

Signature Σ (Func, Pred)
= abzählbares ω Set

Func + arity

0: Konstanten
n: Terme

→ liefern Werte aus Domain zurück

Pred + arity

Für Atom

→ liefern T/F zurück

Σ_1 -Terme (Σ, Var)

B1: $\forall \text{ elem} \in Var = \Sigma_1$ -Term

B2: $\forall cs \in Func \Sigma_1 = \Sigma_1$ -Term

S1: $\forall fs \in Func \in \Sigma$ mit Σ_1 -Termen als

Param = Σ_1 -Term

$\neq$ OFS (Σ, Var)

B1: $\forall \text{ atom s} = \Sigma_1$ -Formulas

B2: $T \ \& \ \perp = \Sigma_1$ -Formulas

S1: $\varphi_1 \ \& \ \varphi_2 = \Sigma_1$ -Formulas
→ $\varphi_1, \varphi_2 \in \{ \rightarrow, \Leftarrow, \wedge, \vee, \oplus, \neg \}$
= Σ_1 -Formulas

S2: $x \in Var \ \& \ \varphi = \Sigma_1$ -Formulas

→ $\forall x \ \varphi \ \& \ \exists x \ \varphi = \Sigma_1$ -Formulas

Begriffe

Klausel

= $\perp$ $\vee$ Literal
Leere {Klausel}
Leere $\wedge$

$\perp$ Leere Klausel

$\vee$ Leere {Literals}

Atom

= Wahrheitswert,
PLO
Prädikat
PLA

Literal

= Atom, $\neg$ Atom

Ground
= ohne Var.

Prädikatenlogik 1. Ordnung SYNTAX

PLO

BV = set of boolean vars
B1: $\forall p \in BV = \text{formula}$

B2: $T \ \& \ \perp = \text{formula}$

S1: $\varphi = \text{formula} \rightarrow \neg \varphi = \text{formula}$

S2: $\varphi_1, \varphi_2 = \text{formulas}$
→ $\varphi_1 \ \& \ \varphi_2 \quad \varphi_1 \ \vee \ \varphi_2 \quad \varphi_1 \ \rightarrow \ \varphi_2$

Formel

Geschlossen
keine freie
vars

Offen

$\forall x, x \in Var : x = \text{frei} \neq$
 $x = \text{gebunden}$
 $\forall$ Quantor bindet $\wedge$ Var

Variablen

frei

→ nicht an Quantor gebunden, ~~Konstante~~
⇒ $\neq$ free - Param

gebunden

ge gebunden durch Quantor ($\forall, \exists$)

Σ -Struktur $\mathcal{I}$
= Interpretation $\langle \mathcal{U}, I, \alpha \rangle$

Nicht leere Menge von Sym.
= Domain

= Interpret. fkt bildet auf D.
ab
Erfüllt:
• $c \in \mathcal{C}S : I(c) \in \mathcal{U}$
• $f \in \mathcal{F}S : I(f) : \mathcal{U}^n \rightarrow \mathcal{U}$
• $p \in \mathcal{P}S : I(p) \subseteq \mathcal{U}^n$

Variablenbelegung

Erfüllbarkeit, ek. $\text{Mod}(\varphi)$

$\mathcal{I}(\varphi)$	
1	$\mathcal{I} = \text{model of } \varphi \rightarrow \text{satisfiable}$ OR $\neg \varphi$ not valid
0	$\mathcal{I}$ falsible $\rightarrow \varphi$ falsible
valid	$\forall \mathcal{I}(\varphi) = 1$ or $(\neg \varphi)$ unsat $ \varphi \equiv \top$
unsat.	$\forall \mathcal{I}(\varphi) = 0$ $ \varphi \equiv \perp$
Äquivalent:	
$\varphi \equiv \gamma$	$\text{iff } \text{Mod}(\varphi) \equiv \text{Mod}(\gamma)$
$\Rightarrow \forall \mathcal{I} \in \Sigma : \mathcal{I} \models \varphi \Leftrightarrow \mathcal{I} \models \gamma$	

All four statements in each line amount the same

entailment(s)	validity	satisfiability	equivalence
$\varphi \models \psi$	$\varphi \rightarrow \psi$ valid	$\varphi \wedge \neg \psi$ unsat	$(\varphi \rightarrow \psi) \equiv \top$
$\top \models \psi$	ψ valid	$\neg \psi$ unsat	$\psi \equiv \top$
$\top \not\models \neg \psi$	$\neg \psi$ not valid	ψ sat	$\neg \psi \not\equiv \top$
$\varphi \models \psi$ and $\psi \models \varphi$	$\varphi \leftrightarrow \psi$ valid	$\varphi \leftrightarrow \neg \psi$ unsat	$\varphi \equiv \psi$

