



### Feature Functions

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December 2014

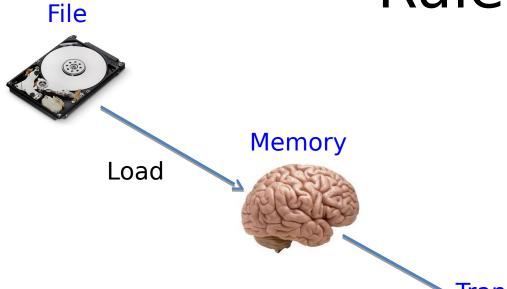
### Feature Function

- Calculate score(s) for a translation rule
  - Partial translation
  - Completed translation
  - Examples
    - Phrase table
    - Language model
    - Word penalty
    - Phrase penalty
- Many feature functions
  - Weighted linear combination
- What is a translation?
  - Made of multiple translation rules





## Timeline of a Translation Rule



sentence

Apply to input Translation Option



**Hypothesis** 

Search





## Timeline of a Translation Rule

File



Memory

Load

Source phrase Target phrase



Apply to input sentence Input sentence Input path

**Translation Option** 



Hypothesis

Search

Translation context Segmentation





# Timeline of a Translation Rule

Memory Load Once

Apply to input sentence

Per occurrence in sentence

Translation Option

Hypothesis

Search Per hypothesis





## Feature Function API Loading

File

je suis ||| I am

**Access to:** Source phrase: je suis

Target phrase: I am

Memory



Feature functions that use this:

Word Penalty
Phrase penalty
Language model (partial)





## Feature Function API Apply to input sentence

Memory



Access to: Input sentence: je suis 25 ans.

Input subphrase: je suis 25

Feature functions that use this:

Input feature Bag-of-word features....



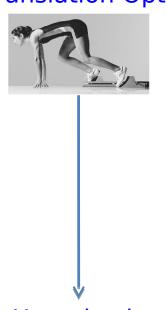




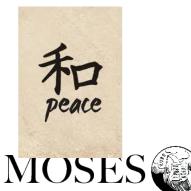


## Feature Function API Search

#### **Translation Option**







#### **Access to:** Current rule (hypothesis)

Previous rules Segmentation

#### **Stateful features:**

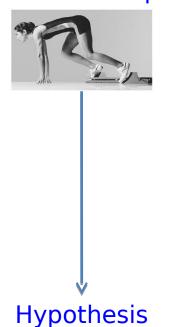
#### **Stateless features:**

void EvaluateWhenApplied(hypo, scores)
void EvaluateWhenApplied(hypo, scores)



## Feature Function API Decoding

**Translation Option** 



Feature functions that use this:

- All stateful features
  - Language models
  - Distortion model
  - Lexicalized reordering model

**—** ...





### Feature Function

#### Loading:

#### **Apply to Input:**

#### **Search:**

#### Stateful features:

#### **Stateless features:**

void Evaluate(hypo, scores)
void EvaluateChart(hypo, scores)





## Adding a New Feature Function

- Inherit from
  - StatefulFeatureFunction
  - StatelessFeatureFunction
- Register
  - in moses/FF/Factory.cpp
  - add entry
    - MOSES\_FNAME(ClassName);





### Template Feature Functions

- SkeletonStatelessFF
- SkeletonStatefulFF

- SkeletonLM
- SkeletonPT

- Video Demo
  - on YouTube





### Properties

Vanilla translation rule

```
je suis ||| I am ||| 0.1 0.2 0.3 0.4
```

With properties

- Example properties
  - Syntax structure
  - Document context
  - Orientation





### Properties

- Implement class
  - Inherit from PhraseProperty
  - Override method
    - ProcessValue(string)
  - Register property
    - MOSES\_PNAME2("KeyName", Property class);
- Use property
  - Inside feature function Evaluate()
  - targetPhrase.GetProperty("KeyName");









#### **Feature Functions**

Hieu Hoang Matthias Huck

December 2014

#### Thanks for inviting me to come

Here to tell you a little about the things I've been doing to Moses

- over the past 2 years
- mainly concentrate of the past year
- but will quickly tell you about things I did prior to that

#### **Feature Function**

- Calculate score(s) for a translation rule
  - Partial translation
  - Completed translation
  - Examples
    - Phrase table
    - Language model
    - Word penalty
    - Phrase penalty
- · Many feature functions
  - Weighted linear combination
- What is a translation?
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What is the task of a feature function

