# Algebraic Effects and Handlers in Natural Language Interpretation

Jiří Maršík and Maxime Amblard

LORIA, UMR 7503, Université de Lorraine, CNRS, Inria, Campus Scientifique, F-54506 Vandœuvre-lès-Nancy, France

July 17, 2014

### **Objectives**

- 1. Detailed semantics for a large-scale grammar of a natural language
- 2. Capturing the interactions of non-local (i.e. non-compositional) semantic phenomena
  - anaphora
  - in-situ quantification
  - event arguments
  - presupposition
  - intensionalization
  - extraction
- 3. Multiple semantic phenomena in a single treatment without overly complicated types and terms

#### In-situ quantification

Barker (2002)

Mary read every book.

 $\forall x.\mathsf{book}(x) \rightarrow \mathsf{read}(\mathsf{Mary},x)$ 

$$\llbracket s \rrbracket = o$$
  
 $\llbracket np \rrbracket = (\iota \to o) \to o$ 

$$\begin{bmatrix} \text{READ} \end{bmatrix} : \llbracket np \rrbracket \to \llbracket np \rrbracket \to \llbracket s \rrbracket \\
 \llbracket \text{READ} \rrbracket : ((\iota \to o) \to o) \to ((\iota \to o) \to o) \to o \\
 \llbracket \text{READ} \rrbracket = \lambda so.s(\lambda x.o(\lambda y.\mathbf{read}(x,y)))$$

# Anaphora

de Groote (2006)

Mary<sub>1</sub> read her<sub>1</sub> favorite book. read(Mary, favorite-book(Mary))

 $= \gamma \rightarrow (\gamma \rightarrow o) \rightarrow o$ 

 $[READ] = \lambda so.s(\lambda x.o(\lambda ve\phi.read(x, v) \land \phi e))$ 

 $\llbracket s \rrbracket = \overline{o}$ 

$$[\![np]\!] = (\iota \to \overline{o}) \to \overline{o}$$

$$= (\iota \to \gamma \to (\gamma \to o) \to o) \to \gamma \to (\gamma \to o) \to o$$

$$[\![READ]\!] : [\![np]\!] \to [\![np]\!] \to [\![s]\!]$$

$$[\![READ]\!] : ((\iota \to \overline{o}) \to \overline{o}) \to ((\iota \to \overline{o}) \to \overline{o}) \to \overline{o}$$

$$[\![READ]\!] : ((\iota \to \gamma \to (\gamma \to o) \to o) \to \gamma \to (\gamma \to o) \to o)$$

$$\to ((\iota \to \gamma \to (\gamma \to o) \to o) \to \gamma \to (\gamma \to o) \to o)$$

$$\to \gamma \to (\gamma \to o) \to o$$

#### Motivation

- non-local phenomena + compositionality = generalizing meaning (often by abstracting over some new parameter)
- ▶ more non-local phenomena ⇒ more parameters ⇒ more complexity

most research focuses on single phenomena

#### Effects in Interpretation

semantic generalizations pprox monads

(Shan 2002)

Montague's PTQ pprox evaluation order + continuations (Barker 2002)

non-local phenomena  $\approx$  computational effects  $\Rightarrow$  elegant explanation of their interactions (Kiselyov 2008; Shan 2005)

#### Effects and Handlers

#### Introduction

- Effectful operation: throws an exception containing the supplied argument and the current continuation
- ▶ Handlers: capture the exceptions to implement the operations
  - e.g. just by applying the continuation to some result
- ► Type-and-effect system: like Java's checked exceptions

$$(\mathbf{op}: A \to B) \in E \qquad \Gamma \vdash V : A \qquad \Gamma, x : B \vdash_E M : C$$
$$\Gamma \vdash_E \mathbf{op} V (\lambda x.M) : C$$

(Kammar, Lindley, and Oury 2013)

