Foundation of Logic

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What is logic?

"Logic is the beginning of wisdom, not the end"

The branch of philosophy concerned with analysing the patterns of reasoning by which a conclusion is drawn from a set of premises, without reference to meaning or context is known as logic.

(Collins English Dictionary)

Why is logic important?

- Logic is a formal method for reasoning.
- Logic is a formal language for **deducing** knowledge from a small number of explicitly stated **premises** (or hypotheses, axioms, facts).
- Logic provides a formal framework for representing knowledge.
- Logic differentiates between the structure and content of an argument.

What is an argument?

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Deduction and Inference

- If the conclusion is justified, based solely on the premises, the process of reasoning is called **deduction**.
- If the validity of the conclusion is based on generalisation from the premises, based on strong but inconclusive evidence, the process is called **inference** (sometimes called **induction**).

Two examples

• **Deductive** argument:

"Alexandria is a port or a holiday resort. Alexandria is not a port. Therefore, Alexandria is a holiday resort."

• **Inductive** argument

"Most students who did not do the tutorial questions will fail the exam. John did not do the tutorial questions. Therefore John will fail the exam."

Foundation of Logic

Mathematical Logic is a tool for working with compound statements. It includes:

- A formal language for expressing them.
- A methodology for objectively reasoning about their truth or falsity.
- It is the foundation for expressing formal proofs in all branches of mathematics.

We will talk about two logical systems:

- Propositional logic
- Predicate logic

Propositional Logic

Propositional Logic is the logic of compound statements built from simpler statements using so-called **Boolean connectives**.

Some applications in computer science:

- Design of digital electronic circuits.
- Expressing conditions in programs.
- Queries to databases & search engines.

Definition: A *proposition* is simply:

- a *statement* (*i.e.*, a declarative sentence)
 - with some definite meaning
- having a truth value that's either true (T) or false (F)
 - it is never both, neither, or somewhere "in between!"
 - however, you might not know the actual truth value.

Propositions in Propositional Logic

- Simple types of statements, called propositions, are treated as atomic building blocks for more complex statements.
- Atoms: p, q, r, ...
 (Corresponds with simple English sentences, e.g. `I had salad for lunch')
- Complex propositions: built up from atoms using operators: p ∧ q
 (Corresponds with compound English sentences, e.g., "I had salad for lunch and I had steak for dinner.")

Some Popular Boolean Operators

Formal Name	Nickname	Arity	Symbol
Negation operator	NOT	Unary	П
Conjunction operator	AND	Binary	^
Disjunction operator	OR	Binary	\
Exclusive-OR operator	XOR	Binary	\oplus
Implication operator	IMPLIES	Binary	\rightarrow
Biconditional operator	IFF	Binary	\leftrightarrow

The Negation Operator

The unary *negation operator* "¬" (*NOT*) transforms a prop. into its *negation*.

E.g. If
$$p =$$
 "I have brown hair." then $\neg p =$ "I do **not** have brown hair."

The *truth table* for NOT:

$$\begin{array}{c|c} p & \neg p \\ \hline T & F \\ F & T \end{array}$$

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• Note that a conjunction $p_1 \wedge p_2 \wedge ... \wedge p_n$ of n propositions will have 2^n rows in its truth table.

p	q	$p \land q$
F	F	F
F	T	F
T	F	F
T	T	T

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The binary *disjunction operator* "\" (*OR*) combines two propositions to form their logical *disjunction*.

