

Deep Inference for Graphical Theorem Proving

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PhD defense, Palaiseau

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Introduction



Context




- Study of *sound reasoning*

Logic

- Study of *sound reasoning*
- Example of everyday life deduction:

it rains  you don't have 

you are wet 

Logic

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premisses

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conclusion

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it rains 🌧️ you don't have ☂️ you are outside
you are not under a bus shelter ...

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conclusion

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- Hidden assumptions \Rightarrow lack of **certainty**

Formal logic

Let's try another one (Aristotle – 4th century BC):

$$\frac{\textit{Socrates is human} \quad \textit{All humans are mortal}}{\textit{Socrates is mortal}}$$

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↳ **Formal** essence of logical reasoning

Mathematical logic

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- Formalist school (Hilbert – 20th century):

Maths as a huge **game**

Goal: to prove theorems by following inference rules

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Goal: to prove theorems by following inference rules

- **Proof theory:** design & study of *rule systems* capturing maths

Proof assistants

- Inference rules represented with **symbols**

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- Inference rules represented with **symbols**
- **Computers** very good at *manipulating symbols* and *following rules*
 - ↳ Teach computers how to do maths with proof theory!
- Problem: maths is *hard* \Rightarrow need for a **human** in the loop
 - ↳ **Interactive** Theorem Provers (ITPs)

Contributions

Textual vs. Graphical

State-of-the art: build proofs by writing **textual** commands

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: “Please apply *this* rule”

Textual vs. Graphical

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: “Please apply *this* rule”



: “ OK here is the result!”

Textual vs. Graphical

State-of-the art: build proofs by writing **textual** commands



: “Please apply *this* rule”



: “**✗ ERROR:** dkfsljfdklsfjdkfjsldjfkdlfsj”

Textual vs. Graphical

State-of-the art: build proofs by writing **textual** commands



: “Please apply *this* rule”



: “**✗ ERROR:** dkfsljfjdklsfjdkfjsldjfkdlfsj”

1st contribution: build proofs by **direct manipulation** of *formulas*

↳ No need to *memorize* the rules

↳ More *straightforward* interaction

Symbolic vs. Iconic

- **Symbols** are hard to:
 - *learn* \Rightarrow purely conventional meaning
 - *manipulate* \Rightarrow need for very precise gestures

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Symbolic vs. Iconic

- **Symbols** are hard to:
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 - *manipulate* \Rightarrow need for very precise gestures
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2nd contribution: replace logical symbols by **geometrical diagrams**

Symbolic Manipulations

Proof-by-Action

A demo is worth a thousand words!

Paradigm

- Fully graphical: no textual proof language

Paradigm

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- Both spatial and temporal:

