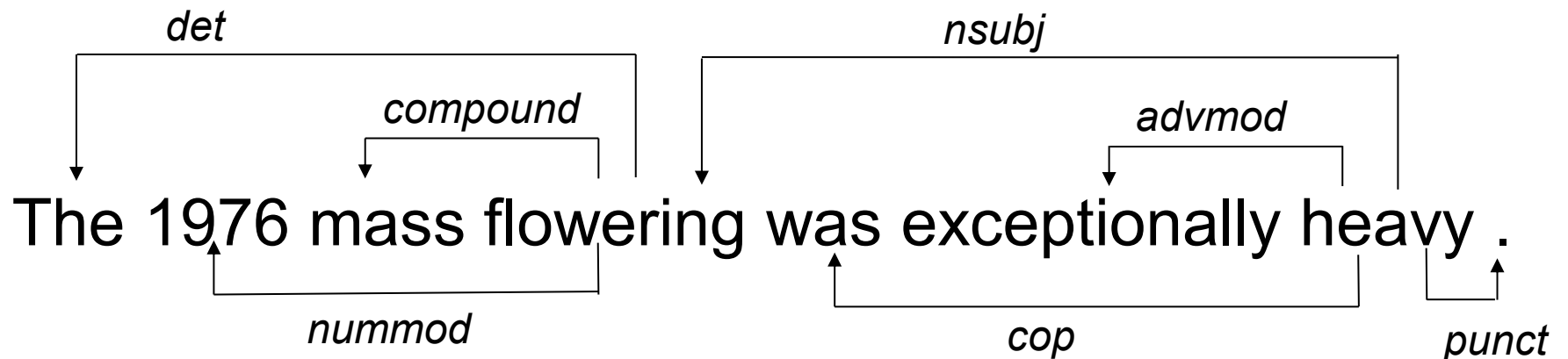
Journals (gold standard)	
Training set	123
Test set	32



# Methodology



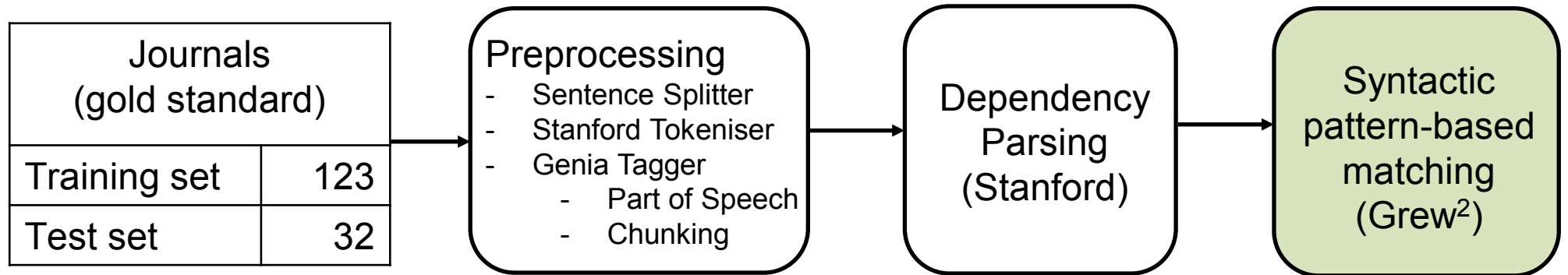
**Stanford dependencies**<sup>1</sup> provides a representation of grammatical relations between words in a sentence.



1. <https://nlp.stanford.edu/software/stanford-dependencies.shtml>



# Methodology



## Grew

- is a Graph Rewriting tool dedicated to applications in Natural Language Processing (NLP).
- lets the user search for a given pattern in a corpus of syntactic structures.

# Syntactic Pattern-Based Matching

1. Direct relationship between entities.

Reproductive Condition → Temporal Expression

Generally , large individuals in these populations fruited in 1986 .



The diagram shows a relationship between the word 'fruited' and the year '1986'. A line connects the top of 'fruited' to the top of '1986', with an arrow pointing down to '1986'. The label 'nmod' is positioned above the line.

# Syntactic Pattern-Based Matching

## Habitat → Geographical Location

The study site was a

*nmod*

primary lowland mixed dipterocarp forest in Lambir Hills National Park ,

Sarawak , Malaysia ( 4deg20 ' N , 113deg 50 ' E , 60 m a.s.l. ) .