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    p="My car has a bad engine."
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    pvq="Either my car has a bad engine, or my car has a bad carburetor."
```

- Note that $p \lor q$ means that p is true, or q is true, **or both** are true!
- So, this operation is also called *inclusive or*, because it **includes** the possibility that both p and q are true.

p	q	$p \lor q$
F	F	F
F	T	\mathbf{T}
T	F	\mathbf{T}
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Nested Propositional Expressions

- Use parentheses to *group sub-expressions*: "I just saw my old friend, and either he's grown or I've shrunk." = $f \land (g \lor s)$ ($f \land g) \lor s$ would mean something different $f \land g \lor s$ would be ambiguous
- By convention, "¬" takes precedence over both "∧" and "∨".

Tautologies/Contradictions/Contigencies

A *tautology* is a compound proposition that is **true** *no matter what* the truth values of its atomic propositions are!

Ex.
$$p \lor \neg p = 1$$

A *contradiction* is a compound proposition that is **false** no matter what the truth values of its atomic propositions are!

$$Ex. p \land \neg p = 0$$

All other propositions are *contingencies*:

Some rows give T, others give F.

Logical Equivalence

Compound proposition p is *logically equivalent* to compound proposition q, written $p \Leftrightarrow q$, **IFF** p and q contain the same truth values in <u>all</u> rows of their truth tables

We will also say: they express the same truth function (= the same function from values for atoms to values for the whole formula).

Ex. Prove that $p \lor q \Leftrightarrow \neg(\neg p \land \neg q)$.

p q	$p \lor q$	$\neg p$	$\neg q$	$\neg p \land \neg q$	$\neg(\neg p)$) <u> </u>	$\neg q)$
FF	F	T	T	T		F	
FT	T	T	F	F		T	
ΤF	T	F	T	F		T	
TT	T	F	F	F		T	
					· ·	V	

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The binary *exclusive-or operator* "⊕" (*XOR*) combines two propositions to form their logical "exclusive or".

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T	T	\mathbf{F}

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The *implication* $p \rightarrow q$ states that p implies q.

i.e., if *p* is true, then *q* is true; but if *p* is not true, then *q* could be either true or false.

e.g., let
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- $p \rightarrow q$ does **not** say that p causes q!
- $p \rightarrow q$ does **not** require that p or q **are true**!

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F	F	T
F	T	T
T	F	\mathbf{F}
T	T	T

Implications between real sentences

- "If this lecture ever ends, then the sun has risen this morning." *True* or *False*?
- "If Tuesday is a day of the week, then I am a penguin." *True* or *False*
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Some terminology, for an implication $p \rightarrow q$:

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- Identity: $p \wedge \mathbf{T} \Leftrightarrow p \quad p \vee \mathbf{F} \Leftrightarrow p$
- Domination: $p \lor T \Leftrightarrow T$ $p \land F \Leftrightarrow F$
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- Distributive: $p\lor(q\land r)\Leftrightarrow (p\lor q)\land(p\lor r)$ $p\land(q\lor r)\Leftrightarrow (p\land q)\lor(p\land r)$
- De Morgan's Laws:

$$\neg (p \land q) \Leftrightarrow \neg p \lor \neg q$$
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• Trivial tautology/contradiction:

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Augustus De Morgan (1806-1871)

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Remember:

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Applications of Predicate Logic

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Outline

- First-order inference rules: Modus Ponens, Modus Tollens
- Resolution

Modus Ponens

- Assume you are given the following two statements:
 - "you are in this class"
 - "if you are in this class, you will get a grade"
- Let p = "you are in this class"
- Let q = "you will get a grade"
- By Modus Ponens, you can conclude that you will get a grade

$$p$$

$$\underline{p \rightarrow q}$$

$$\therefore q$$

Modus Ponens

• Consider $(p \land (p \rightarrow q)) \rightarrow q$

p	q	$p \rightarrow q$	$p \land (p \rightarrow q))$	$ (p \land (p \rightarrow q)) \rightarrow q $
T	T	T	T	T
T	F	F	F	T
F	T	T	F	T
F	F	T	F	T

$$p$$

$$p \rightarrow q$$

$$\therefore q$$

Chain Rule

From $p \rightarrow q$, and $q \rightarrow r$, we can infer $p \rightarrow r$

$$p \rightarrow q$$

$$q \rightarrow r$$

$$\therefore p \rightarrow r$$

Modus Tollens

- Assume that we know: $\neg q$ and $p \rightarrow q$ Recall that $p \rightarrow q = \neg q \rightarrow \neg p$
- Thus, we know $\neg q$ and $\neg q \rightarrow \neg p$
- We can conclude $\neg p$

$$\neg q$$

$$p \to q$$

$$\therefore \neg p$$

Modus Tollens

- Assume you are given the following two statements:
 - "you will not get a grade"
 - "if you are in this class, you will get a grade"
- Let p = "you are in this class"
- Let q = "you will get a grade"
- By Modus Tollens, you can conclude that you are not in this class

Addition and Simplification

Addition: If you know that p is true, then p \(\) q
 will ALWAYS be true

p

$$\therefore p \vee q$$

• Simplification: If $p \land q$ is true, then p will ALWAYS be true

$$p \wedge q$$

Rules of inference for the universal quantifier

- Assume that we know that $\forall x P(x)$ is true
 - Then we can conclude that P(c) is true
 - Here c stands for some specific constant
 - This is called "universal instantiation"

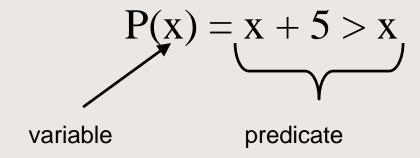
- Assume that we know that P(c) is true for any value of c
 - Then we can conclude that $\forall x P(x)$ is true
 - This is called "universal generalization"

Rules of inference for the existential quantifier

- Assume that we know that $\exists x P(x)$ is true
 - Then we can conclude that P(c) is true for some value of c
 - This is called "existential instantiation"

- Assume that we know that P(c) is true for some value of c
 - Then we can conclude that $\exists x P(x)$ is true
 - This is called "existential generalization"

Anatomy of a propositional function



Universal instantiation (UI)

- A predicate that has no variables is called a ground atom.
- Every instantiation of a universally quantified sentence is entailed by it:

$$\forall v \alpha$$

Subst($\{v/g\}$, α)

for any variable v and ground term g(Subst(x,y) = substitution of y by x)

• E.g., $\forall x \ King(x) \land Greedy(x) \Rightarrow Evil(x)$ yields:

```
King(John) \wedge Greedy(John) \Rightarrow Evil(John)
```

$$King(Richard) \land Greedy(Richard) \Rightarrow Evil(Richard)$$

 $King(Father(John)) \wedge Greedy(Father(John)) \Rightarrow Evil(Father(John))$

•

•

•

Existential instantiation (EI)

• For any sentence α , variable v, and constant symbol k that does not appear elsewhere in the knowledge base:

$$\frac{\exists v \ \alpha}{\text{Subst}(\{v/k\}, \alpha)}$$

• E.g., $\exists x \ Crown(x) \land OnHead(x,John)$ yields:

$$Crown(C_1) \wedge OnHead(C_1,John)$$

provided C_1 is a new constant symbol, called a Skolem constant

EI versus UI

- UI can be applied several times to *add* new sentences; the new KB is logically equivalent to the old.
- EI can be applied once to replace the existential sentence; the new KB is not equivalent to the old but is satisfiable if the old KB was satisfiable.

Reduction to propositional inference

• Suppose the KB contains just the following:

```
\forall x \text{ King}(x) \land \text{Greedy}(x) \Rightarrow \text{Evil}(x)
\text{King}(\text{John})
\text{Greedy}(\text{John})
\text{Brother}(\text{Richard},\text{John})
```

• Instantiating the universal sentence in all possible ways, we have:

```
King(John) ∧ Greedy(John) ⇒ Evil(John)
King(Richard) ∧ Greedy(Richard) ⇒ Evil(Richard)
King(John)
Greedy(John)
Brother(Richard,John)
```

• The new KB is propositionalized: proposition symbols are John, Richard and also King(John), Greedy(John), Evil(John), King(Richard), etc.

Making modus ponens complete

- Modus ponens is incomplete in a general KB
 - Need other inference rules
 - E.g. $KB = \{A \land B\}$, we cannot infer anything with MP
- There is a (finite) set of inference rules such that repeatedly applying them forms a complete inference procedure
 - All valid sentences can be inferred in this way
- For each inference rule, we can associate the infinite set of logical axioms (implications) that corresponds to each possible instantiation of the rule
 - E.g. and-elimination corresponds to all axioms of the form $A \land B = > A$
 - Note that the axioms are in our FOL language, whereas inference rules are in a "meta-language"
- Modus ponens becomes complete if we add to our knowledge bases all the logical axioms corresponding to the other inference rules

Inference in FOL

• Entailment: $KB \models \alpha$ whenever every model of KB is also a model of α .

Inference procedures:

- o propositionalization (Universal and Existential elimination; convert to Propositional Logic; apply prop logic inference)
- o lifted inference rules, and in particular refutation/resolution proof for FOL
- o forward/backward chaining for definite clauses

Propositionalization

- Problem: with function symbols, there are infinitely many ground terms,
 - e.g., Father(Father(Father(John)))
- Theorem: Herbrand (1930). If a sentence α is entailed by an FOL KB, it is entailed by a finite subset of the propositionalized KB
- Idea: For n = 0 to ∞ do
 - create a propositional KB by instantiating with depth-n terms
 - see if α is entailed in this KB (e.g. using refutation)
- Problem: works if α is entailed, loops if α is not entailed
- Theorem: Turing (1936), Church (1936) Entailment for FOL is semi-decidable (algorithms exist that say yes to every entailed sentence, but no algorithm exists that also says no to every non-entailed sentence.)

Propositionalization: Example

```
\forall x King(x) \land Greedy(x) => Evil(x)
King(John)
Hassan
Giro
Lukasz
Jacomo
John
\Box \forall y Greedy(y)
Would like to conclude Evil(John).
```

```
By Propositionalization, write out:

King(John) \( \sigma \text{Greedy(John)} => \text{Evil(John)} \)

King(Hassan) \( \sigma \text{Greedy(Hassan)} => \text{Evil(Hassan)} \)

King(Giro) \( \sigma \text{Greedy(Giro)} => \text{Evil(Giro)} \)

King(Jacomo) \( \sigma \text{Greedy(Jacomo)} => \text{Evil(Jacomo)} \)

King(Lukasz) \( \sigma \text{Greedy(Lukasz)} => \text{Evil(Lukasz)} \)

Greedy(John)