proof = gesture sequence

Paradigm

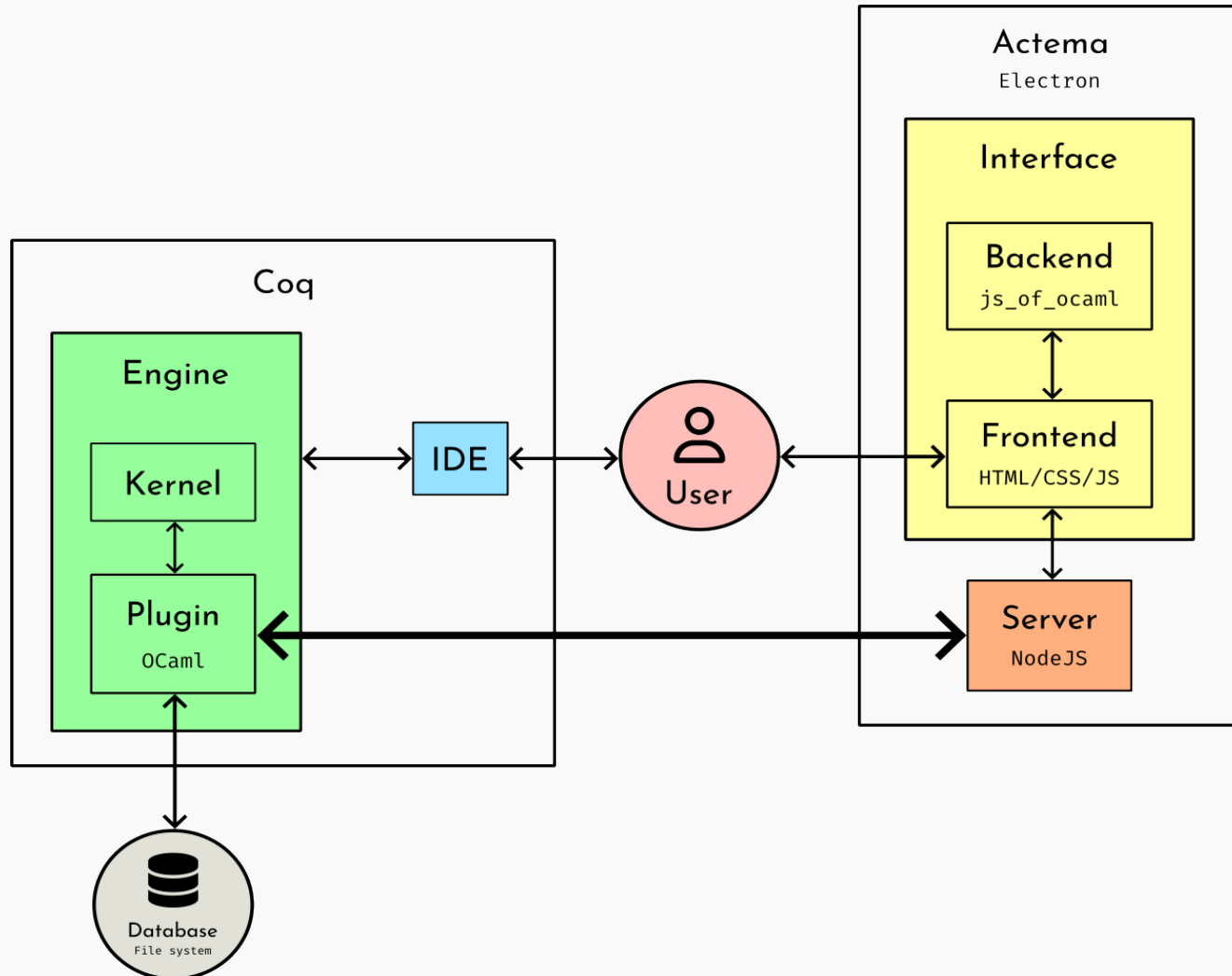
- Fully graphical: **no textual** proof language
- Both **spatial** and **temporal**:

proof = **gesture** sequence

- **Different modes** of reasoning with a **single “syntax”**:

Click \iff introduction/elimination

Drag-and-Drop \iff backward/forward



Semantics of Drag-and-Drop

Idea: bring matching subformulas through **switch** rules

$$\underline{A} \wedge B \oplus B \wedge (\underline{A} \vee C) \wedge D$$

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$$\text{switch} \left\{ \begin{array}{l} \underline{A} \wedge B \otimes B \wedge (\underline{A} \vee C) \wedge D \\ \rightarrow B \wedge (\underline{A} \wedge B \otimes (\underline{A} \vee C) \wedge D) \\ \rightarrow B \wedge (\underline{A} \wedge B \otimes \underline{A} \vee C) \wedge D \\ \rightarrow B \wedge ((\underline{A} \wedge B \otimes \underline{A}) \vee C) \wedge D \\ \rightarrow B \wedge ((B \Rightarrow \underline{A} \otimes A) \vee C) \wedge D \end{array} \right.$$

Idea: bring matching subformulas through **switch** rules

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 \end{array} \right. \\
 \text{identity} \left\{ \begin{array}{l}
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 \text{identity} \left\{ \rightarrow B \wedge ((B \Rightarrow \top) \vee C) \wedge D \right. \\
 \text{unit elimination} \left\{ \begin{array}{l}
 \rightarrow B \wedge (\top \vee C) \wedge D \\
 \rightarrow B \wedge \top \wedge D \\
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Variant of the **Calculus of Structures** (Guglielmi 1999)

$$\exists y. \forall x. \underline{R(x, y)} \otimes \forall a. \exists b. \underline{R(a, b)}$$