Evaluierung

Term (Σ, Var)

t in $\mathcal{I} \langle \mathcal{U}, I, \alpha \rangle$
B1: $x \in \text{Var} : \mathcal{I}(x) = \alpha(x)$
B2: $c \in \mathcal{C}S : \mathcal{I}(c) = I(c)$
S1: $f \in \mathcal{F}S : \mathcal{I}(f) = \mathcal{I}(\text{Term})$
= $\mathcal{I}(f(t_1, \dots, t_n))$
= $I(f)(\mathcal{I}(t_1), \dots, \mathcal{I}(t_n))$

FOFS(Σ -Formel)

clean eval for in $\mathcal{I} \langle \mathcal{U}, I, \alpha \rangle$
B1: $p \in \mathcal{P}S : \mathcal{I}(p) = 1 \Leftrightarrow \mathcal{I}(p(t_1, \dots, t_n))$
S1: $\neg : \mathcal{I}(\neg \varphi) = 1 - \mathcal{I}(\varphi)$
S2: $\forall : \mathcal{I}(\forall x \varphi) = \min_{c \in \mathcal{U}} \mathcal{I}(\varphi)$
S3: $\exists : \mathcal{I}(\exists x \varphi) = \max_{c \in \mathcal{U}} \mathcal{I}(\varphi)$
 $K = \{ \mathcal{I}(\varphi(y)) \mid \mathcal{I} = \mathcal{I}_1, \dots, \mathcal{I}_n \}$

Entailment

Let W be a set of closed formulas
 $\rightarrow$ Then W entails φ ($W \models \varphi$)
iff $\text{Mod}(W) \subseteq \text{Mod}(\varphi)$

Entailment (or logical implication)

- So far, $\models$ relates a Σ -structure and a formula.
- We want to allow a set of formulas on the left side.
- Important: a (finite) set of formulas coincides with the conjunction of its elements, i.e., $\{\varphi_1, \dots, \varphi_n\}$ is $\bigwedge_{i=1}^n \varphi_i$.
- Important: an empty conjunction is 1 in all Σ -structures i.e., it is equivalent to $\top$.

Definition

Let W be a set of closed formulas. Then W entails φ ,
 $W \models \varphi$ if and only if $\text{Mod}(W) \subseteq \text{Mod}(\varphi)$

Entailment is a very important concept when we consider KBSs!

Reduction to satisfiability

Reduce validity, entailment, equivalence to satisfiability

- Validity
 - $\neg \varphi$ is unsatisfiable iff φ is valid
- Entailment
 - φ entails ψ ($\varphi \models \psi$) iff $\varphi \rightarrow \psi$ is valid (apply Deduction Thm)
 - Hence, $\varphi \models \psi$ iff $\varphi \wedge \neg \psi$ (i.e., $\neg(\varphi \rightarrow \psi)$) is unsatisfiable
- Equivalence
 - φ is equivalent to ψ ($\varphi \equiv \psi$) iff $\varphi \leftrightarrow \psi$ is valid
 - Hence, $\varphi \equiv \psi$ iff $\varphi \models \psi$ and $\psi \models \varphi$ hold
 - Consequently, $\varphi \equiv \psi$ iff $\varphi \wedge \neg \psi$ and $\psi \wedge \neg \varphi$ are unsatisfiable

Sound and complete procedure for satisfiability is sufficient!

ERL
Let I be an interpretation
& $I \models \psi_1 \Leftrightarrow \psi_2$
Then $I \models \phi[\psi_1] \Leftrightarrow \phi[\psi_2]$

ERT
Let $\psi_1 \equiv \psi_2$
Then $\phi[\psi_1] \equiv \phi[\psi_2]$

Basics of the NNF translation for PL1

Perform the following 4 steps:

1. Replace all $\leftrightarrow$ by $\rightarrow$ using $(\varphi \leftrightarrow \psi) \equiv ((\varphi \rightarrow \psi) \wedge (\psi \rightarrow \varphi))$
2. Replace all $\oplus$ using $(\varphi \oplus \psi) \equiv ((\varphi \vee \psi) \wedge (\neg\varphi \vee \neg\psi))$ (why?)
3. Replace all $\rightarrow$ using $(\varphi \rightarrow \psi) \equiv (\neg\varphi \vee \psi)$
4. Replace the left side of the following equivalences by the right side (order does not matter!)

$$\begin{array}{ll}
 \neg\neg\varphi \equiv \exists x\neg\varphi & \neg\exists x\varphi \equiv \forall x\neg\varphi \\
 \neg(\varphi \vee \psi) \equiv \neg\varphi \wedge \neg\psi & \neg(\varphi \wedge \psi) \equiv \neg\varphi \vee \neg\psi \\
 \varphi \vee \top \equiv \top & \top \vee \varphi \equiv \top \\
 \varphi \wedge \perp \equiv \perp & \perp \wedge \varphi \equiv \perp \\
 \varphi \wedge \top \equiv \varphi & \top \wedge \varphi \equiv \varphi \\
 \varphi \vee \perp \equiv \varphi & \perp \vee \varphi \equiv \varphi \\
 \neg\neg\varphi \equiv \varphi &
 \end{array}$$