Greedy(Hassan) \( \ldots \)
```

finally, conclude Evil(John)

Problems with propositionalization

- Propositionalization seems to generate lots of irrelevant sentences
- E.g., from: $\forall x \text{ King}(x) \land \text{Greedy}(x) \Rightarrow \text{Evil}(x)$ King(John)
 - \forall y Greedy(y)
 - Brother(Richard, John)
- It seems obvious that Evil(John), but propositionalization produces lots of facts such as Greedy(Richard) that are irrelevant
- With p k-ary predicates and n constants, there are $p \cdot n^k$ instantiations

Generalized Modus Ponens

- Lifted version of the propositional Modus Ponens
- For atomic sentences p_i , p_i , and q, where there is a substitution θ that satisfies $Subst(\theta, p_i) = Subst(\theta, p_i)$ for all i

$$\frac{p'_1, p'_2, \dots, p'_n, (p_1 \land p_2 \land \dots \land p_n => q)}{Subst(\theta, q)}$$

•Example:

```
p_1' is King(John) p_1 is King(x) p_2' is Greedy(y) p_2 is Greedy(x) p_2 is Greedy(x) p_3 is Evil(x) Subst(\theta,q) is Evil(John)
```

we say θ "unifies" p_1 and p_2 ; and p_2 and p_2 .

Soundness of GMP

- For any sentence p with universally quantified variables and for any substitution θ , p \sqsubseteq Subst (θ,p)
- So, from $(p_1',...,p_n')$ we can infer:

$$Subst(\theta, p_1') \wedge ... \wedge Subst(\theta, p_n')$$
 (1)

• From the implication $p_1 \wedge ... \wedge p_n => q$ we can infer: $Subst(\theta, p_1) \wedge ... \wedge Subst(\theta, p_n) => Subst(\theta, q) \qquad (2)$

By the GMP rule, when the first sentence (1) matches the premise of (2) exactly we can infer $Subst(\theta,q)$.

This follows immediately from Modus Ponens.

Unification

• To apply GMP we need a substitution that *unifies* a sentences in the KB with the premises, i.e. to find $Subst(\theta,p'_i)=Subst(\theta,p_i)$ for all i

$$p'_{1},p'_{2},...,p'_{n}, (p_{1} \wedge p_{2} \wedge ... \wedge p_{n}) q)$$

$$Subst(\theta, q)$$

•Unification: find a substitution of variables for terms that makes two sentences equivalent.

Example:

```
Unify(Knows(John,x); Knows(John,Jane)) = {x/Jane}
Unify(Knows(John,x); Knows(y,Bill)) = {x/Bill, y/John}
```

Write: unify(α,β) = θ , to denote the unifier θ , e.g. θ =unify(α,β)={x/Jane}

- Unifiers $\theta = \text{unify}(\alpha, \beta)$, can:
 - replace a variable by a constant term, e.g. {x/John}
 - replace a variable with a variable, e.g. $\{x/y\}$
 - replace a variable by a function expression,e.g. {x / Mother(y)}
 - CAREFUL: need to check variable (e.g. x) does not appear inside the complex term
 - "Occur check"
 - makes complexity quadratic

Examples

Find a unifier for the following sentences:

 $\label{eq:total_variable} variable \ term $$ 1-unify(Knows(John,x), Knows(John,Jane))$$ $\theta=\{x/Jane\}$$

$$2 - unify(Knows(John,x), Knows(y,Bill))$$
 $\theta = \{x/Bill, y/John\}$

Generalized Resolution

• Lifted version of resolution

$$p_1 \vee \ldots \vee p_m, \neg q_1 \vee \ldots \vee q_n, \quad Unify(p_1, \neg q_1) = \theta$$

Subst(
$$\theta$$
, $p_2 \vee ... \vee p_m \vee q_2 \vee ... \vee q_n$)

Example:

 $Animal(F(x)) \lor Loves(G(x),x) \ and \ \neg \ Loves(u,v) \lor \neg \ Kills(u,v)$

take unifier $\theta = \{u/G(x), v/x\}$, and get resolvent clause:

Animal(
$$F(x)$$
) $\vee \neg Kills(G(x),x)$

Resolution Algorithm

- start with KB, add $\neg \alpha$
- while False ∉ KB {
 - find two sentences α , $\beta \in KB$ that unify
 - add resolvent(α , β) to KB

}

Resolution is "refutation-complete:" will report "yes" (find the empty clause) if sentence is entailed.

Resolution Strategies

- Complete
 - Breadth-first (slow)
 - Set of Support
 - Linear resolution
 - Subsumption: remove all sentences in your KB that are subsumed. (e.g. remove $A \lor B(k)$ if B(x) is in KB)
- Incomplete
 - Unit resolution
 - Input resolution