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# A Functional Language with Hypergraphs as First-Class Data

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### Overview

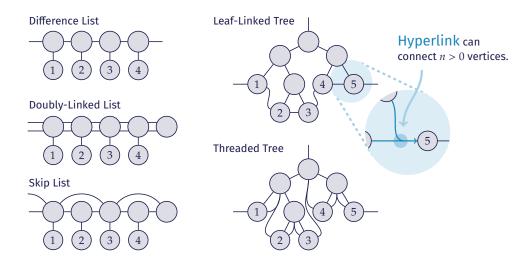
Imperative programmings with heaps and pointers are tedious and error-prone. E.g., Rust, C++, ....



We construct a new purely functional language  $\lambda_{GT}$ , which handles hypergraphs as immutable, first-class data with pattern matchings based on *Graph Transformation* and a new type system  $F_{GT}$ .

A Theoretical Foundation for the Next Generation Programming Language.

### Data Structures More Complex than Trees



There are several important data structures that are beyond trees: hypergraphs (= vertices + hyperlinks).

# How Programming Paradigms Handle Data Structures

#### **Imperative**

- ! Heaps and pointers
- × Impure
- Tedious and error-prone, and easily leads to significant security issues

#### **Purely Functional**

- ✓ Algebraic Data Types (trees)
- ✓ Pure
- ✓ Type system
- X Complex data structures are difficult to handle

### Graph Transformations<sup>1</sup>

- Graphs and pattern matchings on them
- × Impure

An EATCS Series. Springer, 2006.

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<sup>&</sup>lt;sup>1</sup>H. Ehrig et al. Fundamentals of Algebraic Graph Transformation. Monographs in Theoretical Computer Science.

# Our Proposing Language $\lambda_{GT}$ is ...

a functional language that extends Algebraic Data Types (trees) to hypergraphs.

- Hypergraphs as first-class data
- Pattern matchings on hypergraphs
- ✓ Pure
- First-class functions
- Type system

### **Our Contributions**

The main contributions of the thesis are threefold.

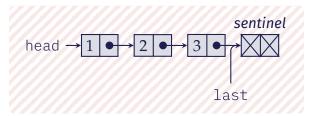
- Chapter 2 We investigate the properties of the proposed hypergraph transformation formalism, HyperLMNtal<sup>2</sup>.
- Chapter 3 We propose  $\lambda_{GT}$ , a purely functional language that handles data structures beyond Algebraic Data Types, and implemented a PoC.
- Chapter 4 We design a new type system  $F_{GT}$  for the  $\lambda_{GT}$  language.

Hereinafter, we may simply refer to hypergraphs as *graphs* and hyperlinks as *links*.

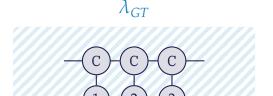
<sup>&</sup>lt;sup>2</sup>J. Sano et al. "Syntax-driven and compositional syntax and semantics of Hypergraph Transformation System". In: *Proc. 38th JSSST Annual Conference*. 2021.

### Example: Queues with Lists

### **Imperative**

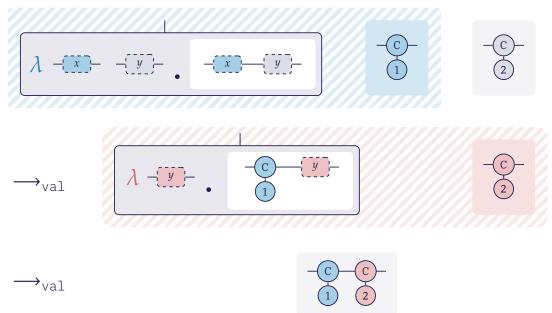


- × Requires a **dummy** sentinel node.
- Low-level, tedious operations without a guarantee of the shape.