- Quantifier rules are conceptually simple, but sufficient for our purpose later
- For first-order theorem proving, advanced quantifier rules are widely used which use **Skolem functions** in general
- Additionally, usually **free variable tableaux** are used which use **unification** in order to determine the term t
- The use of sophisticated quantifier rules and unification result in better/faster implementation because some problems wrt permutability of inferences are avoided

TC1

Soundness
 $\varphi \models \text{FoFs in NNF}$
 $\varphi \models \text{TC1 for } \varphi \rightarrow \varphi$ **unset**

Non-termination
 φ **set**
 $\rightarrow$ Does NOT terminate in GENERAL
 φ **unset**
 $\rightarrow$ Terminates

Model
 if branch **completed**
 $\rightarrow$ there is a **model**

If a model satisfies a universally quantified formula, it also satisfies the formula (without the quantifier), where the former quantified (and now free) variable is substituted with some (**ground**) term. The prescription is to use terms which occur in the tableau.

$$\frac{\forall x \varphi}{\varphi\{x \leftarrow t\}}$$

If a model satisfies an existentially quantified formula $\exists x \varphi$, then it also satisfies the formula $\varphi\{x \leftarrow a\}$, where the former quantified (and now free) variable is substituted with a **fresh** new **Skolem** constant.

$$\frac{\exists x \varphi}{\varphi\{x \leftarrow a\}}$$

This rule can be applied if φ and ψ are **not both** is on the current branch

$$\frac{\varphi \wedge \psi}{\varphi \quad \psi}$$

This rule can be applied if **neither** φ **nor** ψ on the current branch

$$\frac{\varphi \vee \psi}{\varphi \quad \psi}$$

This rule can be applied if $\varphi\{x \leftarrow b\}$ (for a Skolem constant b) is **not** on the current branch

$$\frac{\exists x \varphi}{\varphi\{x \leftarrow a\}}$$

- Applicability conditions prevent redundant rule applications
- For the $\forall$ -rule, **no restriction** can be given in general!

Prädikatenlogik
 1. Ordnung

Adjectives and nouns

- Formalize “*Programming is fun.*”
- Possibility 1: *programming(fun)*
- Possibility 2: *fun(programming)*
- Which one should be preferred in many cases?
It's the second possibility!

Translate adjectives to predicates and nouns to argument terms!

Pronouns

- How do we deal with pronouns, i.e., (s)he, it, nothing, etc.?
- Formalize “*Sue adores Pat who adores her.*”
- Restating it yields “*Sue adores Pat and Pat adores Sue.*”
- The formula is: $\text{adore}(\text{sue}, \text{pat}) \wedge \text{adore}(\text{pat}, \text{sue})$
- Formalize “*Nothing is striped.*”
- Restating it yields
“*There does not exist anything which is striped.*”
- The formula is: $\neg \exists x \text{striped}(x)$

Pronouns and connectives

- Formalize “*Something is spotted and it is hungry.*”
- Can we translate the two substatements independently?
- No, *it* refers to *something*, i.e., the variable introduced for *something* must be “*global*”
- Therefore, the structure is $\exists x(x \text{ is spotted and } x \text{ is hungry})$
- The formula is: $\exists x(\text{spotted}(x) \wedge \text{hungry}(x))$

If pronouns are linked across a connective, deal with the pronouns before the connective.

- Example: Give a PL1 formula for the following
“*Every child is younger than its mother.*”

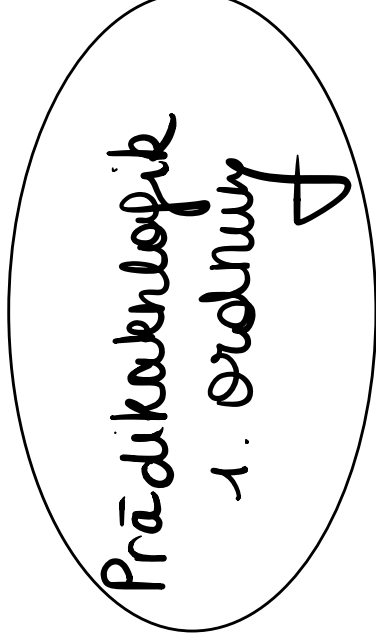
- We use the following predicates:

- x is a child: $\text{child}(x)$
- y is the mother of x : $\text{mother}(y, x)$

- We choose the formula:

$$\forall x \forall y ((\text{child}(x) \wedge \text{mother}(y, x)) \rightarrow \text{younger}(x, y))$$

- Is this a “good” formal spec of what we want to express?
- No, our formalization does not take into account that every kid has **exactly one** genetic mother