- **Unify** linked subformulas

$$\exists y. \forall x. \underline{R(x, y)} \otimes \forall a. \exists b. \underline{R(a, b)}$$

$$x \longmapsto a$$

$$y \longleftarrow b$$

- **Unify** linked subformulas
- **Check** for $\forall\exists$ **dependency cycles**

$$\exists y. \forall x. \underline{R(x, y)} \otimes \forall a. \exists b. \underline{R(a, b)}$$

$$x \longmapsto a$$

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- **Unify** linked subformulas
- **Check** for $\forall\exists$ **dependency cycles**
- **Switch** uninstantiated quantifiers

$$\begin{aligned} & \exists y. \forall x. \underline{R(x, y)} \otimes \forall a. \exists b. \underline{R(a, b)} \\ \rightarrow & \forall y. \left(\forall x. \underline{R(x, y)} \otimes \forall a. \exists b. \underline{R(a, b)} \right) \\ \rightarrow & \forall y. \forall a. \left(\forall x. \underline{R(x, y)} \otimes \exists b. \underline{R(a, b)} \right) \end{aligned}$$

$x \mapsto a$

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- **Unify** linked subformulas
- **Check** for $\forall\exists$ **dependency cycles**
- **Switch** uninstantiated quantifiers
- **Instantiate** unified variables

$$\begin{aligned}
 & \exists y. \forall x. \underline{R(x, y)} \otimes \forall a. \exists b. \underline{R(a, b)} \\
 \rightarrow & \forall y. \left(\forall x. \underline{R(x, y)} \otimes \forall a. \exists b. \underline{R(a, b)} \right) \\
 \rightarrow & \forall y. \forall a. \left(\forall x. \underline{R(x, y)} \otimes \exists b. \underline{R(a, b)} \right) \\
 \rightarrow & \forall y. \forall a. \left(\underline{\forall x. R(x, y)} \otimes \underline{R(a, y)} \right) \\
 \rightarrow & \forall y. \forall a. \left(\underline{R(a, y)} \otimes \underline{R(a, y)} \right) \\
 \rightarrow^* & \top
 \end{aligned}$$

$$x \longmapsto a$$

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- **Unify** linked subformulas

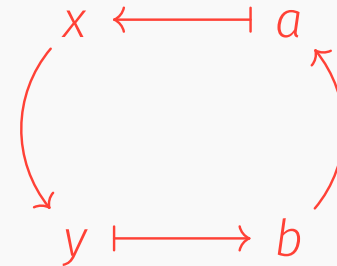
$$\forall a. \exists b. \underline{R(a, b)} \otimes \exists y. \forall x. \underline{R(x, y)}$$

$$x \longleftarrow \vdash a$$

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- **Unify** linked subformulas
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×

Add 4 rules \implies `rewrite` tactic for free!

$$\underline{t} = u \otimes A \rightarrow A[u/t]$$

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Compositional with semantics of **connectives**:

- **Quantifiers:** rewrite modulo *unification*
- **Implication:** *conditional* rewrite
- **Arbitrary** combinations are possible:

$$\begin{array}{l} \forall x. x \neq 0 \implies \underline{f(x)} = g(x) \otimes \exists y. A(\underline{f(y)}) \vee B(y) \\ \rightarrow^* \exists y. (y \neq 0 \wedge A(g(y))) \vee B(y) \end{array}$$

Completeness

Add the following rules:

- **Init** $C^+ \boxed{A \Rightarrow B} \rightarrow C^+ \boxed{A \otimes B}$ $C^- \boxed{A \wedge B} \rightarrow C^- \boxed{A \ast B}$
- **Release** $C^+ \boxed{A \otimes B} \rightarrow C^+ \boxed{A \Rightarrow B}$ $C^- \boxed{A \ast B} \rightarrow C^- \boxed{A \wedge B}$
- **Contraction** $C^- \boxed{A} \rightarrow C^- \boxed{A \wedge A}$

