# Effect-Driven Parsing

Formal studies on a categorical approach to semantic parsing





- 1 Introduction
- 2 Category-theoretical type system
- 3 Effect Handling
- 4 Semantic Parsing





- 1 Introduction
  - General Introduction
  - Categorical Introduction





#### Context

**Goal.** Categorical formalization of a type–effects system for natural-language semantics (following [BC25]).

**Method.** Develop a graphical, type-driven parsing formalism that derives sentence meaning compositionally from word meanings.





## **Typed Semantics for Natural Languages**

Expression	Type	$\lambda$ -Term
planet	$ extstyle{e}  ightarrow  extstyle{t}$	$\lambda x.$ planet $x$
	Generalizes to common nouns	
carnivorous	$(\mathtt{e}  o \mathtt{t})$	$\lambda x.\mathbf{carnivorous}x$
	Generalizes to predicative adjectives	
skillful	$(\mathtt{e}  o \mathtt{t})  o (\mathtt{e}  o \mathtt{t})$	$\lambda p.\lambda x.px \wedge \mathbf{skillful}x$
	Generalizes to predicate modifier adjectives	
Jupiter	е	$\mathbf{j} \in \mathrm{Var}$
	Generalizes to proper nouns	
sleep	$ extstyle{e}  ightarrow  extstyle{t}$	$\lambda x.\mathbf{sleep}x$
	Generalizes to intransitive verbs	







## **Syntactic Types and Semantic Types**

■ What is the type of a cat or Jupiter, a planet?





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- Syntactically, a cat and the cat should be interchangeable and have the same type.
- No single canonical **cat** exists: that type cannot be **e**.



## Syntactic Types and Semantic Types

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- Syntactically, a cat and the cat should be interchangeable and have the same type.
- No single canonical **cat** exists: that type cannot be **e**.

We will use (side-)effects to do the difference between them:

$$\mathbf{a} \ \mathbf{cat} = \{c \mid \mathbf{cat} \ c\}$$

the cat = 
$$x$$
 if cat<sup>-1</sup>( $\top$ ) = { $x$ } else #



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#### **Effects as Functors**

Monads model side-effects [Mog89].





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Monads model side-effects [Mog89]. Here, **functors suffice**: we may forbid merging/creating effects; lighter structures are useful.





## **String Diagrams**

**String Diagrams** are a formalism (see [HM23] for example) that allows to visually represent the different threads of a computation and the possible side-effects that appear.





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**String Diagrams** are a formalism (see [HM23] for example) that allows to visually represent the different threads of a computation and the possible side-effects that appear.

Categorical foundations: [JS91]; Used as a tool for parsing: [CSC10].







### Other Categorical Theories

[Mar], and [SM25] use Hopf algebras to give a model for parsing.

They integrate morphological features inside the syntactic structures without breaking the model chosen for syntax.



- 2 Category-theoretical type system



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#### **Notations**

 $\blacksquare$  Language:  $\mathcal{L};$  words compose denotationally.





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- Language:  $\mathcal{L}$ ; words compose denotationally.
- Base CCC: C; effects: functors  $\mathcal{F}(\mathcal{L})$ .
- Closure:  $\bar{\mathcal{C}} = \text{closure of } \mathcal{C} \text{ under } \mathcal{F}(\mathcal{L})^*, \text{ products and exponentials.}$

Intuition: all (effect-sequence, base type) combos, with functions/products.