- The formalization becomes more concise with a FS
- Take the term $m(x)$ to denote the *mother of* x
- Then the above statement can be formalized as:

$$\forall x (\text{child}(x) \rightarrow \text{younger}(x, m(x)))$$

- Clarify **always** the “type” of a symbol you use
- m has to be (and is) a FS, **not a PS**
- Recall the syntax of PL1! Only terms are allowed at argument positions of terms and predicates

Use equality

- Formalize the statement:

“*Andy and Paul have the same maternal grandmother.*”

- Use the **equality predicate** $=/2$ (written infix as usual)
- A possible formula expressing this statement is

$$\forall x \forall y \forall u \forall v (\text{mother}(x, y) \wedge \text{mother}(y, \text{andy}) \wedge \text{mother}(u, v) \wedge \text{mother}(v, \text{paul}) \rightarrow x = u)$$

- Looks complicated! Can we formalize it simpler?
- Using equality and functions often makes life easier:

$$m(m(\text{andy})) = m(m(\text{paul}))$$

is much simpler than the formula above



Interlude: The equality relation

- The **equality relation** $=$ is a binary predicate of the form $=(s, t)$ (usually written infix $s = t$)
- The relation satisfies the following properties:
 - reflexivity: $\forall x (x = x)$
 - symmetry: $\forall x \forall y (x = y \rightarrow y = x)$
 - transitivity: $\forall x \forall y \forall z ((x = y \wedge y = z) \rightarrow x = z)$
- Two possibilities to deal with equality in KBS:
 1. Equip the inference procedure with rules for equality
 2. Compile properties into the KB (i.e., into the formula)

Qualifiers and exceptions

- Formalize the statement:
"All instructors except John like PCs"
- First establish the overall structure, ...
 All (instructors except John) likes(x, pc)
- ... then formulate the sort information correctly

$$\forall x ((inst(x) \wedge x \neq john) \rightarrow likes(x, pc))$$
- Clearly, $x \neq john$ stands for $\neg(x = john)$
- Formalize *"All rational people abhor violence."*
- Reformulate with qualifier: $\forall$ rational x (x abhor violence)
- *Rational* is a qualifier (type, sort) for x
- Then the formula is $\forall x (rational(x) \rightarrow abhor(x, violence))$

Qualification is translated into an **implication** $\rightarrow$, if the corresponding quantifier is $\forall$.

$\exists$ -quantifiers and qualifiers again

- Formalize *"Sue likes somebody who likes logic."*
- Reformulate: $\exists$ (person who likes logic) x (Sue likes x)
- Formula is $\exists x (person(x) \wedge likes(x, logic) \wedge likes(sue, x))$
- Pronoun *who* links the substatements conjunctively

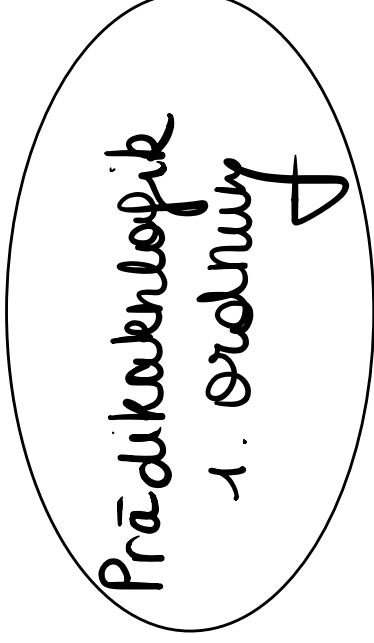
Get the structure of the sentence correct before dealing with quantifiers.

Qualification is translated into a **conjunction** $\wedge$, if the corresponding quantifier is $\exists$.

Pitfalls of quantifier alternations

- Formalization of *"Everybody has a (genetic) mother."* is

$$\forall x \exists y mother(y, x)$$
- You first "fix" the x and then asks for x 's mother
- The mother therefore **depends on the chosen x !**
- With $\exists y \forall x mother(y, x)$...
 ■ you first "fix" the mother y and then
 ■ state that everybody has the fixed y as the mother
- The result is: *"Somebody is mother of everybody."*



Implications and quantifiers

- $\forall$ formalize words like *all, every, any, everything*, etc.
- $\exists$ formalize words like *some, someone, something*, etc.
- Formalize
"If someone is tall, then the door frame will be knocked."
- Formula is $(\exists x tall(x) \rightarrow knocked(doorframe))$
- This is equivalent to $\forall x (tall(x) \rightarrow knocked(doorframe))$
- Formalize *"If someone is tall, then he will bump his head."*
- Here, we have to deal with the quantifier first because the pronoun *he* is linked to *someone*
- Hence, the formula is $\forall x (tall(x) \rightarrow bumphead(x))$

Classical logic vs Commonsense Logic

monoton	monoton
$\forall S, S' \& A: (S \models A) \wedge (S \subseteq S') \rightarrow S' \models A$	weniger strikte reasoning patterns ("hypothetically") → muss conclusion später vlt ändern, wenn mehr info dazu kommt
Brauche komplette Infos	
Implizites Wissen → Explizite Wissen	

Formalisieren

2 Methoden, um mit nicht kompletter/unkommener Information umzugehen

Quantitativ
Probability Theory

Qualitativ
Non-monotonic reasoning

→ Computational approach: ASP

CWA

= Methode zur effizienten "representation" von negativen Fakten
→ nur positive Information wird gespeichert.