Theorem (Completeness): If $\Gamma \vdash A$ is provable in sequent calculus, then

$$\bigwedge \Gamma \Rightarrow A \rightarrow^* \top$$

Conclusion

- coq-actema still in development, but *already usable*
 - ↳ follow install instructions on [GitHub](#)!
- Based on the solid proof theory of **subformula linking**
- Next step: exposure to *real users*
 - ▶ **Beginners/students:** introductory logic/proof assistants course
 - ▶ **Experts:** real maths codebases

Iconic Manipulations

Bubble Calculi

The chemical metaphor

Item	\iff	Ion
Color	\iff	Polarity
Logical connective	\iff	Chemical bond
Click	\iff	Heating
Drag-and-Drop	\iff	Bimolecular reaction

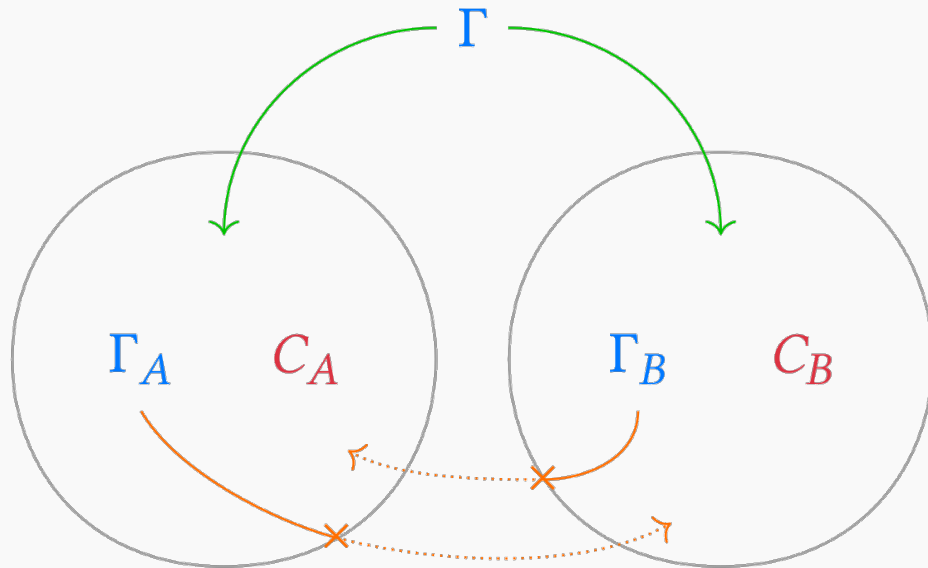
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Breaks on rules that create **subgoals** (e.g. click on \wedge)

Bubbles

Natural way to depict **context scoping**



Two main inspirations:

- The **chemical abstract machine** (Berry and Boudol 1989)
- **Nested sequents** (Brünnler 2009)

Example proof

$$(A \vee B \Rightarrow C) \Rightarrow (A \Rightarrow C) \wedge (B \Rightarrow C)$$