## Intuitionistic-style Typing Judgements

We then have typing judgements for basic combinations:

$$\begin{split} \frac{\Gamma \vdash x : \tau & \Gamma \vdash F \in \mathcal{F}(\mathcal{L})}{\Gamma \vdash Fx : F\tau} \mathsf{Cons} \\ \frac{\Gamma \vdash x : F\tau_1 & \Gamma \vdash \varphi : \tau_1 \to \tau_2}{\Gamma \vdash \varphi x : F\tau_2} \mathsf{fmap} \end{split}$$



## **Intuitionistic-style Typing Judgements**

We then have typing judgements for basic combinations:

$$\frac{\Gamma \vdash x : \tau_{1} \qquad \Gamma \vdash \varphi : \tau_{1} \rightarrow \tau_{2}}{\Gamma \vdash \varphi x : \tau_{2}} \mathsf{App}$$
 
$$\frac{\Gamma \vdash x : A\tau_{1} \qquad \Gamma \vdash \varphi : A\left(\tau_{1} \rightarrow \tau_{2}\right)}{\Gamma \vdash \varphi x : A\tau_{2}} \mathord{<\!\!\!*\!\!\!>}$$





## Intuitionistic-style Typing Judgements

Typing judgements for natural transformations:

$$\frac{\Gamma \vdash x : \tau}{\Gamma \vdash x : A\tau} \texttt{pure/return}$$

$$\frac{\Gamma \vdash x : MM\tau}{\Gamma \vdash x : M\tau} \gt\gt=$$

$$\forall F \overset{\theta}{\Longrightarrow} G, \qquad \frac{\Gamma \vdash x : F\tau \qquad \Gamma \vdash G : S' \subseteq \star \qquad \tau \in S'}{\Gamma \vdash x : G\tau} \mathrm{nat}$$



- 2 Category-theoretical type system
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#### Information

To present the language we need:

- The syntax of the language.
- An typed lexicon (possibly with effects).





### **Updated Lexicon**

Expression	Type	$\lambda$ -Term
it	Ge	$\lambda g.g_0$
$\cdot, \mathbf{a} \cdot$	$ extsf{e}  ightarrow ( extsf{e}  ightarrow  extsf{t})  ightarrow  extsf{We}$	$\lambda x.\lambda p.\langle x,px\rangle$
which	$(\mathtt{e}  o \mathtt{t})  o \mathtt{Se}$	$\lambda p. \{x \mid px\}$
the	$(\mathtt{e}  o \mathtt{t})  o \mathtt{Me}$	$\lambda p.x \text{ if } p^{-1}\left(\top\right) = \left\{x\right\} \text{ else } \#$
a	$(\mathtt{e} \to \mathtt{t}) \to \mathtt{De}$	$\lambda p.\lambda s. \{\langle x, x + s \rangle \mid px\}$
every	$(\mathtt{e} \to \mathtt{t}) \to \mathtt{Ce}$	$\lambda p.\lambda c. \forall x, px \Rightarrow cx$







## **Introducing Higher-Order Constructs**

We implement higher-order semantics (e.g. the future and plural) via functors and natural transformations:



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 $future(be(I, a cat)) \xrightarrow{nat} be(future(I), a cat) \xrightarrow{nat} be(future(I), a cat)$ 

Those constructs are integrated by using natural transformations explaining their propagation through other effects, as those are purely semantic predicates.



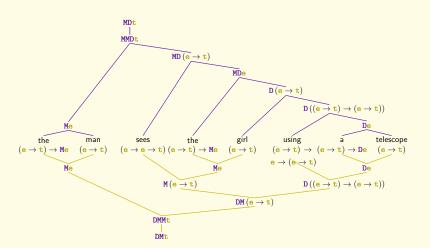
## **Introducing Higher-Order Constructs**

For the plural, this gives:

CN(P)	$\Gamma \vdash p : (\mathbf{e} \to \mathbf{t})$	$\Pi(p) = \lambda x. (px \land  x  \ge 2)$
ADJ(P)	$\Gamma \vdash p : (\mathbf{e} \to \mathbf{t})$	$\Pi(p) = \lambda x. (px \land  x  \ge 2)$
	$\Gamma \vdash p : (\mathbf{e} \to \mathbf{t}) \to (\mathbf{e} \to \mathbf{t})$	$\Pi(p) = \lambda \nu. \lambda x. (p(\nu)(x) \land  x  \ge 2)$
NP	$\Gamma dash p: \mathbf{e}$	$\Pi(p) = p$
	$\Gamma \vdash p : (\mathbf{e} \to \mathbf{t}) \to \mathbf{t}$	$\Pi(p) = \lambda \nu . p\left(\Pi \nu\right)$
IV(P)/VP	$\Gamma dash p : \mathbf{e}  o \mathbf{t}$	$\Pi(p) = \lambda o. (po \land  x  \ge 2)$
TV(P)	$\Gamma \vdash p : \mathbf{e} \to \mathbf{e} \to \mathbf{t}$	$\Pi(p) = \lambda s. \lambda o. (p(s)(o) \land  s  \ge 2)$