Jeder Fakt, d. nicht abgeleitet werden kann → false

CWA = komplex

⇒ complete Theory adding facts

$CWA(T) = \{ \varphi \mid T \cup T_{asm} \models \varphi, \varphi \not\models T \}$
 $= Cn(T \cup T_{asm})$

$T_{asm} = \{ \neg p \mid p \text{ ground atom}, T \models p \}$

→ CWA is logical closure of assumptions

Definitionen

- Theorie: Set von $\square$ Formeln
- complete Theory
T complete IFF $\forall$ ground atom $P \leq P \leq T$
- Deduktiver Schluss:
 $Cn(T) = \{ \varphi \mid T \models \varphi \& \varphi \in \square \}$
 > Inflationary: $T \subseteq Cn(T)$
 > Idempotenz: $Cn(Cn(T)) = Cn(T)$
 > Monotonicity: $T \subseteq T' \rightarrow Cn(T) \subseteq Cn(T')$
 > valid formulas: $Cn(\emptyset) (\neq \emptyset!)$
 $Cn(T) = \text{set of } \forall \text{ formulas IFF } T \text{ inkonsistent}$
 $\varphi \in Cn(T) \rightarrow Cn(T \cup \{ \varphi \}) = Cn(T)$

freie vars

- Consistency theory T
 $CWA(T) = \text{constant} - IFF$
 ground atoms $p_1, \dots, p_n$
 s.t. $T \models p_1 \vee \dots \vee p_n$
 BUT: $T \not\models p_i \quad i \in \{1, \dots, n\}$
- Definite Horn Klausel (= $num \mid \emptyset$)
 $T = \text{set of DHK} \rightarrow CWA(T) = \text{constant}$
- Domain Closure axiom $DC(A)$
 kann verwenden, um set von Konstanten zu restriktieren
 $DC(A) : \forall x (x = c_1 \vee \dots \vee x = c_n)$

Non-monotonic Reasoning

- CWA relative to a predicate symbol (PS) $q \implies$ application of the CWA only to predicates containing the PS q .
 Formally:
 $T_{asm}^q = \{ \neg p \mid p \text{ ground atom with PS } q, T \models p \}$
 $CWA^q(T) = \{ \varphi \mid T \cup T_{asm}^q \models \varphi, \varphi \text{ closed} \} = Cn(T \cup T_{asm}^q)$
- CWA relative to a set $\{q_1, \dots, q_n\}$ of predicate symbols
 $\implies CWA(q_1, \dots, q_n)(T)$ similarly defined

Default logic

circumcription

modal nm logic

Regeln (Cauc & Default)

= Inference regel

$$\delta = \frac{\varphi : \psi_1, \dots, \psi_n}{\varphi}$$

perquisit

$\psi_1, \dots, \psi_n$ justification
 ψ ... Konsequenzen

Normal

$$\frac{\varphi : \varphi}{\varphi}$$

→ immer E

Wenn φ bekannt
 & $\forall \psi \in \{\psi_1, \dots, \psi_n\}$
 konsistent angenommen
 angenommen werden
 können, dann kann
 χ gefolgert werden

Default Theorie

$$T = (W, \Delta)$$

Set Δ FOFs
 Premissen
 → sicher, aber
 kann
 unvollständig
 sein

= Defaults
 Plausible
 Schlüsse

wende
 Δ auf
 W an

neues
 Wissen

Baric

- = Methode, um mit $\exists$ inf. & Annahmen umzugehen
- Repräsentieren Fakten, typischerweise halber (Abgeleitet durch Default Regeln)
- D.R. erweiterte klassische Inferenzregeln durch konsistente Konklusionen
- Wissensbasis = D.T.

Default Logik

K.L.L.
 K.K.K.

Δ DT

Δ DT
 → Grounding

$T = (W, \Delta)$, $S = \Delta$ FOFs
 Γ_T = collection von $\forall$ s.t. Γ_T FOFs, d. folg. Properties erfüllen
 ① $\Gamma_T(\Gamma) = \Gamma$
 ② $W \subseteq \Gamma$
 ③ Γ abgeschlossen im relativen Kontext
 $\Rightarrow \Gamma_T(S) = \bigcap \{ \Gamma \mid S \subseteq \Gamma \}$
 Durchschnit v. Mengen, die ①-③ erfüllen

E von T IFF
 $\Gamma_T(E) = E$

$\forall \delta = \frac{\varphi : \psi_1, \dots, \psi_n}{\varphi}$
 IF $\varphi \in E$ & $\forall \psi_i \in S$
 THEN $\chi \in E$

Kontext $E = E$ von T IFF
 reproduziert itself

Computing extensions

Determining the operator Γ_T for $T = (W, \Delta)$:

1. Classical reduct Δ_E :

- $\Delta_E := \{ \varphi / \chi \mid (\varphi : \psi_1, \dots, \psi_n / \chi) \in \Delta \text{ and } \{ \neg \psi_1, \dots, \neg \psi_n \} \cap E = \emptyset \}$
- φ / χ is the residue of $(\varphi : \psi_1, \dots, \psi_n / \chi)$.
- φ / χ represents a classical inference rule:
 - if φ is derivable, then χ is asserted.