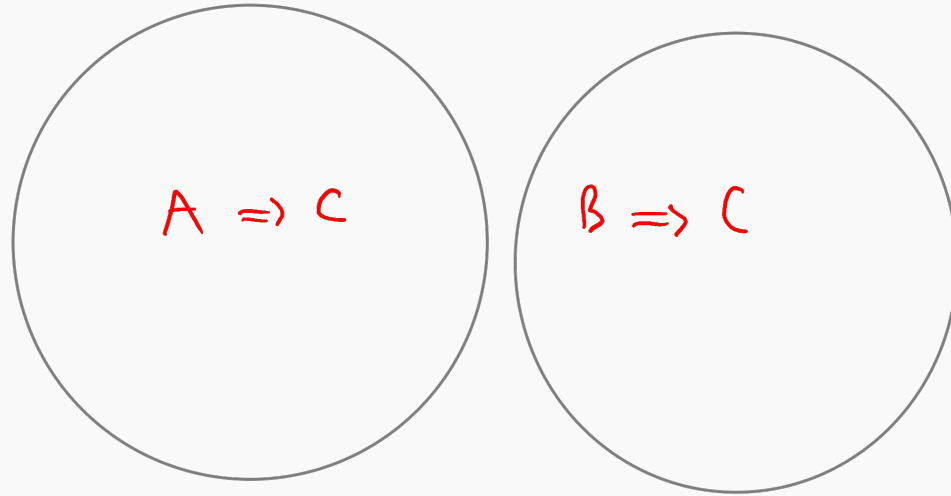
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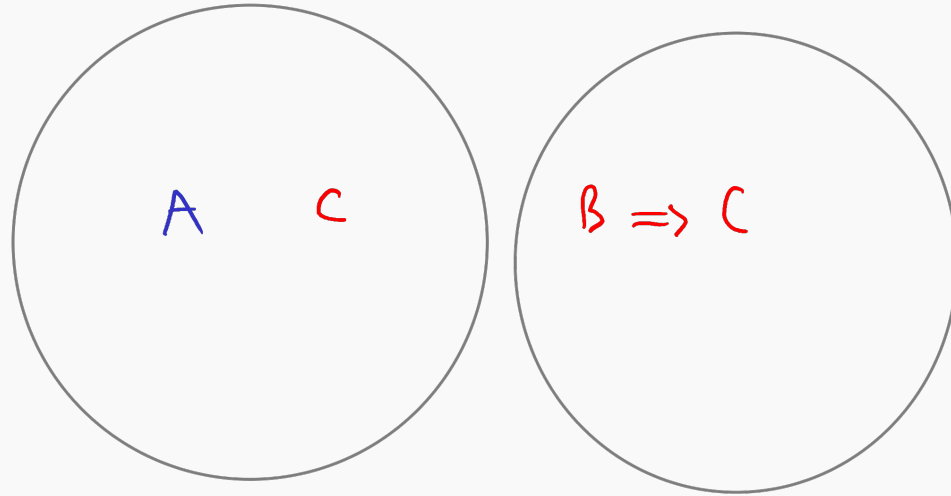
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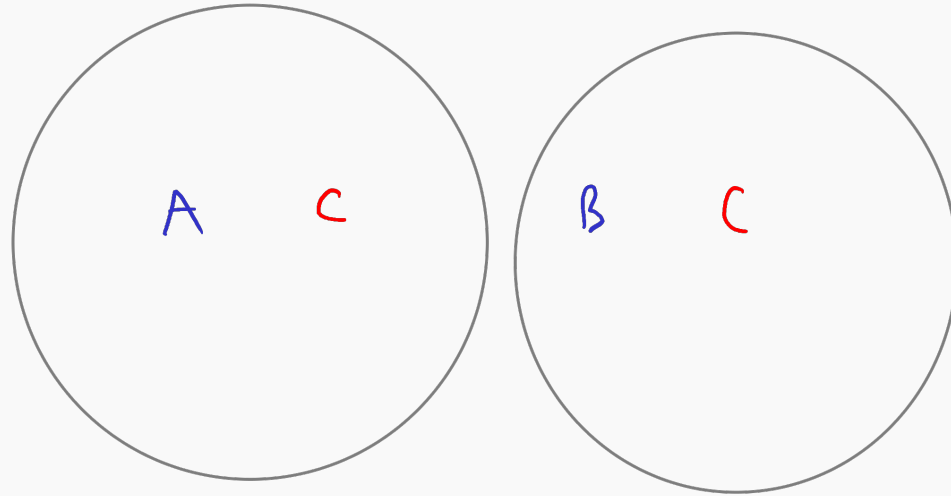
