

# A Model-Theoretic Framework for Grammaticality Judgements

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# Foreword

- ungrammatical utterances are an everyday phenomenon
- some utterances are more ungrammatical than others
- JP Prost's PhD thesis [2008]

## **contributions:**

- model-theoretic semantics for property grammars
- loose models for quasi-expressions
- scoring functions for comparative judgements of admissibility

# Outline

- 1 Graded Grammaticality
- 2 Property Grammars
  - Strong Semantics
  - Loose Semantics
- 3 Modeling Judgements of Acceptability
  - Postulates
  - Weighted Property Grammars
  - Numerical Models of Acceptability

# Sentences of decreasing acceptability

- 1 Les employés ont rendu un rapport très complet à leur employeur [100%]  
*The employees have sent a report very complete to their employer*
- 2 Les employés ont rendu rapport très complet à leur employeur [92.5%]  
*The employees have sent report very complete to their employer*
- 3 Les employés ont rendu un rapport très complet à [67.5%]  
*The employees have sent a report very complete to*
- 4 Les employés un rapport très complet à leur employeur [32.5%]  
*The employees a report very complete to their employer*
- 5 Les employés un rapport très complet à [5%]  
*The employees a report very complete to their employer*

# Gradience

We are interested in two questions: given an expression or a quasi-expression:

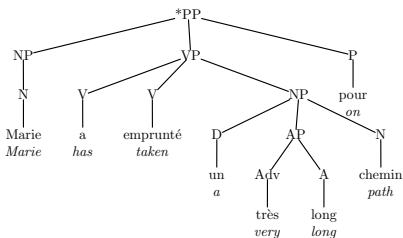
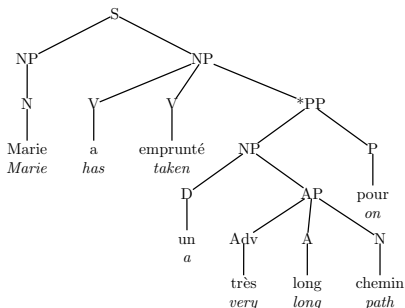
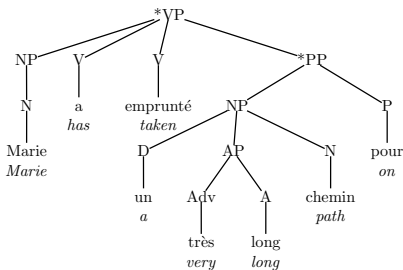
- what is the best (quasi-)analysis for it?
- how grammatical is it?

Bas Aarts [2007]:

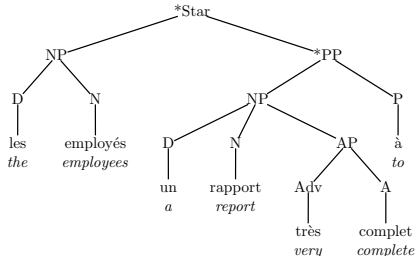
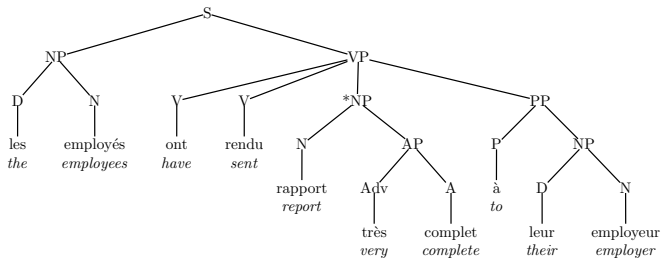
- intersective gradience (classification)
- subsective gradience (prototypicality)

Examples: bat, penguin

# Possible models for a quasi-expression



# Models for related quasi-expressions



## (some) Formal options

GES/MTS (Pullum&Scholtz [2001], Pullum [2007])

- GES: ill-suited
- MTS:
  - grammar = constraint
  - defined in terms of satisfaction (open to violations)
  - compatible with degrees of ungrammaticality

OT (Prince&Smolensky [1993])

- grammaticality = optimality
- cannot distinguish between expressions and quasi-expressions



# Property grammars

(Blache [2001])