2. $Cn^{\Delta_E}(W) := Cn(W \cup \bigcup_{i \geq 0} E_i)$, with

- $E_0 := \{ \chi \mid \varphi / \chi \in \Delta_E \text{ and } W \models \varphi \};$
- $E_i := \{ \chi \mid \varphi / \chi \in \Delta_E \text{ and } W \cup E_{i-1} \models \varphi \}.$

$Cn^{\Delta_E}(W)$ is the deductive closure of W under classical logic together with the inference rules in Δ_E .

3. Then, the following can be shown: $\Gamma_T(E) = Cn^{\Delta_E}(W)$.

⇒ In other words, $Cn^{\Delta_E}(W)$ constitutes a proof-theoretical characterisation of $\Gamma_T(E)$.

Exention

$$T = (W, \Delta)$$

• Proprietät:

- > $E = \text{Theory}(\Delta \text{ FOFs})$
- > $E \subseteq W$
- > $Cn(E) = E$
 → wollen mehr wissen ableiten
- > Geschlossen unter Annahme

$S = \varphi : \psi_1, \dots, \psi_n \in \Delta$

anwendbar auf E
 → $\chi \in E$, w.z.:

S anwendbar zu E IFF

$\varphi \in E$ & $\forall \psi_i \in E, \dots, \psi_n \in E$

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Definition

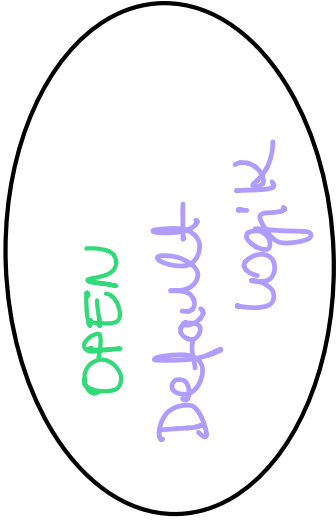
= Offenheit hängt nur von d. Formel d.

Definitor ab

→ z.B.: Closure finden

- Alle offenen Definitoren werden mit Termen in $\mathcal{T}$ gebaut

Bei $\exists$ Quantor:
→ Skolemisierung
Imp. → Expl.



Negationen

not

= neg. as failure

$a := b_1, \dots, b_n$ not derivable

if $b_1, \dots, b_n$ derivable

& $b_{n+1}, \dots, b_n$ NOT

derivable $\rightarrow a$

Default-R.

$b_1, \dots, b_n : b_{n+1}, \dots, b_n$

a

= klassische Neg

Definition

Paris Idee: Horn Klauseln als

Regeln

$a \leftarrow b_1 \vee \dots \vee b_n$

$\Rightarrow a : -b_1, \dots, b_n$ folgen

wenn • erfüllbar $\rightarrow a$

ASP

= Deklarative Methode zum

von Suchproblemen

Suchprob. in Abh. von D.T. darstellen

Wie?

Prob. wird in Abh. von T. von

formalem Sys. + Semantik dargestellt,

S.t.:

$\Rightarrow$ AS Model = Lsg gefunden durch

Modelle d. T.

Requirement:

Codieren & Rek.

in polyn.

Zeit

Answer Set

= min model von

klassischem Redukt

Sei $r = \text{Rule}$ &

$\delta(r) = \text{Default Regel}$

$\mathcal{P}$ (logic program)

$\Rightarrow$ dann:

Semantik von $\mathcal{P}$

durch $\mathcal{A}$ & gegeben

$\rightarrow$ korrespondieren

mit Extension d.

default theory

$(\emptyset, \delta(\mathcal{P}))$

$\mathcal{S}(\mathcal{P}) = \{ \delta(r) | r \in \mathcal{P} \}$

Answer Set

Programmiere

deklarativ

kann nicht

inkonsistent

sein

AS liefern

Lsg zu addierten

Problemen

= alle Literale,

die von $\mathcal{P}$

abgeleitet

werden können

ASP

Prob. wird in Abh.

von T. von formalem

Sys. + Semantik

dargestellt

$\Rightarrow$ Models = AS

MODELS

VS

Traditionelle

Wissens rep.

Info in Wissensbasis

$\rightarrow$ Abfragen

durch log.