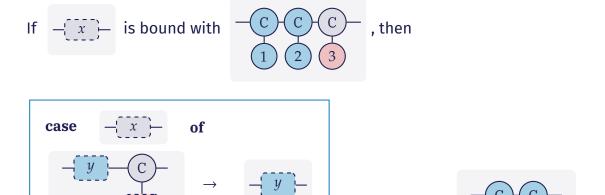


- Can define a difference list: a list with a link to the end.
- ✓ Declarative operations.
  - → Next slides

# Difference Lists Concatenation in $\lambda_{GT}$



# Pattern Matching Graphs



→<sub>val</sub>

Pop the last element of a difference list

otherwise

## Chapter 2: Syntax of Graphs in HyperLMNtal

For example, a difference list can be represented as

```
\nu Z.(
\nu Z_1.(Cons(Z_1, Z, X), 1(Z_1)),
\nu Z_2.(Cons(Z_2, Y, Z), 2(Z_2))
)
```

### Chapter 2: The Denoted Hypergraphs

We define the denoted hypergraphs and the mapping to them from HyperLMNtal terms, and prove that congruent terms are mapped to isomorphic graphs.

```
HyperLMNtal \nu Z.( \nu Z_1.(Cons (Z_1,Z,X),1(Z_1)), \nu Z_2.(Cons (Z_2,Y,Z),2(Z_2)) ) Equivalence is defined by Structural Congruence
```

```
The Denoted Hypergraph  \langle \{v_1,v_2\}, \langle \{X\}, \{\{X\}, \{Y\}\}, \\ \{X \mapsto \{\langle v_1,3\rangle\}, Y \mapsto \{\langle v_2,2\rangle\}\} \rangle, \\ \{\{\langle v_1,1\rangle, \langle v_2,1\rangle\}, \{\langle v_1,2\rangle, \langle v_3,3\rangle\}, \{\langle v_3,1\rangle, \langle v_4,1\rangle\}\}, \\ \{v_1 \mapsto \operatorname{Cons}, v_2 \mapsto 1, v_3 \mapsto \operatorname{Cons}, v_4 \mapsto 2\} \rangle  Equivalence is defined by Graph Isomorphism
```

Required for implementation justification and advanced verifications.

# Chapter 3: Syntax of $\lambda_{GT}$

```
Value G ::= \mathbf{0} \mid p(\vec{X}) \mid X \bowtie Y \mid (G,G) \mid \nu X.G

Atom Name p ::= C \mid \lambda x[\vec{X}].e

Expression e ::= (\mathbf{case} \ e \ \mathbf{of} \ T \rightarrow e \ | \ \mathbf{otherwise} \rightarrow e) \mid (e \ e) \mid T

Graph Template T ::= \mathbf{0} \mid p(\vec{X}) \mid X \bowtie Y \mid (T,T) \mid \nu X.T \mid x[\vec{X}]
```

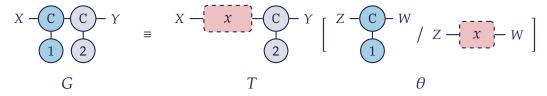
- $\checkmark$  Value in  $\lambda_{GT}$  is a graph in HyperLMNtal. We allow *Constructor* and  $\lambda$ -abstraction for the atoms' names.
- $\checkmark$   $\lambda_{GT}$  program is an expression.
- ✓ We use Template = Value + Wildcards for pattern matching.

Wildcard

### Chapter 3: Pattern Matching with Graph Substitution

$$\frac{G \equiv T\vec{\theta}}{(\mathbf{case} \ G \ \mathbf{of} \ T \to e_2 \mid \mathbf{otherwise} \to e_3) \longrightarrow_{\forall \mathtt{al}} e_2 \vec{\theta}} \ \mathsf{Rd\text{-}Case1}$$

For example,



Here, the graph G can be matched to the template T with a substitution  $\theta$ .