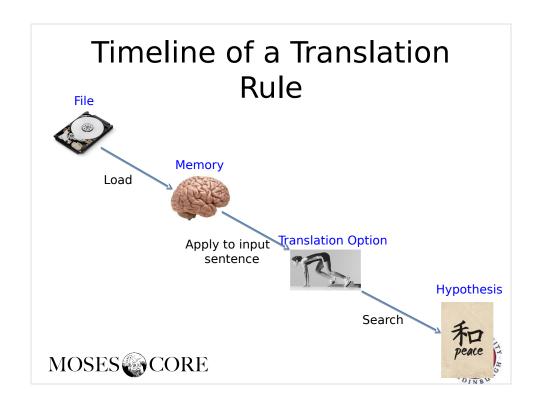
- it's task is to give score to a translation rule
  - the thing you see in a phrase-table
- FF calculate 1 or more scores

These are examples of FF

There can be many scores

Total score for the translation

- weighted sum of all scores



#### Translation rule has a lifespan

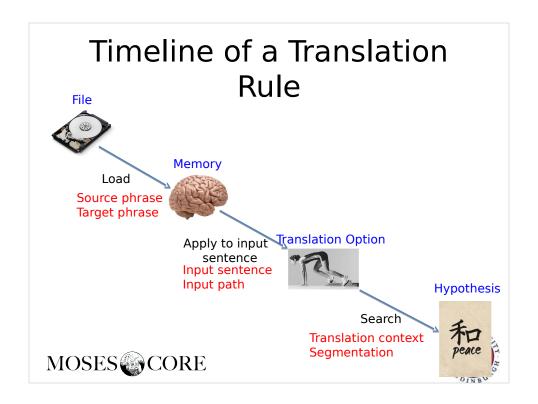
- starts off in a file on disk
- gets loaded into memory
- before a sentence is decoded
  - translation rules are looked up
- fitted to a specific place in the source sentence
  - name of translation rules
    - changes to translation option
    - all intents and purposes
      - is a trans rule

#### When it's being used in search

rulo

- it's name changes to hypothesis
  - again, wrapper around a translation

3



#### at each step

 feature function has access to different kinds of side information with which to score the rule

#### **During loading**

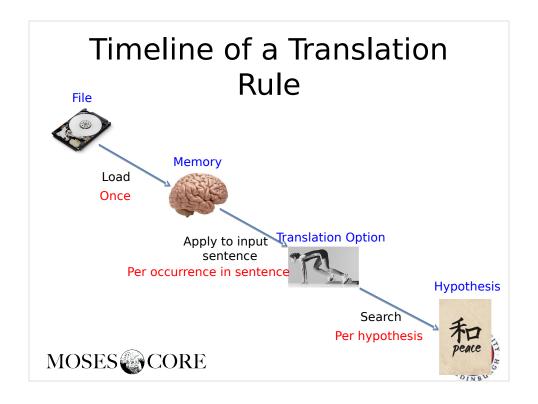
- only know what the rule is, without context

When it is being applied to a sentence

- it know the sentence

#### **During search**

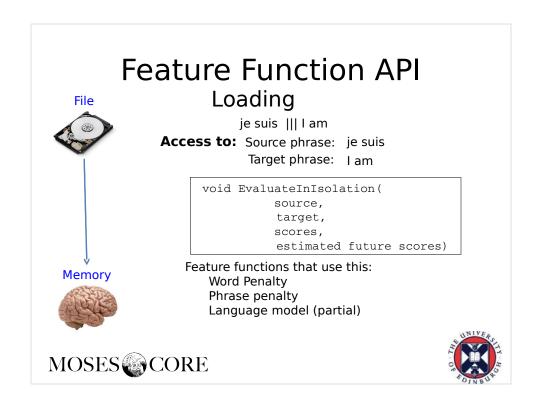
- it know what other rules have been used



#### Point of showing you this timeline

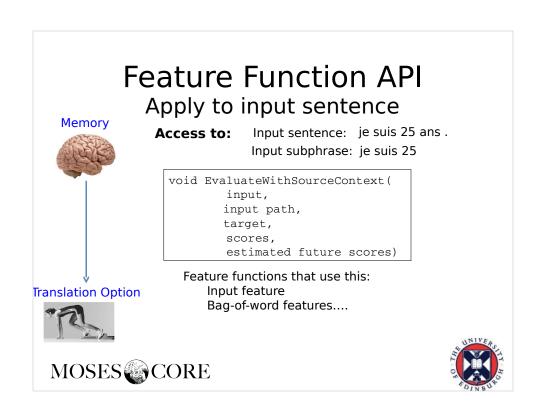
sooner you caclulate it, the better

- 1. efficiency
  - not repeated
- 2. more accurate
  - each stage subject to pruning
    - some rules are thrown away
- if the feature function can give a good score
- the rule can say 'hey I'll be really useful to you, don't throw me away!"



