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### **Abstract Argumentation**

Lecture 10, 5th Jan 2026 // Foundations of Knowledge Representation, WS 2025/26

### **Overview**

**Overall Process** 

**Argumentation Frameworks** 

AFs - Semantics

AFs - Outlook





### **Overall Process**





### Introduction

#### Argumentation:

The study of processes "concerned with how assertions are proposed, discussed, and resolved in the context of issues upon which several diverging opinions may be held".

[Bench-Capon and Dunne, Argumentation in Al, AlJ 171:619-641, 2007]

#### Formal Models of Argumentation are concerned with

- representation of an argument (i.e. an expression of opinion)
- representation of the relationship between arguments
- resolving conflicts between the arguments ("acceptability")





### **Overall Process**

The overall process of using argumentation frameworks consists of the steps listed below.

Starting point: Knowledge base

- 1. Form arguments
- 2. Identify conflicts
- 3. Abstract from internal structure
- 4. Resolve conflicts
- 5. Draw conclusions





# **Overall Process - Form Arguments**

Consider the following knowledge base:

#### **Knowledge Base**

$$\Delta = \{s, r, w, s \rightarrow \neg r, r \rightarrow \neg w, w \rightarrow \neg s\}$$

From this, form arguments:

$$\Big( \langle \{W, W \rightarrow \neg S\}, \neg S \rangle \Big)$$

$$(\langle \{s, s \rightarrow \neg r\}, \neg r \rangle)$$

$$\left(\langle \{s, s \rightarrow \neg r\}, \neg r \rangle\right) \quad \left(\langle \{r, r \rightarrow \neg w\}, \neg w \rangle\right)$$

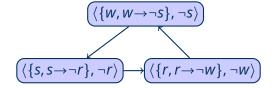




# **Overall Process – Identify Conflicts**

#### **Knowledge Base**

$$\Delta = \{s, r, w, s \rightarrow \neg r, r \rightarrow \neg w, w \rightarrow \neg s\}$$





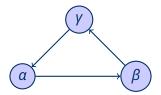


# Overall Process – Abstract from Internal Structure

#### **Knowledge Base**

$$\Delta = \{s, r, w, s \rightarrow \neg r, r \rightarrow \neg w, w \rightarrow \neg s\}$$

 $F_{\Delta}$ :





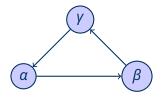


### **Overall Process - Resolve Conflicts**

#### **Knowledge Base**

$$\Delta = \{s, r, w, s \rightarrow \neg r, r \rightarrow \neg w, w \rightarrow \neg s\}$$

 $F_{\Delta}$ :



$$pref(F_{\Delta}) = \{\emptyset\}$$
  
 $stage(F_{\Delta}) = \{\{\alpha\}, \{\beta\}, \{\gamma\}\}\}$ 

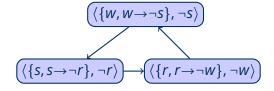




### **Overall Process - Draw Conclusions**

#### Knowledge Base

$$\Delta = \{s, r, w, s \rightarrow \neg r, r \rightarrow \neg w, w \rightarrow \neg s\}$$



$$Cn_{pref}(F_{\Delta}) = Cn(\top)$$
  
 $Cn_{stage}(F_{\Delta}) = Cn(\neg r \lor \neg w \lor \neg s)$ 





### The Overall Process (ctd.)

#### Some Remarks

- Main idea dates back to the seminal work of Phan Minh Dung [1995]; has then been refined by several authors (Prakken, Gordon, Caminada, ...)
- Separation between logical (forming arguments) and non-monotonic reasoning ("abstract argumentation frameworks")
- Abstraction allows to compare several KR formalisms on a conceptual level ("calculus of conflict")

#### Main Challenge

- All steps in the argumentation process are, in general, intractable.
- This calls for:
  - careful complexity analysis (identification of tractable fragments)
  - re-use of established tools for implementations (reduction method)