# Chapter 3: Reduction of $\lambda_{GT}$

$$\frac{G \equiv T\vec{\theta}}{(\mathbf{case} \ G \ \mathbf{of} \ T \to e_2 \ | \ \mathbf{otherwise} \to e_3) \longrightarrow_{\mathsf{val}} e_2 \vec{\theta}} \ \mathsf{Rd\text{-}Case1} \qquad \mathsf{Succeeded} \ \mathsf{matching}$$

$$\frac{\neg \exists \vec{\theta}. \left(G \equiv T \vec{\theta}\right)}{\left(\mathbf{case} \ G \ \mathbf{of} \ T \rightarrow e_2 \ | \ \mathbf{otherwise} \rightarrow e_3\right) \longrightarrow_{\mathsf{val}} e_3} \ \mathsf{Rd\text{-}Case2}$$
 Failed matching

$$\frac{fn(G) = \{\vec{X}\}}{((\lambda x [\vec{X}], e)(\vec{Y}) | G) \longrightarrow_{\text{vol}} e[G/x [\vec{X}]]} \text{Rd-}\beta \qquad \beta\text{-reduction}$$

$$\frac{e \longrightarrow_{\text{val}} e'}{E[e] \longrightarrow_{\text{val}} E[e']} \text{Rd-Ctx} \qquad \text{Call-by-value}$$

where 
$$E ::= [] \mid (\mathbf{case} \ E \ \mathbf{of} \ T \rightarrow e \mid \mathbf{otherwise} \rightarrow e) \mid (E \ e) \mid (G \ E) \mid T$$

### **Chapter 3: PoC Implementation**

We build a reference implementation of the language in only 500 lines of OCaml code.

```
Source https://github.com/sano-jin/lambda-gt-alpha
Try it at https://sano-jin.github.io/lambda-gt-online
```

We have run examples including ...

- Append two difference lists.
- Pop the last element of a difference list.
- Rotate a difference list (push an element to front from back).
- Pop all the elements from back of a difference list.
- Map a function on leaves of a leaf-linked tree.

## Chapter 4: $F_{GT}$ , a Type System for $\lambda_{GT}$

We propose a new type system,  $F_{GT}$ , for the  $\lambda_{GT}$  language.

The type in  $F_{GT}$  is a type atom  $\tau(\vec{X})$ :

 $\checkmark$  intuitively, a type in functional languages  $\tau$  + links  $\vec{X}$ .

The typing relation  $(\Gamma, P) \vdash e : \tau(\vec{X})$  denotes that e has the type  $\tau(\vec{X})$  under the type environment  $\Gamma \stackrel{\text{def}}{=} \{x[\vec{X}] : \tau(\vec{X}), \dots\}$  and a set P of production rules, a graph grammar:

an extension of a regular tree grammar, on which Algebraic Data Types (trees) are based.

## Chapter 4: Theorems of $F_{GT}$

We have proved some properties of  $F_{GT}$ .

Theorem 4.1 Soundness of  $F_{GT}$ .

Theorem 4.2 Correspondence between a typing relation in  $F_{GT}$  and a transitive closure of HyperLMNtal reduction.

This allows us to take advantage of existing research of Graph Transformations<sup>3</sup>.

<sup>&</sup>lt;sup>3</sup>P. Fradet et al. "Structured Gamma". In: *Science of Computer Programming* 31.2 (1998), pp. 263–289; P. Fradet et al. "Shape types". In: *Proc. POPL*'97. ACM. 1997, pp. 27–39; H. Björklund et al. "Uniform parsing for hyperedge replacement grammars". In: *J. Computer and System Sciences* 118 (2021), pp. 1–27.

### Related Work includes ...

FUnCAL<sup>4</sup> is a functional language which supports graph-based database. They focus on a simple form of queries for the database, which is apart from our focus.

Structured Gamma<sup>5</sup> and Shape Types<sup>6</sup> provide a typing framework using graph grammar for graph transformation system applicable to verify imperative programs.

Separation Logic<sup>7</sup> is a verification framework for imperative programs with heaps and pointers, which includes Cyclic Proof<sup>8</sup> and SLRD<sup>9</sup>.