## Property Grammars

Property Grammars are the transposition of phrase structure grammars from the GES perspective into the MTS perspective

# Production rules as constraints

$$\text{NP} \rightarrow \text{D N}$$

- GES: rewrite rule
- MTS: constraint
  - satisfied in a tree iff satisfied at every node
  - satisfied at a node iff: **either** the node is not labeled with NP, **or** it has exactly 2 children, the 1st labeled with D, the 2nd labeled with N

# Model-theoretic semantics for CFG

A CFG is a set of production rules (1 per non-terminal; use alternation where necessary)

- class of models: trees labeled with categories
- a tree is a model of the grammar iff every rule is satisfied at every node
- $\alpha \rightarrow \beta_1 \dots \beta_n$  is satisfied at a node iff: either the node does not have category  $\alpha$ , or it has a sequence of exactly  $n$  children labeled respectively  $\beta_1$  through  $\beta_n$

# Coarse-grained constraints

$NP \rightarrow D N$

For a NP there must be:

- (1) a D child
- (2) only one
- (3) a N child
- (4) only one
- (5) nothing else
- (6) the D child must precede the N child

# Properties

obligation	$A : \triangle B$	at least one $B$ child
uniqueness	$A : B!$	at most one $B$ child
linearity	$A : B \prec C$	a $B$ child precedes a $C$ child
requirement	$A : B \Rightarrow C$	if there is a $B$ child, then also a $C$ child
exclusion	$A : B \not\Rightarrow C$	$B$ and $C$ children are mutually exclusive
constituency	$A : S?$	the category of any child must be one in $S$

## Fine-grained constraints

$NP \rightarrow D N$

becomes:

- |                        |                                        |
|------------------------|----------------------------------------|
| (1) $NP : \triangle D$ | (a D child)                            |
| (2) $NP : D!$          | (only one)                             |
| (3) $NP : \triangle N$ | (a N child)                            |
| (4) $NP : N!$          | (only one)                             |
| (5) $NP : \{D, N\}?$   | (nothing else)                         |
| (6) $NP : D \prec N$   | (the D child must precede the N child) |

which can be independently violated

# Property Grammar for French

S (Utterance)	
obligation :	$\Delta VP$
uniqueness :	NP!
	: VP!
linearity :	NP $\prec$ VP
dependency :	NP $\rightsquigarrow$ VP

AP (Adjective Phrase)	
obligation :	$\Delta(A \vee V_{[past\ part]})$
uniqueness :	A!
	: $V_{[past\ part]}$ !
	: Adv!
linearity :	A $\prec$ PP
	: Adv $\prec$ A
exclusion :	A $\not\rightsquigarrow V_{[past\ part]}$

PP (Propositional Phrase)	
obligation :	$\Delta P$
uniqueness :	P!
	: NP!
linearity :	P $\prec$ NP
	: P $\prec$ VP
requirement :	P $\Rightarrow$ NP
dependency :	P $\rightsquigarrow$ NP

NP (Noun Phrase)					
obligation :	$\Delta(N \vee Pro)$				
uniqueness :	D!				
	: N!				
	: PP!				
	: Pro!				
linearity :	D $\prec$ N				
	: D $\prec$ Pro				
	: D $\prec$ AP				
	: N $\prec$ PP				
requirement :	N $\Rightarrow$ D				
	: AP $\Rightarrow$ N				
exclusion :	N $\not\rightsquigarrow$ Pro				
dependency :	N $\rightsquigarrow$ D				
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VP (Verb Phrase)									
obligation :	$\Delta V$								
uniqueness :	$V_{[main\ past\ part]}$ !								
	: NP!								
	: PP!								
linearity :	V $\prec$ NP								
	: V $\prec$ Adv								
	: V $\prec$ PP								
requirement :	$V_{[past\ part]} \Rightarrow V_{[aux]}$								
exclusion :	$Pro_{[acc]} \not\rightsquigarrow NP$								
	: $Pro_{[dat]} \not\rightsquigarrow Pro_{[acc]}$								
dependency :	V $\rightsquigarrow$ Pro								
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# Formal definition of property grammars