### **Ambiguity**







- 3 Effect Handling



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  - Notion and usage of handlers
  - String diagrams for effect handling
  - Reducing in string diagrams
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#### **Handlers**

A handler for an effect F is a natural transformation  $F\Rightarrow \mathrm{Id},$  as proposed in [WSH14].

Handlers should also be exact inverses to monadic and applicative units: this partially justifies semantically why we can remove the usage of the unit rule out of certain situations.







## **Defining Handlers**

There are two main types of handlers that are of interest to us:





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- 1 Language-Defined Handlers, which are defined with adjunctions and comonads, for example. Those arise from fundamental properties of the considered effects.
- Speaker-dependant handlers, which are considered when retrieving the denotation from a sentence from under the effects that arose in the computation of its meaning. Those need to be considered dependent on the speaker because for example of the multiple ways to solve non-determinism.





## **Scope Islands**

The notion of handlers allows us to enforce the notion of scope islands. To do so, it would suffice to ask that the words enclosing the island, are not defined on not certain effectful types and make handlers a part of the combination modes, as introduced in [BC25].



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We would for example have:

$$\mathbf{if} \,: (\mathbf{t} \setminus \mathcal{FL}^*\mathbf{Ct}) \to \mathbf{t} \to \mathbf{t}$$





#### **Plan**

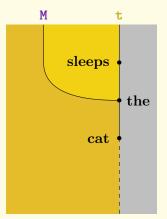
- 3 Effect Handling
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### String Diagrams Representation of Sentences I

Here, a string diagram is a representation of the side-effects and types of a sentence across its computation.



This diagram for example represents the sentence *The cat sleeps*. The order of the words and position of the strings will be explained in detail in the next section.



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## **Deformation of String Diagrams**

String diagrams will be the formalism we use to compute equality between denotations, and especially handling the denotations.

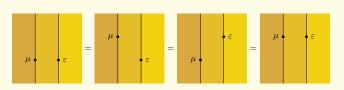
Theorem 3.1 — Theorem 3.1 [Sel10], Theorem 1.2 [JS91] A well-formed equation between morphism terms in the language of monoidal categories follows from the axioms of monoidal categories if and only if it holds, up to planar isotopy, in the graphical language.



# **Equations on String Diagrams I**

Every property of the functors, monads, natural transformations, adjunctions and more can be explained in terms of commutative diagrams, but also as string diagrams.

First, the elevator equations are a consequence of 3.1:





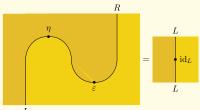






## **Equations on String Diagrams II**

The Snake equations are a rewriting of the properties of an adjunction:

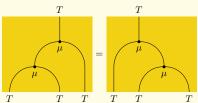






## **Equations on String Diagrams III**

The Monadic equations are a rewriting of the properties of a monad:



 $(\mu)$ 







### Confluence of Reductions I

Theorem 3.2 — Confluence Our reduction system is confluent and therefore defines normal forms:

- 1 Right reductions are confluent and therefore define right normal forms for diagrams under the equivalence relation induced by exchange.
- 2 Equational reductions are confluent and therefore define equational normal forms for diagrams under the equivalence relation induced by exchange.







Theorem 3.3 — Normalization Complexity Reducing a diagram to its normal form is done in quadratic time in the number of natural transformations in it.