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<sup>&</sup>lt;sup>4</sup>K. Matsuda et al. "A Functional Reformulation of UnCAL Graph-Transformations: Or, Graph Transformation as Graph Reduction". In: *Proc. POPL*'97. Paris, France: ACM, 2017, pp. 71–82.

<sup>&</sup>lt;sup>5</sup>Fradet et al., "Structured Gamma".

<sup>&</sup>lt;sup>6</sup>Fradet et al., "Shape types".

<sup>&</sup>lt;sup>7</sup>J. Reynolds. "Separation logic: a logic for shared mutable data structures". In: *Proc. LICS* 2002. IEEE. 2002, pp. 55–74.

<sup>&</sup>lt;sup>8</sup>J. Brotherston et al. "A Generic Cyclic Theorem Prover". In: *Proc. APLAS 2012*. Vol. 7705. Lecture Notes in Computer Science. Springer, 2012, pp. 350–367.

<sup>&</sup>lt;sup>9</sup>R. losif et al. "The Tree Width of Separation Logic with Recursive Definitions". In: *Automated Deduction – CADE-24*. 2013, pp. 21–38.

### Summary and Future Work

#### We introduced ...

- ✓ HyperLMNtal: a hypergraph transformation formalism,
- $\checkmark$   $\lambda_{GT}$ : a new functional language with hypergraphs as first-class data, and
- $\checkmark$   $F_{GT}$ : a new type system for the  $\lambda_{GT}$  language.

Artifact: https://github.com/sano-jin/lambda-gt-alpha

#### Future work includes ...

- more investigations on HyperLMNtal properties,
- the justification of the PoC, the construction of an efficient compiler, and
- $\checkmark$  more advanced verifications on  $F_{GT}$ .

### **Publications**

- J. Sano et al. "Syntax-driven and compositional syntax and semantics of Hypergraph Transformation System". In: Proc. 38th JSSST Annual Conference. 2021. Unrefereed. Student encouragement award.
- 2. J. Sano et al. "A functional language with graphs as first-class data". In: *Proc. 39th JSSST Annual Conference*. 2022. Unrefereed. **Presentation award**.
- 3. J. Sano et al. "Type Checking Data Structures More Complex Than Trees". In: Journal of Information Processing and IPSJ Transactions on Programming (2023). Accepted.
- 4. J. Sano et al. "Axiomatizing Hypergraph Isomorphism". In: Special Interest Group on Programming and Programming Language. 2023. Accepted.

# **Appendix**

**Related Work** 

HyperLMNtal

Lambda GT

**FGT** 

### Related Implementations

	Implemented with	LOC
$\lambda_{GT}$ Reference Interpreter	OCaml	500
GP 2 Reference Interpreter <sup>10</sup>	Haskell	1,000
HyperLMNtal Compiler/Runtime <sup>11</sup>	Java/C++	12,000/47,000

https://github.com/lmntal/slim. (Visited on 08/10/2022); M. Gocho et al. "Evolution of the LMNtal Runtime to a Parallel Model Checker". In: *Computer Software* 28.4 (2011), 4\_137-4\_157.

<sup>&</sup>lt;sup>10</sup>C. Bak et al. "A Reference Interpreter for the Graph Programming Language GP 2". In: *Proceedings Graphs as Models, GaM@ETAPS 2015, London, UK, 11-12 April 2015.* Ed. by A. Rensink et al. Vol. 181. EPTCS. 2015, pp. 48–64.

<sup>&</sup>lt;sup>11</sup>LMNtal. https://github.com/lmntal/lmntal-compiler. (Visited on 08/10/2022); SLIM.

# **Appendix**

Related Work

**HyperLMNtal** 

Lambda GT

**FGT** 

### Free Names and Substitutions of Hyperlinks

Links bound by  $\nu$  are called *Local Links* and others are called *Free Links* 

```
\nu Z.(
\nu Z_1.(Cons(Z_1, Z, X), 1(Z_1)),
\nu Z_2.(Cons(Z_2, Y, Z), 2(Z_2))
)
```

- fn(G) denotes the set of all free links in G
- $G(\vec{Y}/\vec{X})$  replaces all free occurrences of  $\vec{X}$  with  $\vec{Y}$ .