## Geographical Location → Habitat

Bukit Sai ( Compart - ment 8b ) was the primary forest ,

*dep*

Lesong ( compartment 129 ) the logged forest ,

*dep*

Forest Research Institute Malaysia ( FRIM ; field 25 , 9/11 and 10v ) the artificial forest ,

*dep*

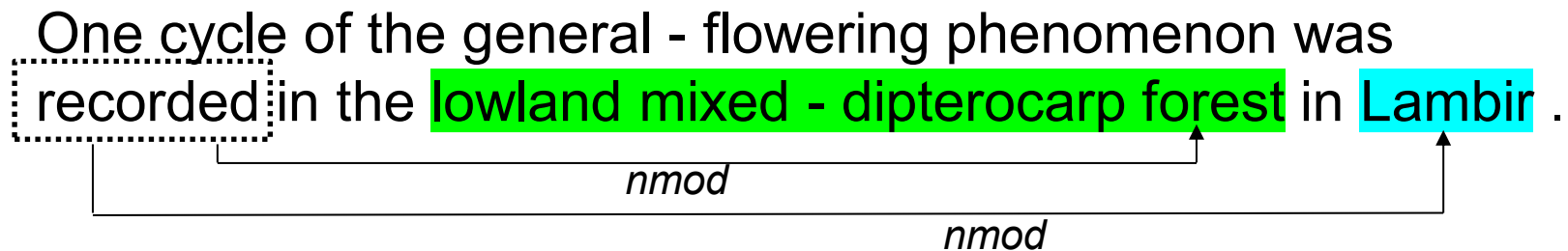
and Tampin the seed orchard .

# Syntactic Pattern-Based Matching

## 2. Entities have a common root.

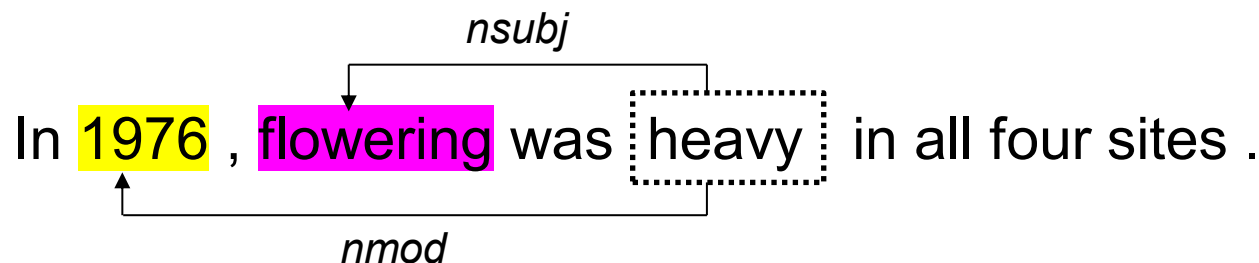
N → Habitat

N → Geographical Location



N → Reproductive Condition

N → Temporal Expression

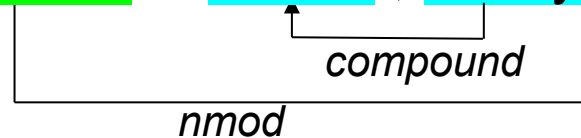


# Syntactic Pattern-Based Matching

3. Entities are linked by 1 or more tokens (words).

Habitat → N → Geographical Location

Appanah and Rasol ( 1990 ) reported that mean dbh of fruiting dipterocarp trees was 70.2 cm in **undisturbed forest** in **Pasoh** , **Malaysia** .



Reproductive Condition → N → Temporal Expression

There were two **flowerings** in **March** to **May** , and one in **August** during this period .

The diagram illustrates syntactic links between the highlighted entities in the text above. Two arrows labeled 'nmod' connect the start of 'flowerings' to the start of 'March' and 'May'. A long arrow labeled 'conj' connects the start of 'flowerings' to the start of 'August'. A shorter arrow labeled 'nmod' connects the start of 'August' to the start of 'during'.

# Sample relations extracted

Habitat	Geographical Location
lowland dipterocarp forest	Sarawak
swamps	northwest Borneo
tropical forests	southeast Asia
lowland dipterocarp forest	Lambir Hills National Park
logged forest	Lesong
fresh water swamps	Sabah

Reproductive Condition	Temporal Expression
flowering	end of November 2001
flowering	end of August 2001
mast fruiting	Aug-96
mass flowering	1976
mass flowering	1955
flowered	Jul-66