This is accomplished using a formalism based on [DV22].





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  - The general method
  - String diagrams for parsing
  - String diagrams for reductions

 $>, \beta$ 



## CFG Model of Parsing I

We use a Context-Free Grammar to model our typing system and take its product with the syntax defining grammar.

$$<,\beta \qquad ::= \alpha, (\alpha \to \beta) \quad \mathsf{A}_{\mathbf{F}}(\alpha,\beta) \qquad ::= \mathbf{F}\alpha, \mathbf{F}\beta$$
 
$$\mathsf{UR}_{\mathbf{F}}(\alpha \to \alpha',\beta) \qquad ::= \mathbf{F}\alpha \to \alpha',\beta$$
 
$$\mathsf{J}_{\mathbf{F}} \, \mathsf{F}\tau \qquad ::= \mathbf{F}\mathsf{F}\tau \qquad \mathsf{UL}_{\mathbf{F}}(\alpha,\beta \to \beta') \qquad ::= \alpha, \mathsf{F}\beta \to \beta'$$
 
$$\mathsf{DN}_{\mathbf{C}} \, \tau \qquad ::= \mathbf{C}_{\tau}\tau \qquad \mathsf{C}_{\tau} \, (\mathsf{J}_{\tau}, \mathsf{P}\beta) \qquad ::= \alpha, \mathsf{F}\beta \to \beta'$$

$$\mathsf{CLR}\left(\mathsf{L}\alpha,\mathsf{R}\beta\right) \quad ::= \quad (\alpha,\beta)$$

$$\mathsf{ML}_{\mathsf{F}}\left(\alpha,\beta\right) \quad ::= \quad \mathsf{F}\alpha,\beta$$

$$\mathsf{ER}_{\mathsf{R}}\left(\mathsf{R}\left(\alpha\to\alpha'\right),\beta\right) \quad ::= \quad \alpha\to\mathsf{R}\alpha',\beta$$

$$\mathsf{MR}_{\mathsf{F}}(\alpha,\beta) \ ::= \ \alpha,\mathsf{F}\beta \qquad \qquad \mathsf{EL}_{\mathsf{R}}(\alpha,\mathsf{R}(\beta\to\beta')) \ ::= \ \alpha,\beta\to\mathsf{R}\beta'$$

 $::= (\alpha \to \beta), \alpha$ 





### **CFG Model of Parsing II**

This grammar works in five major sections:

- We reintroduce the grammar defining the type and effect system.
- 2 We introduce a structure for the semantic parse trees and their labels, the combination modes from [BC25].
- 3 We introduce rules for basic type combinations.
- 4 We introduce rules for higher-order unary type combinators.
- **5** We introduce rules for higher-order binary type combinators.



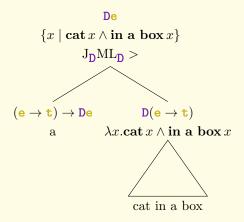


## **CFG Model of Parsing III**

Computationally, the introduction of this labeling system increases the size of the grammar by a factor linear in  $|\mathcal{F}(\mathcal{L})|$ . The parsing algorithms are then still polynomial, and scaling in sentence size does not change.

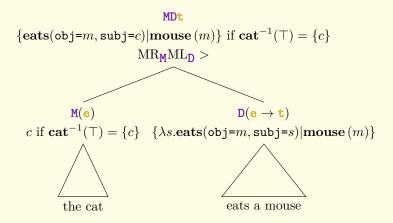


### Semantic Parse Trees I



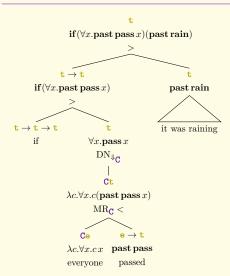


### Semantic Parse Trees II





### Semantic Parse Trees III

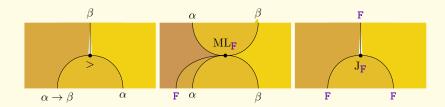


#### Plan

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  - The general method
  - String diagrams for parsing
  - String diagrams for reductions