The notion of locality of (link) names is NOT common in graph formalisms but in the formalisms for PLs;  $\lambda$ -calculus,  $\pi$ -calculus, ...

## Structural Congruence: Axioms of Graph Equivalences

```
(E1)
                      (\mathbf{0},G) \equiv G
                                                                                 \nu Z.(
(E2)
                   (G_1, G_2) \equiv (G_2, G_1)
          (G_1, (G_2, G_3)) \equiv ((G_1, G_2), G_3)
(E3)
(E4)
                  G_1 \equiv G_2 \quad \Rightarrow \quad (G_1, G_3) \equiv (G_2, G_3)
(E5)
                   G_1 \equiv G_2 \implies \nu X.G_1 \equiv \nu X.G_2
(E6)
          \nu X.(X \bowtie Y, G) \equiv \nu X.G\langle Y/X \rangle
          where X \in fn(G) \lor Y \in fn(G)
                                                                                 \nu Z.(
(E7)
          \nu X.\nu Y.X \bowtie Y \equiv \mathbf{0}
(E8)
                       \nu X.0 \equiv 0
                 \nu X.\nu Y.G \equiv \nu Y.\nu X.G
(E9)
(E10)
              \nu X.(G_1, G_2) \equiv (\nu X.G_1, G_2)
          where X \notin fn(G_2)
```

```
For example,
    \nu Z_1.(Cons(Z_1, Z, X), 1(Z_1)),
    \nu Z_2.(\text{Cons}(Z_2, Y, Z), 2(Z_2))
    \nu Z_1.(1(Z_1), \text{Cons}(Z_1, Z, X)),
    \nu Z_2.(Cons(Z_2, Y, Z), 2(Z_2))
by (E2), (E4) and (E5)
```

Notice the rules are defined compositionally.

### **Fusion**

### **Structural Congruence**

(E6) 
$$\nu X.(X \bowtie Y, G) \equiv \nu X.G\langle Y/X \rangle$$
  
where  $X \in fn(G) \lor Y \in fn(G)$ 

$$\nu WZ.(W \bowtie X, \operatorname{Cons}(Z, Y, W), 1(Z))$$
  $X - \bowtie - \bigcup_{W} C - Y$ 

$$\equiv \nu WZ.(Cons(Z, Y, X), 1(Z)) \qquad X \qquad C \qquad Y$$

# **Appendix**

Related Work

HyperLMNtal

Lambda GT

**FGT** 

### **Graph Template**

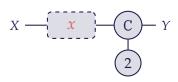
### **Graph Template**

```
T ::= \mathbf{0} \mid p(\vec{X}) \mid X \bowtie Y \mid (T,T) \mid \nu X.T\mid x[\vec{X}] \quad \text{Graph context} \quad \text{wildcard in pattern matching; variable}
```

Since the value in  $\lambda_{GT}$  is Graph, we use *Template* of graphs to represent data with variables.

### For example,

```
\nu Z.(
x[Z, X],
\nu Z_2.(Cons(Z_2, Y, Z), 2(Z_2))
```



### **Graph Substitution**

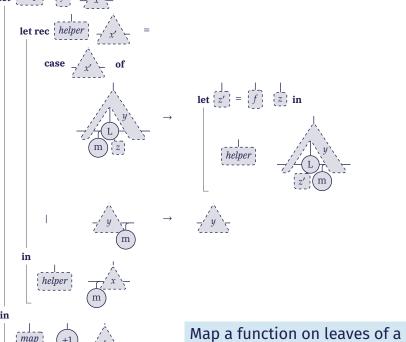
We define capture-avoiding substitution  $\theta$  of a graph context  $x[\vec{X}]$  with a template T in e, written  $e[T/x[\vec{X}]]$ .