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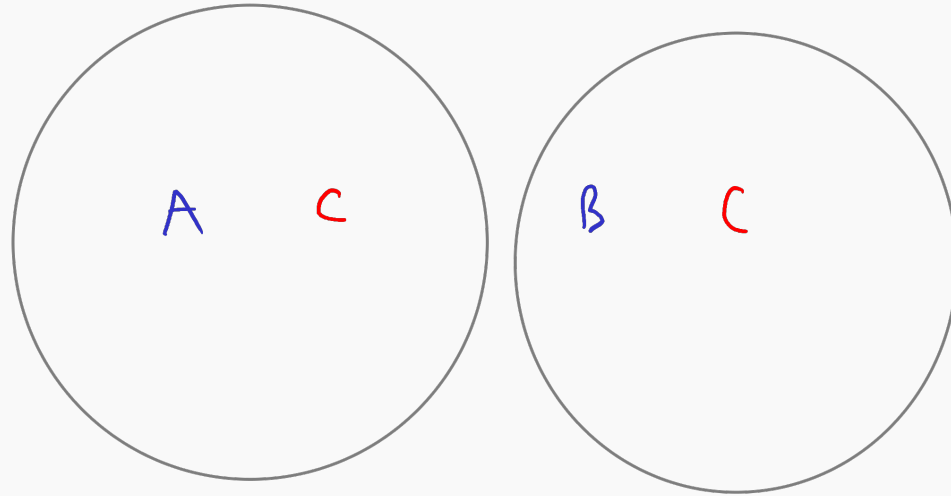
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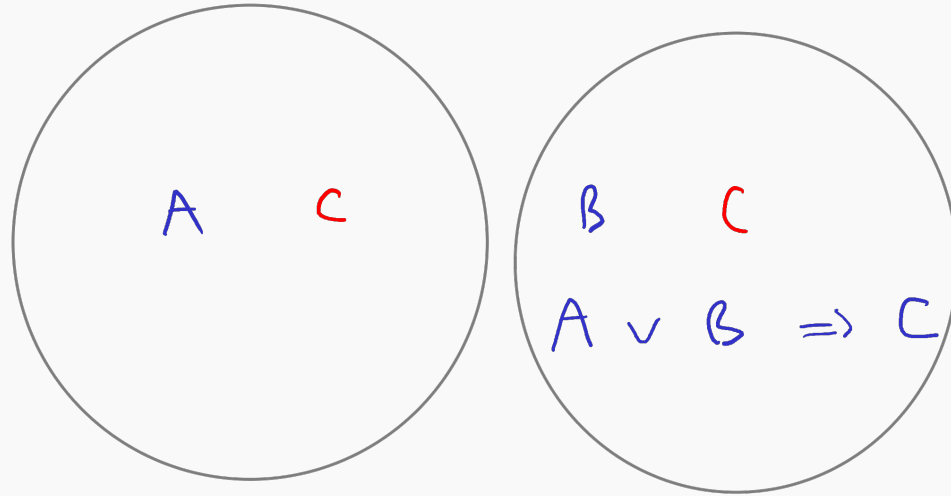
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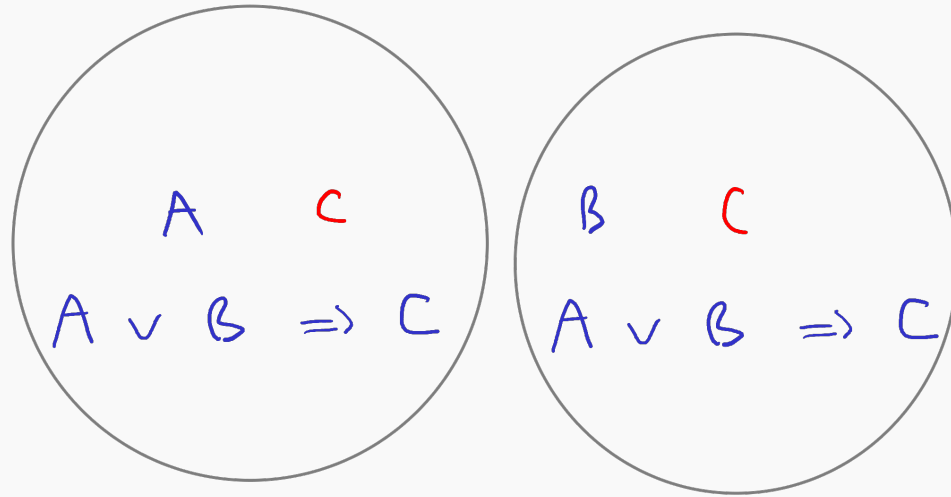