$\mathcal{L}$  a finite set of labels,  $\mathcal{S}$  a finite set of strings

$$\begin{aligned} \mathcal{P}_{\mathcal{L}} = \{ & c_0 : c_1 \prec c_2, \\ & c_0 : \Delta c_1, \\ & c_0 : c_1!, \\ & c_0 : c_1 \Rightarrow c_2, \\ & c_0 : c_1 \not\Rightarrow c_2, \\ & c_0 : s_1? \mid \forall c_0, c_1, c_2 \in \mathcal{L}, \forall s_1 \subseteq \mathcal{L} \} \end{aligned}$$

## Property grammar

$$G = (P_G, L_G) \quad P_G \subseteq \mathcal{P}_{\mathcal{L}} \quad L_G \subseteq \mathcal{L} \times \mathcal{S}$$



# Semantics of PG by interpretation over *syntax tree structures*

syntax tree  $\tau = (D_\tau, L_\tau, R_\tau)$

- tree domain  $D_\tau$
- labeling function  $L_\tau : D_\tau \rightarrow \mathcal{L}$
- realization function  $R_\tau : D_\tau \rightarrow \mathcal{S}^*$

tree domain

a finite subset of  $\mathbb{N}_0^*$  closed for prefixes and for left-siblings,  
where  $\mathbb{N}_0 = \mathbb{N} \setminus \{0\}$

arity

$$A_\tau(\pi) = \max \{0\} \cup \{i \in \mathbb{N}_0 \mid \pi i \in D_\tau\}$$

# Instances of Properties

Every property in  $P_G$  must be checked at every node in  $D_\tau$  and for all possible choices among its children.

$$\mathcal{I}_\tau[G] = \cup\{\mathcal{I}_\tau[p] \mid \forall p \in P_G\}$$

$$\mathcal{I}_\tau[c_0 : c_1 \prec c_2] = \{(c_0 : c_1 \prec c_2) \circ \langle \pi, \pi i, \pi j \rangle \mid \forall \pi, \pi i, \pi j \in D_\tau, i \neq j\}$$

$$\mathcal{I}_\tau[c_0 : \Delta c_1] = \{(c_0 : \Delta c_1) \circ \langle \pi \rangle \mid \forall \pi \in D_\tau\}$$

$$\mathcal{I}_\tau[c_0 : c_1!] = \{(c_0 : c_1!) \circ \langle \pi, \pi i, \pi j \rangle \mid \forall \pi, \pi i, \pi j \in D_\tau, i \neq j\}$$

$$\mathcal{I}_\tau[c_0 : c_1 \Rightarrow s_2] = \{(c_0 : c_1 \Rightarrow s_2) \circ \langle \pi, \pi i, \pi j \rangle \mid \forall \pi, \pi i, \pi j \in D_\tau, i \neq j\}$$

$$\mathcal{I}_\tau[c_0 : c_1 \not\Rightarrow c_2] = \{(c_0 : c_1 \not\Rightarrow c_2) \circ \langle \pi, \pi i, \pi j \rangle \mid \forall \pi, \pi i, \pi j \in D_\tau, i \neq j\}$$

$$\mathcal{I}_\tau[c_0 : s_1?] = \{(c_0 : s_1?) \circ \langle \pi, \pi i \rangle \mid \forall \pi, \pi i \in D_\tau\}$$

# Pertinence

$$P_\tau((c_0 : c_1 \prec c_2) @ \langle \pi, \pi i, \pi j \rangle) \equiv L_\tau(\pi) = c_0 \wedge L_\tau(\pi i) = c_1 \wedge L_\tau(\pi j) = c_2$$

$$P_\tau((c_0 : \Delta c_1) @ \langle \pi \rangle) \equiv L_\tau(\pi) = c_0$$

$$P_\tau((c_0 : c_1!) @ \langle \pi, \pi i, \pi j \rangle) \equiv L_\tau(\pi) = c_0 \wedge L_\tau(\pi i) = c_1 \wedge L_\tau(\pi j) = c_1$$

$$P_\tau((c_0 : c_1 \Rightarrow s_2) @ \langle \pi, \pi i, \pi j \rangle) \equiv L_\tau(\pi) = c_0 \wedge L_\tau(\pi i) = c_1$$