Konsequenz Relation

PROOFS (Formal)

Kalkül

(Prolog)

Regeln

= geordneter 2^k

Head
wenn $b_1, \dots, b_k$
 $b_{k+1}, \dots, b_n$
 $\Rightarrow a_1, \dots, a_m$

Body
abwärtig &
Nicht

$\Rightarrow a_1, \dots, a_m$

Programm

= End. Set R

$\hookrightarrow$ Hier: bisj. log. P.

Definitionen

Logik Pr.: Set ϕ (= nicht-leer)

CS Var PS $\neq S$

Term

Atom $(p(t_1, \dots, t_n))$ $n \geq 0$ von ϕ

Literal $(a, \neg a)$

Answer Set Programming

SYNTAX & SEMANTIK

Basis

Interpretation $M = AS$ von

Grund p. IFF

min. Modell von P^M

$\Rightarrow$ No NCM abo in P^M

Normalis

Basis

Fakt

& No $\neg$
= Normal

Horn

Ground (No vars)

Safe

safe var

= Var nicht schwach negiert

im Body

$\rightarrow$ Entweder $\neg$ o. gar

nicht negiert

Konjunkt

$M = \{c_1, \dots, c_n\}$ Grund

M konjunkt

IFF

No atom s. t. $\{c_i, \neg p\} \subseteq M$

Interpretation

= kons. M

Wahrheitswerte von atom

unter Interpretation (M)

a	a true under M	a false under M	undefin.
a	a $\in M$	$\neg a \in M$	x
$\neg a$	$\neg a \in M$	a $\in M$	x
x	x	x	$\checkmark$
not a	e $\notin M$	e $\in M$	x

Klassisches Modell

Semantik einer Regel

$a_1, \dots, a_m$ $\vdash$ $b_1, \dots, b_k, \text{not } b_{k+1}, \dots, \text{not } b_n$

IFF

$b_1, \dots, b_k \subseteq M$ & $b_{k+1}, \dots, b_n \cap M = \emptyset$

$\Rightarrow \{a_1, \dots, a_m\} \cap M \neq \emptyset$

Sprich: "wenn immer $\oplus$ in M

& $\ominus$ nicht in M

dann muss mind. 1 d.

Kopf (.) in M sein"

wenn Rumpf T $\rightarrow$ Kopf T

Answer Set

= wird definiert durch

redukt

$\rightarrow$ adoptions: Γ_T

$M = \{a_1, \dots, a_m \mid b_1, \dots, b_k$

$a_1, \dots, a_m \vdash b_1, \dots, b_k, \text{not } b_{k+1}, \dots, \text{not } b_n$

$\in P, \{b_{k+1}, \dots, b_n\} \cap M = \emptyset$

Erfüllt Konjunkt b.

$a_1, \dots, a_m \vdash b_1, \dots, b_k, \text{not } b_{k+1}, \dots, \text{not } b_n$

$\in P, \{b_{k+1}, \dots, b_n\} \cap M = \emptyset$

True under M

Grounding

= Menge aller **Ground** Atome, d. aus AS & CS aus P ge-bildet werden können

Verwendet d. HB (Herbrand base) um zu gründen

→ AS von Prog. P mit ver. is folgendermaßen definiert:

→ als AS von **grund** (P)

(M = AS von **grund** (P) → (M ⊆ H & C(P) = AS))

Guess vs Check

Di-sjunk-tive Regeln "erraten" Lsg Kandidaten ("admirability")

Model-basiert Diagnose

Findet Gründe für einen "Failure" von einem techn. System

Verwendet ein **Modell** (= kom. Verhalten Sys) um Gründe heraus zu finden

⊕	⊖
Deckt große Menge an Fehlern, Missw., ev. ab	Probleme können zu "hard" sein

Consistency-based

= set C ⊆ H s.t. T ∪ C ⊆ H & H ⊆ S is consistent

< H T O >

ground atoms logic ground prog literals

mit pred nicht nur ab(.) (= abnormal)

Abductive

= A ⊆ H s.t. T ∪ A ⊨ O

< H T O >

ground atoms logic ground prog literals

mit pred nicht nur ab(.) (= abnormal)

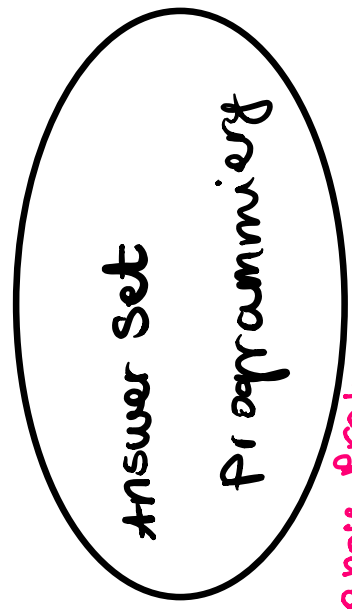
Erklärungen für beobacht. Phänomene gemäß B bekannten gegeben über App. Domäne finden

