Fundamental Concepts Reference: How does the mapping between form and meaning work? Does it Compositionality: How are complex utterances built from smaller units? Are they built from smaller units at all? Combinatorial structure: a small number of meaningless building blocks (phonemes, parts of syllables) combined into an

unlimited set of utterances (words and

Compositional structure: meaningful buil-

ding blocks (words and morphemes) are

combined into larger meaningful utteran-

 $-log_2p(x)$: the more frequent the word,

the lower its information content. e.g. the

word type "blue" occurs ca. 3750 times

in 10000 tokens, and its information con-

tent is $-log_2(3750/10000) \approx 1.42$ bits.

ces (phrases and sentences)

Information Content (Surprisal)

2 Information Theory

Hilfszettel zur Klausur von Tim S., Seite 1 von 2

Extensions: real-world situations they refer to. Frege's Generalization: The extension of is the set of possible cases [situations] of

Why formal logic? overcome ambigui-

Shannon Entropy $H(X) = -\sum p(x)log_2p(x)$: entropy as probability, the average information content of information encoding units in the language. Measure of information encoding

lation problem

Mutual Information

Joint

potential of a symbol system. The higher the uncertainty, the larger the entropy. e.g. $H_{char}(Morse) = -(\frac{86}{136} * log_2(\frac{86}{136}) +$ $\frac{50}{136} * log_2(\frac{50}{136})) \approx 0.949$ bits per charac-Joint Entropy, Conditional Entropy

H(X,Y)

$-\sum \sum p(x,y)log_2p(x,y)$ Conditional Entropy: H(Y|X) = $-\sum p(x)\sum p(y|x)log_2p(y|x)$ The more ambiguity in language (uncertainty), the

Entropy:

Probability Estimation Maximum Likelihood (ML) Problems: unit problem, sample size problem, interdependence problem, extrapo-

Methods: frequency-based, language mo-

I(X;Y) = H(X) - H(X|Y) = H(Y) - H(Y|X)

reduction in the uncertainty of X given Y.

compromise between minimum learning

cost H(Y) and maximum expliciteness

determinism of human utterances.

dels, experiments with humans

higher conditional entropy. No ambiguity

ture the main structural building blocks of sentences. Introduce quantifiers to al-

Entropy is the upper bound on the mutual information between forms and mea-Is the entropy rate zero? -> asymptotic

connectives: \neg , \land , \lor , \rightarrow , ... quantifiers: \forall , \exists round brackets (), equal sign =

Proposition: The meaning of a simple declarative sentence

Syntax: Recursive Definition

of L are formulas in L.

steps is a formula in L.

invalid: $\neg(\neg\neg p)$, $\neg((p \land q))$

 $(\neg(p \lor q) \to \neg \neg q) (iii. \to)$

3 Propositional Logic

cursive system.

Definition

a sentence S is its truth value The proposition expressed by a sentence which that sentence is true. propositional variables: p, q, r... propositional operators: \neg , conjunction \land , disjunction \lor , $\hat{X}OR$, \rightarrow

(ii) If ϕ is a formula in L, then $\neg \phi$ is too. (iii) If ϕ and ψ are formulas in L, then $(\phi \land \psi), (\phi \lor \psi), (\phi \to \psi), (\phi \leftrightarrow \psi)$ are too. (iv) Only that which can be generated by

the clauses (i)-(iii) in a finite number of

(i) Propositional letters in the vocabulary

Construction Trees $(\neg(p \lor q) \to \neg \neg q) \leftrightarrow r (iii. \leftrightarrow)$

 $\neg (p \lor q) (ii)$

 $p \vee q$ (iii. \vee)

4 Predicate Logic Introduce constants and variables representing invididuals and predicates to cap-

 $\neg q$ (ii)

low for quantified statements. Definition constant symbols: a, b, c, ... variable symbols: x, y, z, ...

n-ary/n-place predicate symbols: A, B, C, reflect relations between n elements

tv. determine relationships between meavocabulary of L, and each of t1,..., tn is a 2nd-order predicate constants: A, B, C constant or a variable in the vocabulary e.g. AX: X is a property with the property nings of sentences, determine meanings of L, then At1,..., tn is a formula in L. of setences, model compositionality, reof being an animal (ii) If ϕ is a formula in L, then $\neg \phi$ is too. **Syntax: Recursive Definition** (i) If A is an n-ary first-order predicate