# **Approaches to Form Arguments**

#### Classical Arguments [Besnard & Hunter, 2001]

- Given is a KB (a set of propositions) ∆
- An **argument** is a pair  $(\Phi, \alpha)$ , such that  $\Phi \subseteq \Delta$  is consistent,  $\Phi \models \alpha$  and for no  $\Psi \subsetneq \Phi$ ,  $\Psi \models \alpha$
- An argument  $(\phi, \alpha)$  **attacks** argument  $(\phi', \alpha')$  iff  $\phi' \cup \{\alpha\}$  is inconsistent

#### Example

$$(\langle \{s, s \to \neg r\}, \neg r \rangle) \longrightarrow (\langle \{r, r \to \neg w\}, \neg w \rangle)$$

#### Other Approaches:

- arguments are trees (or directed acyclic graphs) of statements
- claims are obtained via strict and defeasible rules
- different notions of conflict: rebuttal, undercut, etc.





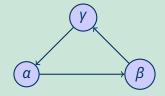
# **Argumentation Frameworks**





### **Dung's Abstract Argumentation Frameworks**

#### Example



#### **Main Properties**

- Abstract from the concrete content of arguments; only consider the relation between them
- Semantics select subsets of arguments respecting certain criteria
- Simple, yet powerful formalism
- Most active research area in the field of argumentation





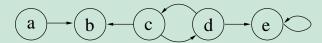
# **Dung's Abstract Argumentation Frameworks**

#### Definition

An **argumentation framework** (AF) is a pair F = (A, R) where

- A is a set of arguments,
- $R \subseteq A \times A$  is a relation representing the conflicts ("attacks").

$$F = (\{a, b, c, d, e\}, \{(a, b), (c, b), (c, d), (d, c), (d, e), (e, e)\})$$







Definition (Conflict-Free Sets)

Let F = (A, R) be an AF.

A set  $S \subseteq A$  is **conflict-free** in F iff for each  $a, b \in S$  we have  $(a, b) \notin R$ .

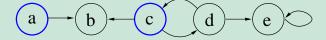




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$$cf(F) = \{\{a,c\},$$

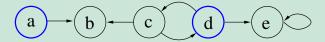




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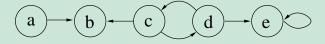




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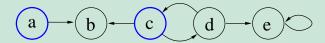


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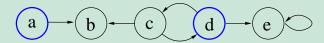


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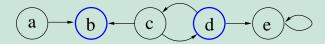
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#### Example



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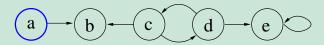
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#### Example



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#### Dung's Fundamental Lemma

Let S be admissible in an AF F and a, a' arguments in F defended by S in F. Then,

- 1.  $S' = S \cup \{a\}$  is admissible in F.
- 2. a' is defended by S' in F.





### **AFs – Semantics**





#### Definition (Naive Sets/Extensions)

Let F = (A, R) be an AF.

A set  $S \subseteq A$  is **naive** in F iff

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Naive sets are subset-maximally conflict-free sets.





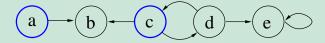
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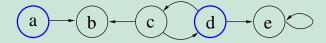
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 $naive(F) = \{\{a, c\}, \{a, d\}, \{b, d\}, \{a\}, \{b\}, \{c\}, \{d\}, \emptyset\}\}$ 





### **Grounded**

#### Definition (Grounded Extension [Dung, 1995])

Let F = (A, R) be an AF. The unique **grounded extension** of F is defined as the outcome S (initially empty) of the following "algorithm":

- 1. put each argument  $a \in A$  that is not attacked in F into S; if no such arguments exist, return S;
- 2. remove from *F* all (new) arguments in *S* and all arguments attacked by them (together with all adjacent attacks); and continue with Step 1.





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$$ground(F) = \{\{a\}\}$$





# **Complete**

#### Definition (Complete Extension [Dung, 1995])

Let (A, R) be an AF.