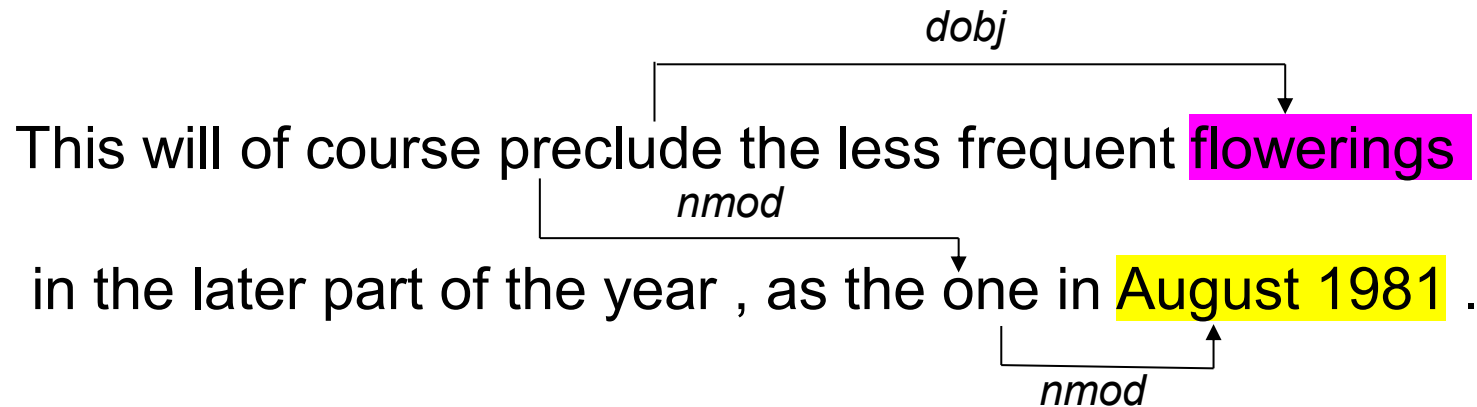
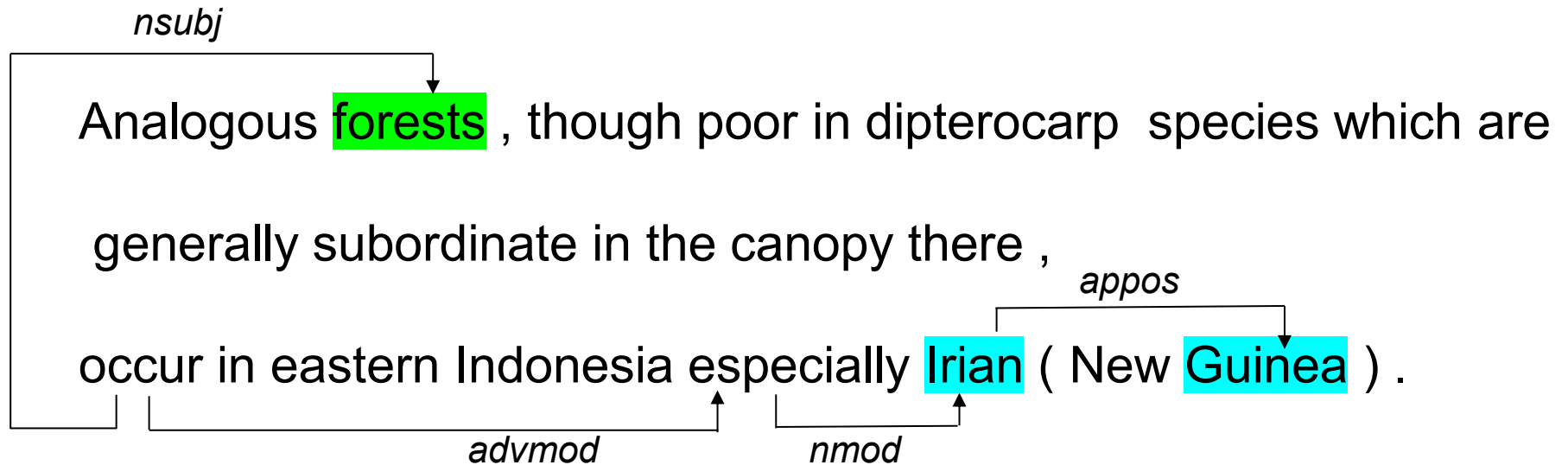
# Evaluation

Relation Type	Method	Relevant relations	TP	FP
Habitat – Geographical Location	Co-occurrence	47	47	26
	Relation extraction	47	38	2
Reproductive Condition – Temporal Expression	Co-occurrence	139	139	144
	Relation extraction	139	90	11

Relation Type	Method	Precision	Recall	F-score
Habitat – Geographical Location	Co-occurrence	64.38%	100.00%	78.33%
	Relation extraction	95.00%	80.85%	87.36%
Reproductive Condition – Temporal Expression	Co-occurrence	49.12%	100.00%	65.88%
	Relation extraction	89.11%	64.75%	75.00%

$$F = \frac{2 * pre * recall}{pre + recall}$$

# Examples of missed relations





# Ongoing Work

- Consider the presence of modifiers between a common root of entities.
- Curate a database of dipterocarp occurrences using relation extraction based on syntactic pattern matching, i.e. integration of text-mined information (e.g., Habitat – Geographical Location and Reproductive Condition – Temporal Expression relationships) with primary data (e.g., occurrence data from GBIF).

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***Thank you!***

***Questions?***

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