The definition is standard except for the graph contexts.

$$(x[\vec{X}])[T/y[\vec{Y}]] =$$
  
if  $x/|\vec{X}| = y/|\vec{Y}|$  then  $T\langle \vec{X}/\vec{Y} \rangle$  reconnect free links  
else  $x[\vec{X}]$ 

For example,

$$X - \begin{bmatrix} x \\ C \end{bmatrix} - C - Y \begin{bmatrix} Z - C - W \\ 1 \end{bmatrix} / Z - \begin{bmatrix} x \\ C \end{bmatrix} + W \end{bmatrix} = X - C - C - Y$$



Map a function on leaves of a leaf-linked tree. 30/19

# **Appendix**

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HyperLMNtal

Lambda GT

**FGT** 

# Chapter 4: Syntax of $F_{GT}$

The type in  $F_{GT}$  is a type atom  $\tau(\vec{X})$  where ...

Atom Name for Types 
$$au ::= \alpha \mid \tau(\vec{X}) \to \tau(\vec{X})$$
  
Production Rule  $r ::= \alpha(\vec{X}) \longrightarrow \mathcal{T}$   
Type Graph  $\mathcal{T} ::= \tau(\vec{X}) \mid C(\vec{X}) \mid X \bowtie Y \mid (\mathcal{T}, \mathcal{T}) \mid \nu X.\mathcal{T}$ 

For example, the production rules of difference lists are:

$$X - dlist - Y \quad dlist(Y, X) \longrightarrow X \bowtie Y$$
  $X - Y \longrightarrow Y$  
$$| vZ_1.vZ_2.((Cons(Z_1, Z_2, X), X - C) - dlist - Y)$$
 
$$| int(Z_1)), dlist(Y, Z_2)) \qquad int$$

## Rules of $F_{GT}$ $\langle 1/2 \rangle$ : Typing Rules as in Functional Languages

• These are basically the same as the type system of the other ordinary functional languages, except that **the type in F\_{GT} is an atom**.

$$\frac{(\Gamma,P) \vdash e_1 : (\tau_1(\vec{X}) \to \tau_2(\vec{Y}))(\vec{Z}) \qquad (\Gamma,P) \vdash e_2 : \tau_1(\vec{X})}{(\Gamma,P) \vdash (e_1 \ e_2) : \tau_2(\vec{Y})} \text{ Ty-App}$$

$$\frac{((\Gamma,x[\vec{X}] : \tau_1(\vec{X})), P) \vdash e : \tau_2(\vec{Z})}{(\Gamma,P) \vdash (\lambda \ x[\vec{X}] : \tau_1(\vec{Y}).e)(\vec{W}) : (\tau_1(\vec{Y}) \to \tau_2(\vec{Z}))(\vec{W})} \text{ Ty-Arrow}$$

$$\frac{(\Gamma,P) \vdash (\lambda \ x[\vec{X}] : \tau(\vec{Y}), P) \vdash x[\vec{X}] : \tau(\vec{Y})}{(\Gamma,P) \vdash e_1 : \tau_1(\vec{X}) \qquad ((\Gamma,\Gamma'^*),P) \vdash e_2 : \tau_2(\vec{Y})} \text{ Ty-Var}$$

$$\frac{(\Gamma,P) \vdash e_1 : \tau_1(\vec{X}) \qquad ((\Gamma,\Gamma'^*),P) \vdash e_2 : \tau_2(\vec{Y}) \qquad (\Gamma,P) \vdash e_3 : \tau_2(\vec{Y})}{(\Gamma,P) \vdash (\mathbf{case} \ e_1 \ \mathbf{of} \ T \to e_2 \ | \ \mathbf{otherwise} \to e_3) : \tau_2(\vec{Y})} \text{ Ty-Case}$$

<sup>\*</sup> We gave a detailed explanation of  $\Gamma'$  in the paper.