O muss von sowohl T als auch H ableitbar sein

≠ brave komp. Relation

Disjunction 1/2

- Disjunction in logic programs differs from classical disjunction.
- In particular, the one-to-one correspondence between default logic extensions and answer sets holds only for *normal programs*.
 - Consider the program $P = \{a \vee b : -\}$ and its corresponding default theory $\delta(P) = (\emptyset, \{\top : /a \vee b\})$.
 - P has two answer sets, {a} and {b}, while $\delta(P)$ has one extension, namely $Cn(\{a \vee b\})$.
- Disjunction is *minimal*
 - $P = \{a \vee b \vee c : -\}$
 - ⇒ has answer sets {a}, {b}, and {c}
 - actually subset *minimal*
 - $P = \{a \vee b : -; a \vee c : -\}$
 - ⇒ has answer sets {a} and {b, c}



In DLV

Diagnose Prob.

< H T O >

H ... Hypothese (= Raum d. mögl. defekten Komponenten) — Ground atoms

T ... Theorie (= Modell) — Logic program

O ... Beobachtungen (= konkreter Fehlverhalten) — Ground literals

Definition

= verurteilt Extension von propositional logic

- wende Grade von "belieb" auf Propositionen (= Zusicherungen d. w. d. Bsp. wahr sind) an
- Basiselem: **Random variablen**

= haben Domain

Boolesch

is Daddy = true

Diskret

Werte nur abzählbar

Domin

{Sonntag, Montag, ...}

Kontinuierlich

Überabzählbare Domain

z.B.: 4.02

Atomare Ergebnis

Zuweisung aller Zufalls var = Spezifikation d. Weltzustand

MUTEX

schließen sich gegenseitig aus

Exhaustive

Es muß immer genau ein Ereignis stattfinden

Bayes Netzwerk

DAG zur Darstellung einer **JDF**

inkl. Unabhängigkeit zw. d. Var

- Gerichtete Kanten

$V_1 \rightarrow V_2$: V_1 Elternteil von V_2

Knoten = **Zufalls var**

> **Bedingte Wahrscheinlichkeit**

> $\forall$ Knoten ist cond. indep. von seinen Nicht-Elternknoten mit Evidenz d. Eltern

Basic

= Quantitativ

Probabilistische A.

= kl. T. + Prob. T.

Dempster-Shafer theory

= generalisierte Prob. ignoranz + uncertainty

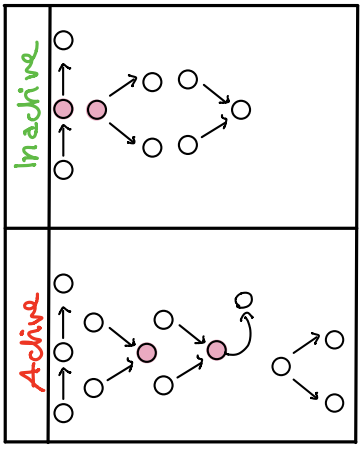
Fuzzy logic

Non-discrete set - element relation

Probabilistic Reasoning

D-separation

Nur wenn es keine aktive Pfad zw. cond. independent



Schließen

Kausales

$O \rightarrow E$
Ursache $\rightarrow$ Effekt

Diagnostisch

$E \rightarrow O$
Effekt $\rightarrow$ Ursache

Zwischenkausal

$E \rightarrow O \rightarrow E$
Zw. Ursache von persönl. Effekten

Joint probability distribution (JPD)

Mapping, wo $\forall$ atomares Event einer Zahl $P(w)$ zugeordnet, s.t.

① $0 \leq P(w) \leq 1$

② $\sum_{w \in \Omega} P(w) = 1$

$w = \{V_1 = v_1, \dots, V_n = v_n\}$

marginalisierung

= Wahsch., dass eine gewisse # von Var. einen gewissen Wert annimmt

$$P(V_i = v_i) = \sum_{V_1, \dots, V_n} P(V_1, \dots, V_n)$$

Bedingte Wahrscheinlichkeit.

$P(V_i = v_i | V_j = v_j)$

= Wahrscheinlichkeit, dass $V_i = v_i$ unter d. Bedingung $V_j = v_j$ gilt

$$P(V_i = v_i | V_j = v_j) = \frac{P(V_i, V_j)}{P(V_j)}$$

• **Produktregel**

$$P(V_1, \dots, V_n) = \prod_{i=1}^n P(V_i | V_1, \dots, V_{i-1})$$

$\rightarrow$ Unabhängig von Reihenfolge

• **Satz von Bayes**

$$P(A | B) = \frac{P(B | A) \cdot P(A)}{P(B)}$$

• **Conditional Independence**

V cond. independent von B mit gegeb. Evidenz E , wenn $P(V | B, E) = P(V | E)$

Zusätzliches Wissen wird über B erzeugt kein zusätzl. Wissen zu V