$$P_\tau((c_0 : c_1 \not\Rightarrow c_2) @ \langle \pi, \pi i, \pi j \rangle) \equiv L_\tau(\pi) = c_0 \wedge (L_\tau(\pi i) = c_1 \vee L_\tau(\pi j) = c_2)$$

$$P_\tau((c_0 : s_1?) @ \langle \pi, \pi i \rangle) \equiv L_\tau(\pi) = c_0$$

# Satisfaction

$$\begin{aligned}
 S_{\tau}((c_0 : c_1 < c_2) @ \langle \pi, \pi i, \pi j \rangle) &\equiv i < j \\
 S_{\tau}((c_0 : \Delta c_1) @ \langle \pi \rangle) &\equiv \bigvee \{ L_{\tau}(\pi i) = c_1 \mid 1 \leq i \leq A_{\tau}(\pi) \} \\
 S_{\tau}((c_0 : c_1!) @ \langle \pi, \pi i, \pi j \rangle) &\equiv i = j \\
 S_{\tau}((c_0 : c_1 \Rightarrow s_2) @ \langle \pi, \pi i, \pi j \rangle) &\equiv L_{\tau}(\pi j) \in s_2 \\
 S_{\tau}((c_0 : c_1 \not\Rightarrow c_2) @ \langle \pi, \pi i, \pi j \rangle) &\equiv L_{\tau}(\pi i) \neq c_1 \vee L_{\tau}(\pi j) \neq c_2 \\
 S_{\tau}((c_0 : s_1?) @ \langle \pi, \pi i \rangle) &\equiv L_{\tau}(\pi i) \in s_1
 \end{aligned}$$

# Admissibility

A syntax tree  $\tau$  is admissible iff it satisfies the *projection property*, i.e.  $\forall \pi \in D_\tau$ :

$$A_\tau(\pi) = 0 \quad \Rightarrow \quad \langle L_\tau(\pi), R_\tau(\pi) \rangle \in L_G$$
$$A_\tau(\pi) \neq 0 \quad \Rightarrow \quad R_\tau(\pi) = \sum_{i=1}^{i=A_\tau(\pi)} R_\tau(\pi i)$$

$\mathcal{A}_G =$  admissible syntax trees for grammar  $G$

# Strong Models

$$I_{G,\tau}^0 = \{r \in \mathcal{I}_\tau[G] \mid P_\tau(r)\}$$

$$I_{G,\tau}^+ = \{r \in I_{G,\tau}^0 \mid S_\tau(r)\}$$

$$I_{G,\tau}^- = \{r \in I_{G,\tau}^0 \mid \neg S_\tau(r)\}$$

$$\tau : \sigma \models G$$

a syntax tree  $\tau$  is a strong model of property grammar  $G$ , with realization  $\sigma$ , iff it is admissible with  $R_\tau(\varepsilon) = \sigma$ , and  $I_{G,\tau}^- = \emptyset$

# Loose Semantics

loose admissibility for utterance  $\sigma$

$$\mathcal{A}_{G,\sigma} = \{\tau \in \mathcal{A}_G \mid R_\tau(\epsilon) = \sigma\}$$

fitness

$$F_{G,\tau} = I_{G,\tau}^+ / I_{G,\tau}^0$$

loose models

$$\tau : \sigma \approx G \quad \text{iff} \quad \tau \in \underset{\tau' \in \mathcal{A}_{G,\sigma}}{\operatorname{argmax}}(F_{G,\tau'})$$

# Postulates

- Failure cumulativity
- Success cumulativity
- Constraint weighting
- Constructional complexity
- Propagation



# Weighted Property Grammar

**weighted property grammar**  $G = (P_G, L_G, \omega_G)$ :

- $(P_G, L_G)$  is a property grammar
- $\omega_G : P_G \rightarrow \mathbb{R}$  assigns a weight to each property

# Instance location

We write  $\text{at}(r)$  for the node where property instance  $r$  applies.