### Rules of $F_{GT}$ $\langle 2/2 \rangle$ : Typing Rules for Graphs

$$\frac{(\Gamma,P) \vdash T : \tau\left(\overrightarrow{X}\right) \qquad T \equiv T'}{(\Gamma,P) \vdash T' : \tau\left(\overrightarrow{X}\right)} \text{ Ty-Cong}$$
 
$$\frac{(\Gamma,P) \vdash T : \tau\left(\overrightarrow{X}\right)}{(\Gamma,P) \vdash T\langle Z/Y \rangle : \tau\left(\overrightarrow{X}\right)\langle Z/Y \rangle} \text{ Ty-Alpha}$$

where  $Z \notin fn(T)$ 

$$\frac{(\Gamma,P) \vdash T_1 : \tau_1(\overrightarrow{X_1}) \quad \dots \quad (\Gamma,P) \vdash T_n : \tau_n(\overrightarrow{X_n})}{(\Gamma,P\{\alpha(\overrightarrow{X})\longrightarrow \mathscr{T}\}) \vdash \mathscr{T} \left[T_1/\tau_1(\overrightarrow{X_1}),\dots,T_n/\tau_n(\overrightarrow{X_n})\right] : \alpha(\overrightarrow{X})} \text{ Ty-Prod}$$

where  $au_i(\overrightarrow{X_i})$  are all the type variable or arrow atoms appearing in  ${\mathscr T}$ 

### Ty-Prod Example

$$\frac{(\Gamma,P) \vdash T_1 : \tau_1(\overrightarrow{X_1}) \quad \dots \quad (\Gamma,P) \vdash T_n : \tau_n(\overrightarrow{X_n})}{(\Gamma,P\{\alpha(\overrightarrow{X})\longrightarrow \mathscr{T}\}) \vdash \mathscr{T}\left[T_1/\tau_1(\overrightarrow{X_1}),\dots,T_n/\tau_n(\overrightarrow{X_n})\right] : \alpha(\overrightarrow{X})} \text{ Ty-Prod}$$

where  $au_i(\overrightarrow{X_i})$  are all the type variable or arrow atoms appearing in  ${\mathscr T}$ 

$$nodes(Y, X) \longrightarrow \nu Z_1.\nu Z_2.(Cons(Z_1, Z_2, X), nat(Z_1), nodes(Y, Z_2)) \cdots r_2$$

### the Ty-Prod is

$$\frac{(\Gamma, P) \vdash T_1 : nat(Z_1) \qquad (\Gamma, P) \vdash T_2 : nodes(Y, Z_2)}{(\Gamma, P\{P_2\}) \vdash}$$
 Ty-Prod 
$$vZ_1.vZ_2.(Cons(Z_1, Z_2, X), nat(Z_1), nodes(Y, Z_2))[T_1/nat(Z_1), T_2/nodes(Y, Z_2)]$$
 
$$= vZ_1.vZ_2.(Cons(Z_1, Z_2, X), T_1, T_2) : nodes(Y, X)$$

### Example: Typing a Difference List

$$({n[Z_1] : nat(Z_1)}, {r_1, r_2}) \vdash Cons(n, Y, X) : nodes(Y, X)$$

where  $r_1$  and  $r_2$  are the followings.

$$nodes(Y, X) \longrightarrow X \bowtie Y$$
  
 $nodes(Y, X) \longrightarrow Cons(nat, nodes(Y), X)$ 

can be shown as follows.

$$\frac{1}{(\Gamma,P\{r_1\})\vdash X\bowtie Y:nodes(Y,X)} \text{Ty-Prod}}{(\Gamma,P\{r_2\})\vdash T':nodes(Y,X)} \text{Ty-Prod}} \text{Ty-Alpha}$$

$$\frac{(\Gamma,P\{r_2\})\vdash T':nodes(Y,X)}{(\Gamma,P)\vdash T:nodes(Y,X)} \text{ where } T'=\nu Z_1Z_2.(\text{Cons}(Z_1,Z_2,X),n[Z_1],Z_2\bowtie Y)} \text{Ty-Prod}}{(\Gamma,P)\vdash T:nodes(Y,X)} \text{Ty-Cong}$$