#### Effects and Handlers

#### Advantages

► Easier to combine multiple effects in a single semantics (Cartwright and Felleisen 1994) (Kiselyov, Sabry, and Swords 2013)

$$\llbracket C_E \rrbracket = C + \sum_{(\mathbf{op}: A \to B) \in E} A \times \llbracket C_E \rrbracket^B$$

$$\begin{tabular}{ll} \tt "effects + handlers" : "delimited continuations" \\ &= \\ \tt "while" : "goto" \\ \end{tabular}$$

(Bauer and Pretnar 2012)

#### Effects and Handlers

Effectful operations

$$\begin{split} & \mathbf{get}: 1 \to \gamma^{\{\mathbf{get}\}} \\ & \mathbf{fresh}: 1 \to \iota^{\{\mathbf{fresh}\}} \\ & \mathbf{assert}: o \to 1^{\{\mathbf{assert}\}} \\ & \mathbf{scope\_over}: ((\iota \to o) \to o) \to \iota^{\{\mathbf{scope\_over}\}} \\ & \mathbf{move}: 1 \to \iota^{\{\mathbf{move}\}} \end{split}$$

Handlers

$$\begin{aligned} \textit{drs}: \gamma &\rightarrow \left(o^{\{\text{get;fresh;assert}|\rho\}} \Rightarrow o^{\rho}\right) \\ \textit{tensed\_clause}: o^{\{\text{scope\_over}|\rho\}} &\Rightarrow o^{\rho} \\ \textit{extract}: \alpha^{\{\text{move}|\rho\}} &\Rightarrow \left(\iota \rightarrow \alpha^{\rho}\right) \end{aligned}$$

**Logical Connectives** 

$$\overline{\exists} P = \lambda e \phi. \exists x. Px(x :: e) \phi$$

$$\neg A = \lambda e \phi . \neg (Ae(\lambda e'. \top)) \wedge \phi e$$

$$A \overline{\wedge} B = \lambda e \phi. Ae(\lambda e'. Be' \phi)$$

**Logical Connectives** 

$$\overline{\exists} P = \lambda e \phi. \exists x. P x (x :: e) \phi 
\overline{\exists} P = P \text{ (fresh ())} 
\overline{\neg} A = \lambda e \phi. \neg (Ae(\lambda e'. \top)) \land \phi e 
\overline{\neg} A = \neg (\text{with } drs \text{ (get ()) handle } A) 
A \overline{\land} B = \lambda e \phi. Ae(\lambda e'. Be' \phi) 
A \overline{\land} B = A \land B$$

Logical Connectives

$$\overline{\exists} P = \lambda e \phi. \exists x. Px(x :: e) \phi 
\overline{\exists} P = P \text{ (fresh ())} 
\overline{\neg} A = \lambda e \phi. \neg (Ae(\lambda e'. \top)) \land \phi e 
\overline{\neg} A = \neg \text{(with } drs \text{ (get ()) handle } A) 
A \overline{\land} B = \lambda e \phi. Ae(\lambda e'. Be' \phi) 
A \overline{\land} B = A \land B 
A \Rightarrow B = \overline{\neg} (A \overline{\land} \overline{\neg} B)$$

 $\overline{\forall} P = \overline{\exists} x \exists Px$ 

Lexical Items

$$[\![\mathtt{SHE}]\!] = \lambda \textit{ke}\phi.\textit{k(sel_{she}(e))}e\phi$$

$$[\![ \text{SOMETHING} ]\!] = \lambda k. \, \exists \, x. (k \, x) = \lambda ke\phi. \, \exists x. kx (x :: e)\phi$$

$$\llbracket \text{EVERY} \rrbracket = \lambda n k. \, \overline{\forall} \, x. (n \, x) \, \overline{\Rightarrow} \, (k \, x)$$

$$\llbracket \text{READ} \rrbracket = \lambda SO.S(\lambda s.O(\lambda oe\phi.\textbf{read}(s,o) \land \phi e))$$