$\forall p \in \mathcal{P}_{\mathcal{L}}, \forall \pi_0, \pi_1, \pi_2 \in \mathbb{N}_0^*$ :

$$\text{at}(p@ \langle \pi_0 \rangle) = \pi_0$$

$$\text{at}(p@ \langle \pi_0, \pi_1 \rangle) = \pi_0$$

$$\text{at}(p@ \langle \pi_0, \pi_1, \pi_2 \rangle) = \pi_0$$

## Sets of instances at node $\pi$

If  $B$  is a set of instances, then  $B|_{\pi}$  is the subset of  $B$  of all instances applying at node  $\pi$ :

$$B|_{\pi} = \{r \in B \mid \text{at}(r) = \pi\}$$

The sets of instances pertinent, satisfied, and violated at node  $\pi$ :

$$I_{G,\tau,\pi}^0 = I_{G,\tau}^0|_{\pi} \quad I_{G,\tau,\pi}^+ = I_{G,\tau}^+|_{\pi} \quad I_{G,\tau,\pi}^- = I_{G,\tau}^-|_{\pi}$$

# Cumulative weights at node $\pi$

cumulative weights of pertinent, satisfied, and violated instances at node  $\pi$ :

$$W_{G,\tau,\pi}^0 = \sum \{\omega_G(x) \mid \forall x@y \in I_{G,\tau,\pi}^0\}$$

$$W_{G,\tau,\pi}^+ = \sum \{\omega_G(x) \mid \forall x@y \in I_{G,\tau,\pi}^+\}$$

$$W_{G,\tau,\pi}^- = \sum \{\omega_G(x) \mid \forall x@y \in I_{G,\tau,\pi}^-\}$$

# Scoring factors

quality index, satisfaction ratio, and violation ratio at node  $\pi$ :

$$W_{G,\tau,\pi} = \frac{W_{G,\tau,\pi}^+ - W_{G,\tau,\pi}^-}{W_{G,\tau,\pi}^+ + W_{G,\tau,\pi}^-} \quad \rho_{G,\tau,\pi}^+ = \frac{|I_{G,\tau,\pi}^+|}{|I_{G,\tau,\pi}^0|} \quad \rho_{G,\tau,\pi}^- = \frac{|I_{G,\tau,\pi}^-|}{|I_{G,\tau,\pi}^0|}$$

# Scoring factors

to account for constructional complexity:

$$T_{G,\tau,\pi} = \{c : C \in P_G \mid L_\tau(\pi) = c\}$$

completeness index:

$$C_{G,\tau,\pi} = \frac{|I_{G,\tau,\pi}^0|}{|T_{G,\tau,\pi}|}$$

# Index of grammaticality

index of precision:

$$P_{G,\tau,\pi} = kW_{G,\tau,\pi} + l\rho_{G,\tau,\pi}^+ + mC_{G,\tau,\pi}$$

index of grammaticality:

$$g_{G,\tau,\pi} = \begin{cases} P_{G,\tau,\pi} \cdot \frac{1}{A_\tau(\pi)} \sum_{i=1}^{A_\tau(\pi)} g_{G,\tau,\pi i} & \text{if } A_\tau(\pi) \neq 0 \\ 1 & \text{if } A_\tau(\pi) = 0 \end{cases}$$

$g_{G,\tau,\varepsilon}$  is the score of loose model  $\tau$

# Index of coherence

index of anti-precision:

$$A_{G,\tau,\pi} = kW_{G,\tau,\pi} - l\rho_{G,\tau,\pi}^- + mC_{G,\tau,\pi}$$

index of coherence:

$$\gamma_{G,\tau,\pi} = \begin{cases} A_{G,\tau,\pi} \cdot \frac{1}{A_\tau(\pi)} \sum_{i=1}^{A_\tau(\pi)} \gamma_{G,\tau,\pi i} & \text{if } A_\tau(\pi) \neq 0 \\ 1 & \text{if } A_\tau(\pi) = 0 \end{cases}$$

$\gamma_{G,\tau,\pi}$  is the score of loose model  $\tau$



# Conclusion

Property grammars are well-suited to the task of modeling graded grammaticality.

- model-theoretic *strong* semantics
- analyzing quasi-expressions:
  - loose models
  - fitness score to determine optimal loose models
- comparing relative admissibility of quasi-expression variants:
  - scoring functions
  - Prost [2008] has shown that these functions can be tuned to agree well with human judgements