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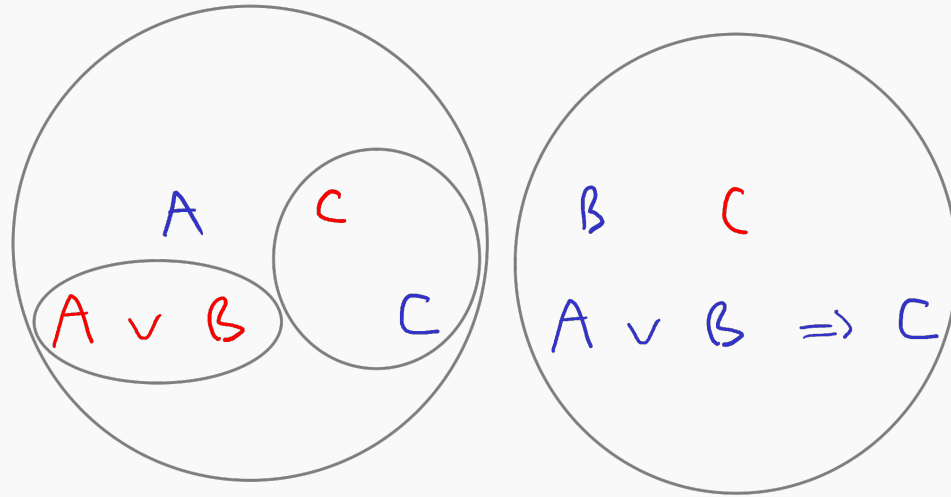
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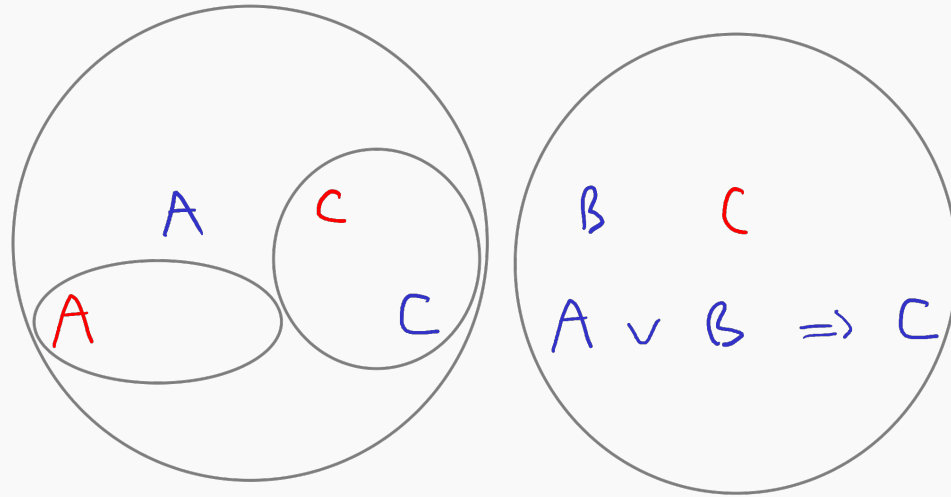
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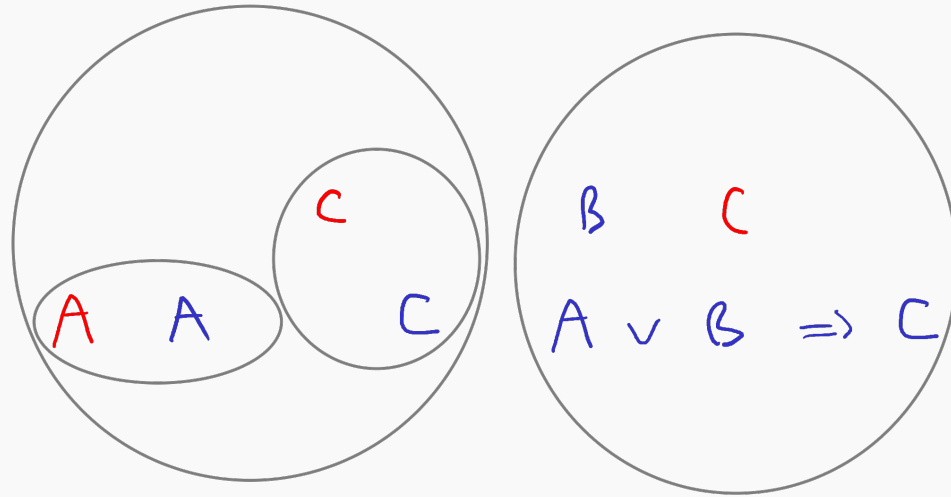