(i) If A is an n-ary predicate letter in the

Syntax: Recursive Definition

(iii) If ϕ and ψ are formulas in L, then $(\phi \land \psi), (\phi \lor \psi), (\phi \to \psi), (\phi \leftrightarrow \psi)$ are too. (iv) If ϕ is a formula in L and x is a variable, then $\forall x \phi$ and $\exists x \phi$ is too. (v) Only that which can be generated by the clauformula in L.

ses (i)-(iv) in a finite number of steps is a invalid: $a, A, \forall (Axy)$ **Construction Trees** $\forall_x \forall_y ((A_{xy} \land B_y) \to \exists_x A_{xb}) \ (iv. \forall)$

 $\forall_v ((A_{xv} \land B_v) \rightarrow \exists_x A_{xh}) (iv. \forall)$ $(A_{xv} \wedge B_v) \rightarrow \exists_x A_{xb} \ (iii. \rightarrow)$ riable, then $\forall x \phi$ and $\exists x \phi$ is too. $A_{xv} \wedge B_v (iii.\wedge) \quad \exists_x A_{xh} (iv.\exists)$ ble, and ϕ is a formula in L, then $\forall X \phi$ and $\exists X \phi$ is too. A_{xv} (i) B_v (i) (viiii) Only that which can be generated by the clauses (i)-(vii) in a finite number Semantics of steps is a formula in L. domain (D): set of entities

interpretation functions $I = \{ < m, e >, < \}$ s, e > < v, e >, I(m) = e, I(s) = e, I(v) = e. model M: consists of a domain D and an interpretation function I which conforms

to: (i) if c is a constant in L, then $I(c) \in D$

(ii) if B is an n-ary prpedicate letter in L,

then $I(B) \subset D$

valuation function V_M :

 $\langle I(a1),...,I(an) \rangle \in I(A)$.

Formula vs. Sentence

5 Second-Order Logic

free variables.

 $Ax \rightarrow \exists y By$

Tools to get to grips with frequent compositional structures in natural language (adj-n, adv-v, art-n, prep-np... combis), a If Aa1,...,an is an atomic sentence higher-order logic in L, then $V_M(Aa1,...,an) = 1$ iff **Definition**

If $V_M(\phi) = 1$, then ϕ is said to be true in **Functional Application** If $\alpha = \langle e, t \rangle$ and $\beta = e$ then $\alpha(\beta) = t$. If $\alpha = \langle t, \langle t, e \rangle$ and $\beta = \langle t, e \rangle$ then $\alpha(\beta)$ is A sentence is a formula in L which lacks not defined.

Sentence: Aa, $\forall x(Fx), \forall x(Ax \rightarrow \exists yBy)$ Not a sentence (but Formula): Ax, Fx,

e.g. CR (CX: X is a predicate with the property of being a color; Rx: x is red) <e,<e,t>» $\exists X(CX \land Xm)$: Mars has a color. $\exists X(Xi \land Xp)$: John has at least one thing <e,<e,<e,t>> in common with Peter. NP (e.g. the dog): e $\forall x (\exists X ((AX \land Xx) \land Jx) \rightarrow \exists Y (Yx \land CY)):$ All animals that live in the jungle have a

At1,..., tn is an (atomic) formula in L. **Syntax: Recursive Definition** (ii) If X is a [first-order] predicate varia-(i) If α is a variable or a constant of type ble and t is an individual term (both cona in L, then α is an expression of type a stants and variables) in L, then Xt is an atomic formula in L; (ii) If α is an expression of type $\langle a,b \rangle$ in (iii) If A is an n-ary second-order predica-L, and β is an expression of type a in L, te letter/constant in L, and T1,...,Tn are first-order unary predicate constants, or predicate variables, in L, then AT1,...,Tn is an (atomic) formula in L;

Vocabulary extention

invalid: x, X, Xab, $\forall (Xa)$

a set of a set of entities.