A set  $S \subseteq A$  is **complete** in F iff

- S is admissible in F,
- each  $a \in A$  defended by S in F is contained in S.
  - Recall:  $a \in A$  is defended by S in F iff for each  $b \in A$  with  $(b, a) \in R$ , there exists a  $c \in S$ , such that  $(c, b) \in R$ .





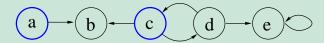
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$$comp(F) = \{ \{a, c\}, \}$$





## **Complete**

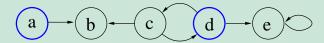
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### Example



 $comp(F) = \{\{a, c\}, \{a, d\}, \}$ 





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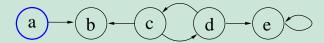
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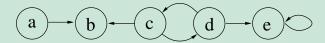
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#### Example



 $comp(F) = \{\{a, c\}, \{a, d\}, \{a\}, \{c\}, \{d\}, \emptyset\}\}$ 





## **Grounded vs. Complete**

Properties of the Grounded Extension

For any AF *F*, the grounded extension of *F* is the subset-least complete extension of *F*.





## **Grounded vs. Complete**

#### Properties of the Grounded Extension

For any AF *F*, the grounded extension of *F* is the subset-least complete extension of *F*.

#### Remark

Since there exists exactly one grounded extension for each AF F, we often write ground(F) = S instead of  $ground(F) = \{S\}$ .





## **Preferred**

Definition (Preferred Extensions [Dung, 1995])

Let F = (A, R) be an AF.

A set  $S \subseteq A$  is a **preferred extension** of F iff

- S is admissible in F,
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Preferred extensions are subset-maximally admissible sets.





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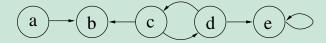
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#### Example



$$pref(F) = \{\{a, c\}, \{a, d\}, \{a\}, \{c\}, \{d\}, \emptyset\}\}$$





#### Definition (Stable Extensions [Dung, 1995])

Let F = (A, R) be an AF.

A set  $S \subset A$  is a **stable extension** of F iff

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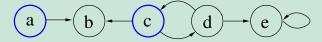
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#### Example



$$stable(F) = \{ \{a, c\} \}$$





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#### Example



 $stable(F) = \{ \{ a, c \}, \{ a, d \},$ 





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## **Relationships Between Semantics**

#### Proposition

For any AF *F* the following relations hold:

- 1. Each stable extension of *F* is also a preferred one;
- 2. Each preferred extension of *F* is also a complete one;
- 3. Each complete extension of *F* is admissible in *F*.





### Semi-Stable

Definition (Semi-Stable Extensions [Caminada, 2006])

Let F = (A, R) be an AF.

A set  $S \subseteq A$  is a **semi-stable extension** of F iff

- S is admissible in F,
- there is no admissible  $T \subseteq A$  in F such that  $S^+ \subsetneq T^+$ , where
  - for  $S \subseteq A$ , define  $S^+ = S \cup \{a \mid \exists b \in S \text{ with } (b, a) \in R\}$ .

Defined as admissible stages by Verheij [1996].





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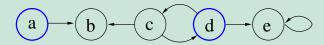
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Defined as admissible stages by Verheij [1996].

#### Example



 $semi(F) = \{ \{a, c\}, \{a, d\}, \{a\}, \{c\}, \{d\}, \emptyset \} \}$ 





# Stage

#### Definition (Stage Extensions [Verheij, 1996])

Let F = (A, R) be an AF.

A set  $S \subseteq A$  is a **stage extension** of F iff

- *S* is conflict-free in *F*,
- there is no conflict-free  $T \subseteq A$  in F such that  $S^+ \subsetneq T^+$ .
  - Recall:  $S^+ = S \cup \{a \mid \exists b \in S \text{ with } (b, a) \in R\}.$

#### *S*<sup>+</sup> is also called the range of *S*. Thus:

- Semi-stable extensions are range-maximally admissible sets.
- Stage extensions are range-maximally conflict-free sets.





### Ideal

#### Definition (Ideal Extension [Dung, Mancarella & Toni 2007])

Let F = (A, R) be an AF.