#### **During load**

- this is the translation rule
- If you want your FF to score the rule now
  - implement this function
  - it takes are arguments
    - source + target parts of the rule
- you return the scores and estimated future score

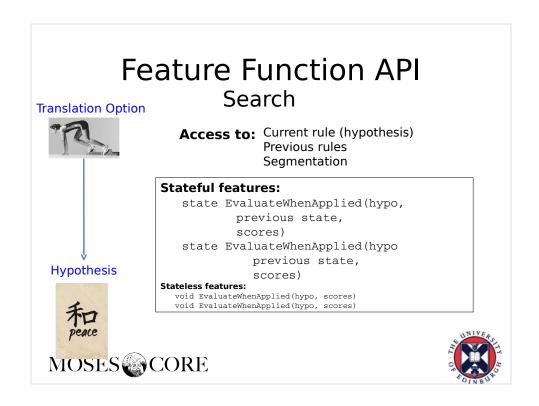


#### Have a sentence

- looking up rules that can be used in that sentence
  - once you find a rule that can be applied
- to a specific substring in a specific sentence
  - create translation option

#### At this point

have another opportunity to evaluate the scores of the rules



#### search

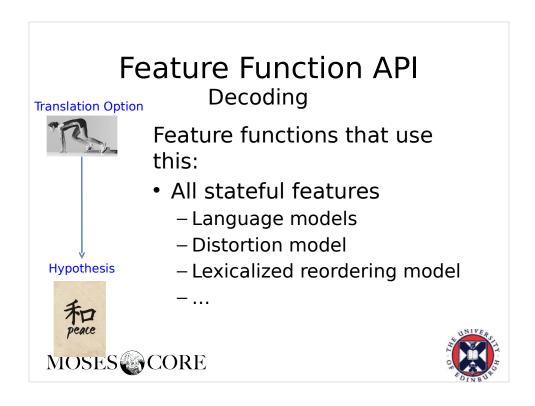
when you have a translation rule

- you know exactly where it's going to be applied to
  - and you actually apply it

Implement 1 of these functions

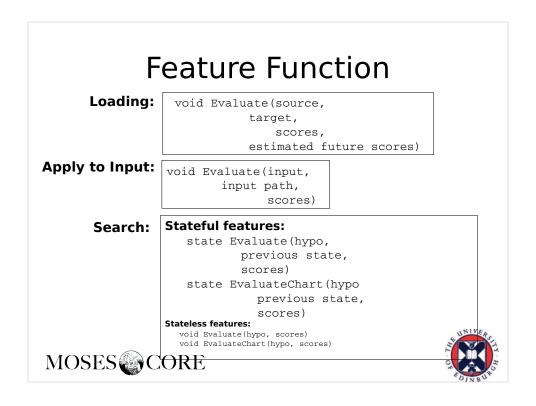
Only place where calculating the feature function is different for phrase-based or syntax models

- slightly different for stateless and stateful features



all the translation rules that were used, the total output phrase segmentation

- derivation tree if hiero/syntax model



#### Recap

- you can score translation rule at 3 stages in the decoding process

Loading

Appying to the input sentence Search

- Implement 1 of these functions if you do

However, a FF can score the same rule in more than 1 stage

- ie. It can implement more of these functions

## Adding a New Feature Function

- Inherit from
  - StatefulFeatureFunction
  - StatelessFeatureFunction
- Register
  - in moses/FF/Factory.cpp
  - add entry
    - MOSES\_FNAME(ClassName);





What do you have to do now to add a new FF?

- only 2 things
- Create a class that inherit from Stateful or Stateless FF
  - depending on the type of FF you want
- 2. Register your class

#### Template Feature Functions

- SkeletonStatelessFF
- SkeletonStatefulFF
- SkeletonLM
- SkeletonPT
- Video Demoon YouTube

MOSES CORE



#### **Properties**

Vanilla translation rule

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je suis ||| I am ||| 0.1 0.2 0.3 0.4
```

With properties

```
je suis ||| I am ||| 0.1 0.2 0.3 0.4||| ||| ||| || || || || || || { Key1 Value1} } { {Key2 Value2}}
```

- Example properties
  - Syntax structure
  - Document context
  - Orientation





#### 7<sup>th</sup> column

#### **Properties**

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