(ii) if $a, b \in T$, then $\langle a, b \rangle \in T$

the basis of clauses (i) and (ii).

invalid: et, $\langle e,e,t \rangle$, $\langle e,\langle e,t \rangle$

just as a 1st-order predicate denotes a set

of entities, a 2nd-order predicate denotes

(iii) nothing is an element of T except on

Semantics

(i) $e, t \in T$

Semantic Types

adjectives: <e,t>

individual: e

sentences: t

6 Type theory

1st-order predicate variables: X, Y, Z

letter in the vocabulary of L, and each of

t1,..., tn are individual terms in L, then

then $(\alpha(\beta))$ is an expression of type b in (iv) If ϕ is a formula in L, then $\neg \phi$ is too. (v) If ϕ and ψ are formulas in L, then $(\phi \wedge \psi), (\phi \vee \psi), (\phi \rightarrow \psi), (\phi \leftrightarrow \psi)$ are too. (vii) If ϕ is a formula in L and x is a va-(viii) If X is a [first-order] predicate varia-

(iii) If ϕ and ψ are formulas in L, then so are $\neg \phi$, $(\phi \land \psi)$, $(\phi \lor \psi)$, $(\phi \to \psi)$, $(\phi \leftrightarrow \psi)$. (iv) If ϕ is an expression of type t in L and v is a variable (of arbitrary type a), then $\forall v \phi$ and $\exists v \phi$ are expression of type t in (v) If α and beta are expressions in L which belong to the same type, then ($\alpha =$ β) is an expression of type t in L. (vi) Every expression L is to be construc-

adjectives as predicate modifiers(e.g.

adverbs(predicate modifier): «e,t>,<e,t»

function(entity to entity) (e.g. the farther

1-place 2nd-order predicate: «e,t>,t>

2nd-order

ted by means of (i)-(v) in a finite number

Type-theoretic logic: (B(m))(j) or alterna-

formulas: expressions of type t.

Difference to Predicate Logic:

Jumbo befriends Maya.

Predicate Logic: Bjm

predicate:

sentence modifier(e.g. not): <t,t>

happy dog): «e,t>,<e,t»

of): <e, e>

 $\langle e,t\rangle,\langle e,t\rangle,t\rangle$

2-place

Semantics Truth valuations via pariticular interpretation functions defined for different types of expressions. e.g. interpretation function I for which it holds that: I(W)(d)

= 1 iff $d \in W$, otherwise 0. 7 Lambda Calculus

language

Syntax

tively B(m)(j)

of steps.

To represent parts of sentences or predicates in a fully compositional account.

Allows to capture the compositionality of

Add another clause to the type-theoretic language syntax

(vii) If α is an expression of type a in L, and v is a variable of type b, then $\lambda v(\alpha)$ is an expression of type <b, a> in L.

Lambda-Abstraction

We say that $\lambda v(\alpha)$ has been formed from

α by abstraction over the formerly free

variable v. Hence, the free occurrences of

1-place predicates (intransitive verb):

2-place predicates (transitive verb): v in α are now bound by the λ -operator

3-place predicates (ditransitive verb): e.g. expression: S(x) of type t

 λ -abstraction: $\lambda x(S(x))$ of type <e,t>

common nouns (e.g. dog): <e,t>

 $\lambda x(x)$ of type <e,e> determiners (e.g. the): <e,<e,t» $\lambda x(B(y)(x))$ of type <e,t> $\lambda X(X(a) \wedge X(b))$ of type «e,t>,t>

Hilfszettel zur Klausur von Tim S., Seite 2 von 2

Lambda-Conversion

remove the λ -operator and plug an expression into every occurrence of the variable which is bound by the λ -operator.

e.g. $\lambda x(S(x))(c) = S(c)$ $\lambda x(\lambda y(A(y)(x)))(c)(d) = \lambda y(A(y)(c))(d) = A(d)(c)$ λ -conversion is only valid when vairable v is not bound by a quantifier \forall or \exists

Modelling Compositionality

John smokes: $\lambda x(S(x))(j)=S(j)$

smokes: $\lambda x(S(x))$

smokes and drinks: $\lambda x(S(x) \wedge D(x))$ Jumbo

is grey: $\lambda x(G(x))(j)=G(j)$

is grey: $\lambda x(G(x))$ Jumbo is: $\lambda X(X(j))$

is: $\lambda X(\lambda x(X(x)))$

Truth Valuation

For all entities d in the domain D it holds that h(d)=1 iff I(W)(d)=1. This illustrates that the denotation if $\lambda x(W(x))$ is indeed the same as one would expect for just the word walks represented by W.