A set  $S \subseteq A$  is an **ideal extension** of F iff

- S is admissible in F and contained in each preferred extension of F,
- there is no  $T \supseteq S$  admissible in F and contained in each of pref(F).

#### Properties of Ideal Extensions

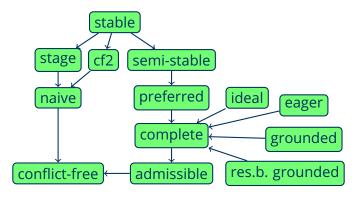
For any AF *F* the following observations hold:

- 1. There exists exactly one ideal extension of F.
- 2. The ideal extension of *F* is also a complete one.





### **Relations Between Semantics**



An arrow from semantics  $\sigma$  to semantics  $\tau$  means that each  $\sigma$ -extension is also a  $\tau$ -extension.





## AFs - Outlook



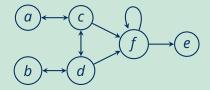


# **Characteristics of Argumentation Semantics**

#### Example

$$pref(F) = \{ \{a, d, e\}, \{b, c, e\}, \{a, b\} \}$$

$$naive(F) = \{ \{a, d, e\}, \{b, c, e\}, \{a, b, e\} \}$$



#### Natural Questions → Realizability

- How to change the AF if we want  $\{a, b, e\}$  instead of  $\{a, b\}$  in pref(F)?
- How to change the AF if we want  $\{a, b, d\}$  instead of  $\{a, b\}$  in pref(F)?
- Can we have equivalent AFs without argument f?





## Some Properties ...

#### Theorem

For any AFs F and G, we have

- adm(F) = adm(G) implies  $\sigma(F) = \sigma(G)$ , for  $\sigma \in \{pref, ideal\}$ ;
- comp(F) = comp(G) implies  $\theta(F) = \theta(G)$ , for  $\theta \in \{pref, ideal, ground\}$ ;
- no other such relation between the different semantics (*adm*, *pref*, *ideal*, *semi*, *ground*, *comp*, *stable*) in terms of standard equivalence holds.





## **Decision Problems on AFs**

#### **Credulous Acceptance**

Cred<sub> $\sigma$ </sub>: Given AF F = (A, R) and  $\alpha \in A$ ;

is  $\alpha$  contained in at least one  $\sigma$ -extension of F?

#### Skeptical Acceptance

Skept<sub> $\sigma$ </sub>: Given AF F = (A, R) and  $\alpha \in A$ ; is  $\alpha$  contained in every  $\sigma$ -extension of F?

If no extension exists then all arguments are skeptically accepted and no argument is credulously accepted.<sup>1</sup>

<sup>&</sup>lt;sup>1</sup>This is only relevant for stable semantics.





### **Decision Problems on AFs**

Hence we are also interested in the following problem:

Skeptically and Credulously Accepted

Skept' $_{\sigma}$ : Given AF F = (A, R) and  $\alpha \in A$ ;

is  $\alpha$  contained in every and at least one  $\sigma$ -extension of F?





## **Further Decision Problems**

Verifying an extension

Ver<sub> $\sigma$ </sub>: Given AF F = (A, R) and  $S \subseteq A$ ;

is *S* a  $\sigma$ -extension of *F*?

Does there exist an extension?

Exists<sub> $\sigma$ </sub>: Given AF F = (A, R);

Does there exist a  $\sigma$ -extension for F?

Does there exist a nonempty extensions?

Exists $_{\sigma}^{\neg \emptyset}$ : Given AF F = (A, R);

Does there exist a non-empty  $\sigma$ -extension for F?





### **Conclusion**

- Abstract argumentation frameworks are constructed from KBs.
- Edges (attacks) between nodes (arguments) express (directed) conflicts.
- A variety of semantics for AFs try to make sense of acceptability:
  - Complete
  - Grounded
  - Preferred
  - Stable
  - ...
- Various inclusion relationships between the semantics hold, as they build on similar notions.