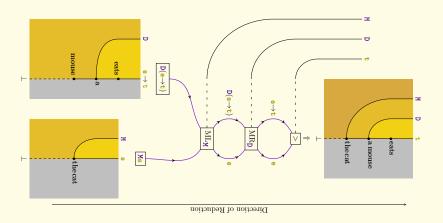
# **Combinators as String Diagrams**







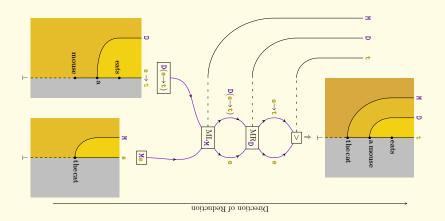
# A Parsing Diagram Step







## A Parsing Diagram Step









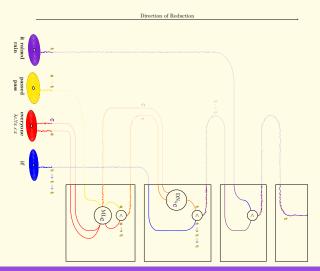
# **Building an Intuition**







## A Full Parsing Diagram



#### **Plan**

- 4 Semantic Parsing
  - The general method
  - String diagrams for parsing
  - String diagrams for reductions



We introduce denotations for our combinators, to allow us to define reductions that relieve a bit the ambiguity of the parsing grammar:

$$>= \lambda \varphi. \lambda x. \varphi x$$
 
$$\mathsf{ML}_{\mathbf{F}} = \lambda M. \lambda x. \lambda y. (\mathsf{fmap}_{\mathbf{F}} \lambda a. M(a,y)) x$$
 
$$\mathsf{A}_{\mathbf{F}} = \lambda M. \lambda x. \lambda y. (\mathsf{fmap}_{\mathbf{F}} \lambda a. \lambda b. M(a,b))(x) <*>y$$
 
$$\mathsf{UL}_{\mathbf{F}} = \lambda M. \lambda x. \lambda \varphi. M(x, \lambda b. \varphi(\eta_{\mathbf{F}} b))$$
 
$$\mathsf{J}_{\mathbf{F}} = \lambda M. \lambda x. \lambda y. \mu_{\mathbf{F}} M(x,y)$$







#### Reductions

#### Reductions include the following:

- When two effects commute, we choose an order to apply them.
- We use UR instead of using MR or DNMR when possible.
- We always use modes J, C and DN as early as possible. The fact this works is a consequence of Theorem 3.1 on the denotation diagrams.
- All the rules provided in the previous section can be rewritten here too.





### **Conclusion**

We have formalised an enhancement of usual type systems for natural language semantics.

Thanks to the introduction of the string diagrams, this did not come at the cost of comprehension of the system nor efficiency.







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I would like to thank Simon Charlow for his advice, my mother for the knitting, Antoine Groudiev for the rotation of the snakes in equation labels, Bella Senturia, Bob Frank and Paul-André Melliès for their suggestions of papers to read about categories and linguistics.