Lexical Items

$$\llbracket ext{SHE} 
rbracket = \lambda k e \phi. k( ext{sel}_{ ext{she}}(e)) e \phi \ \llbracket ext{SHE} 
rbracket = \lambda k. k( ext{sel}_{ ext{she}}( ext{get} ()))$$

[SOMETHING]] = 
$$\lambda k. \, \overline{\exists} \, x.(k \, x) = \lambda ke\phi. \, \exists x.kx(x :: e)\phi$$
  
[SOMETHING]] =  $\lambda k. \, \overline{\exists} \, x.(k \, x) = \lambda k.k(\text{fresh }())$ 

$$\llbracket \text{EVERY} \rrbracket = \lambda n k. \, \overline{\forall} \, x. (n \, x) \Longrightarrow (k \, x)$$
$$\llbracket \text{EVERY} \rrbracket = \lambda n k. \, \overline{\forall} \, x. (n \, x) \Longrightarrow (k \, x)$$

$$[READ] = \lambda SO.S(\lambda s.O(\lambda oe\phi.read(s, o) \land \phi e))$$
$$[READ] = \lambda SO.S(\lambda s.O(\lambda o.read(s, o)))$$

 $[SHE] = \lambda ke\phi.k(sel_{she}(e))e\phi$ 

Lexical Items

```
[SHE] = \lambda k.k(sel_{she}(get()))
              [SHE] = \{sel_{she}(\mathbf{get}())\}
[SOMETHING] = \lambda k. \exists x.(k x) = \lambda ke\phi. \exists x.kx(x :: e)\phi
[SOMETHING] = \lambda k. \overline{\exists} x.(k x) = \lambda k.k(fresh())
[SOMETHING] = \{fresh()\}
         \llbracket \text{EVERY} \rrbracket = \lambda n k. \, \forall \, x. (n \, x) \Rightarrow (k \, x)
         \llbracket \text{EVERY} \rrbracket = \lambda n k. \, \forall x. (n \, x) \Rightarrow (k \, x)
         \llbracket \text{EVERY} \rrbracket = \lambda n. \{ \text{scope\_over } (\lambda k. \forall x. (n \ x) \Rightarrow (k \ x)) \}
           [READ] = \lambda SO.S(\lambda s.O(\lambda oe\phi.read(s, o) \land \phi e))
           [READ] = \lambda SO.S(\lambda s.O(\lambda o.read(s, o)))
           [READ] = \lambda s_t o_t. \{ with tensed\_clause handle read(s_t!, o_t!) \}
```

Lexical Items (cont'd)

$$\llbracket \text{SOME} \rrbracket = \lambda n k. \, \overline{\exists} \, x. (n \, x) \, \overline{\land} \, (k \, x)$$

$$[\![WHO]\!] = \lambda rnx.nx \overline{\wedge} r(\lambda k.kx)$$

Lexical Items (cont'd)

$$\begin{split} \llbracket \text{SOME} \rrbracket &= \lambda n k. \, \overline{\exists} \, x. (n \, x) \, \overline{\land} \, (k \, x) \\ \llbracket \text{SOME} \rrbracket &= \lambda n k. \, \overline{\exists} \, x. (n \, x) \, \land \, (k \, x) \\ &= \lambda n k. k ( \, \text{let} \, x = \text{fresh} \, () \, \text{in} \\ &\quad \text{let} \, () = \text{assert} \, (n \, x) \, \text{in} \\ &\quad x \, ) \end{split}$$

$$[WHO] = \lambda rnx.nx \overline{\wedge} r(\lambda k.kx)$$
$$[WHO] = \lambda rnx.nx \wedge r(\lambda k.kx)$$