#### **Functor Denotations**

Constructor	fmap	Typeclass
$\mathbf{G}\left(\tau\right) = \mathbf{r} \to \tau$	$\mathbf{G}\varphi\left(x\right)=\lambda r.\varphi\left(xr\right)$	Monad
$\mathbf{W}\left(  au  ight) =  au  imes \mathbf{t}$	$\mathbf{W}\varphi\left(\langle a,p\rangle\right)=\langle\varphi a,p\rangle$	Monad
$\mathbf{S}\left(\tau\right) = \left\{\tau\right\}$	$\mathrm{S}\varphi\left(\left\{ x\right\} \right)=\left\{ \varphi(x)\right\}$	Monad
$\mathbf{C}\left( au ight)=\left( au ightarrow\mathbf{t} ight) ightarrow\mathbf{t}$	$\mathbf{C}\varphi\left(x\right)=\lambda c.x\left(\lambda a.c\left(\varphi a\right)\right)$	Monad
$\mathbf{T}\left(\tau\right) = \mathbf{s} \to \left(\tau \times \mathbf{s}\right)$	$\mathrm{D}\varphi\left(\lambda s.\left\{\left\langle x,x+s\right\rangle  px\right\}\right)=\lambda s.\left\langle \varphi x,\varphi x+s\right\rangle$	Monad
$\mathbf{F}\left(\tau\right) = \tau \times \mathbf{S}\tau$	$\mathbf{F}\varphi\left(\left\langle v,\left\{ x x\in D_{e}\right\} \right\rangle\right)=\left\langle \varphi\left(v\right),\left\{ x x\in D_{e}\right\} \right\rangle$	Monad
$\mathbf{D}\left(\tau\right) = \mathbf{s} \to \mathbf{S}\left(\tau \times \mathbf{s}\right)$	$\mathrm{D}\varphi\left(\lambda s.\left\{\left\langle x,x+s\right\rangle  px\right\}\right)=\lambda s.\left\{\left\langle \varphi x,\varphi x+s\right\rangle  px\right\}$	Monad
$ extbf{M}( au) =  au + ot$	$\mathbf{M}\varphi\left(x\right) = \begin{cases} \varphi\left(x\right) & \text{if } \Gamma \vdash x : \tau \\ \# & \text{if } \Gamma \vdash x : \# \end{cases}$	Monad





## **CFG** of English

```
CP
    := DP, VP
                         NP ::= AdjP, NP
       Cmp, CP
                                NP, AdjP
       | CP, CBar
                         AdjP ::= TAdj, DP
CBar ::= Cor, CP
                                Deg, AdjP
Dbar ::= Cor, DP
                         VP
                             ::= TV, DP
                                 AV, CP
DP ::= DP, Dbar
                                 VP, AdvP
       Dmp, DP
        Det, NP
                         TV ::= DV, DP
        Gen, TN
                         AdvP ::= TAdv, DP
```

Gen

::= DP, GenD





#### **Combinator Denotations**

$$>= \lambda \varphi.\lambda x.\varphi x \\ <= \lambda x.\lambda \varphi.\varphi x \\ \mathsf{ML}_{F} = \lambda M.\lambda x.\lambda y.(\mathsf{fmap}_{F}\lambda a.M(a,y))x \\ \mathsf{MR}_{F} = \lambda M.\lambda x.\lambda y.(\mathsf{fmap}_{F}\lambda b.M(x,b))y \\ \mathsf{A}_{F} = \lambda M.\lambda x.\lambda y.(\mathsf{fmap}_{F}\lambda a.\lambda b.M(a,b))(x) <*>y \\ \mathsf{UL}_{F} = \lambda M.\lambda x.\lambda \varphi.M(x,\lambda b.\varphi(\eta_{F}b)) \\ \mathsf{UR}_{F} = \lambda M.\lambda \varphi.\lambda y.M(\lambda a.\varphi(\eta_{F}a),y) \\ \mathsf{J}_{F} = \lambda M.\lambda x.\lambda y.\mu_{F}M(x,y) \\ \mathsf{C}_{LR} = \lambda M.\lambda x.\lambda y.\varepsilon_{LR}(\mathsf{fmap}_{L}(\lambda l.\mathsf{fmap}_{R}(\lambda r.M(l,r))(y))(x)) \\ \mathsf{EL}_{R} = \lambda M.\lambda \varphi.\lambda y.M(\Upsilon_{R}\varphi,y) \\ \mathsf{ER}_{R} = \lambda M.\lambda x.\lambda \varphi.M(x,\Upsilon_{R}\varphi) \\ \mathsf{DN}_{\mathbb{L}} = \lambda M.\lambda x.\lambda y. \Downarrow M(x,y)$$