Lexical Items (cont'd)

```
[SOME] = \lambda nk. \overline{\exists} x.(n x) \overline{\land} (k x)
[SOME] = \lambda nk. \overline{\exists} x.(n x) \wedge (k x)
            = \lambda n k. k (let x = fresh () in
                            let () = assert (n \times) in
[SOME] = \lambda n. \{ scope\_over (\lambda k. \exists x.(n x) \land (k x)) \}
            =\lambda n.\{ let x= fresh () in
                        let () = assert (n \times) in
                        x
 [WHO] = \lambda rnx.nx \overline{\wedge} r(\lambda k.kx)
 [WHO] = \lambda rnx.nx \wedge r(\lambda k.kx)
 [WHO] = \lambda rnx.nx \wedge rx
```

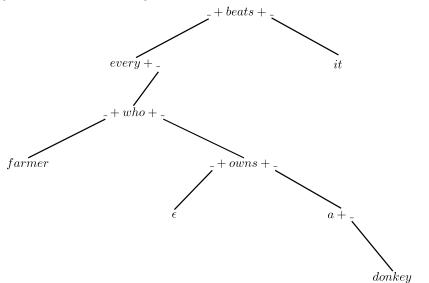
### Treating Extraction as an Effect

 $\llbracket \epsilon \rrbracket = \{ \mathsf{move} \ () \}$ 

```
\llbracket \text{WHO} \rrbracket : \llbracket s \rrbracket^{\{\text{move}|\rho\}} \to \llbracket n \rrbracket \to \llbracket n \rrbracket^{\rho}
[WHO] = \lambda r_t n \cdot \lambda x. let r = with extract handle <math>r_t! in
                                                (n \times) \wedge (r \times)
                  r_t: o^{\{\mathsf{move}|\rho\}}
                    r: \iota \to o^{\rho}
                    n: \iota \to o
                    x:\iota
          \llbracket \epsilon \rrbracket : \llbracket np \rrbracket^{\{ move \}}
```

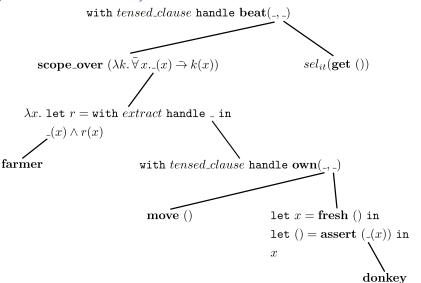
# Example - Syntax

Every farmer who owns a donkey beats it.



#### **Example - Semantics**

Every farmer who owns a donkey beats it.



#### Conclusion

#### We have:

- motivated the use of algebraic effects and handlers in semantics.
- translated de Groote's continuation-based dynamic logic (de Groote 2006) to effects, reconstructing notions from DRT.
- treated extraction as an effect in interpretation instead of using hypothetical reasoning and lambda abstractions in the syntax.

#### Future Work

#### We would like to:

- show how effects and handlers apply to the other non-local phenomena (presupposition, event arguments, optional items, intensionalization).
- build a fragment that combines all of these.
- design a calculus with algebraic effects and handlers and a suitable evaluation order (CBV vs CBN).

#### Thank You

Questions?

Would you like to know more?

 $http://jirka.marsik.me/research/\\ algebraic-effects-and-handlers-in-natural-language-interpretation$ 

#### References

Barker, Chris (2002). "Continuations and the nature of quantification".

Bauer, Andrej and Matija Pretnar (2012). "Programming with algebraic effects and handlers".

Cartwright, Robert and Matthias Felleisen (1994). "Extensible denotational language specifications".

de Groote, Philippe (2006). "Towards a montagovian account of dynamics".

Kammar, Ohad, Sam Lindley, and Nicolas Oury (2013). "Handlers in action".

Kiselyov, Oleg (2008). "Call-by-name linguistic side effects".

Kiselyov, Oleg, Amr Sabry, and Cameron Swords (2013).

"Extensible effects: an alternative to monad transformers".

Shan, Chung-chieh (2002). "Monads for natural language semantics".

Shan, Chung-chieh (2005). "Linguistic Side Effects".