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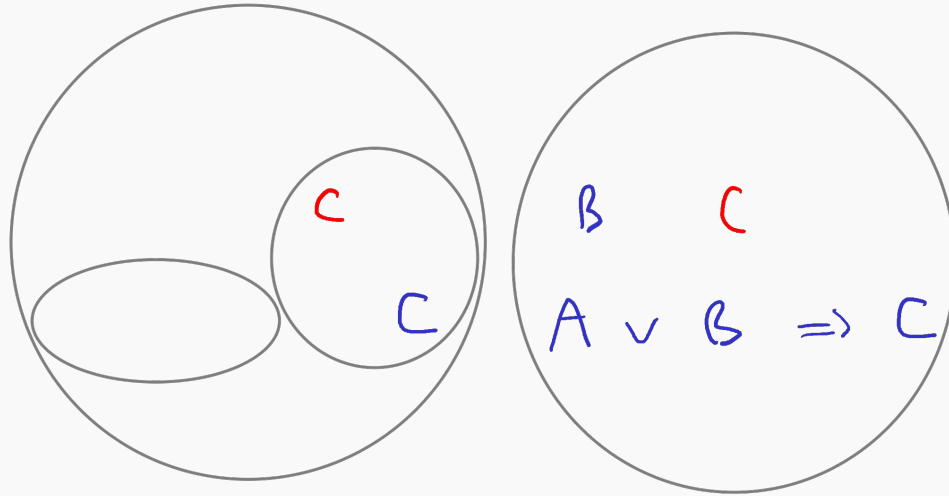
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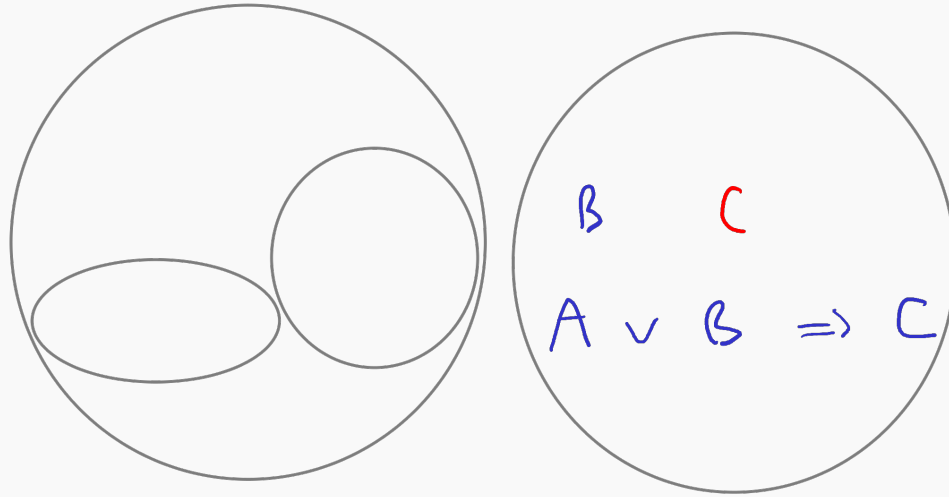
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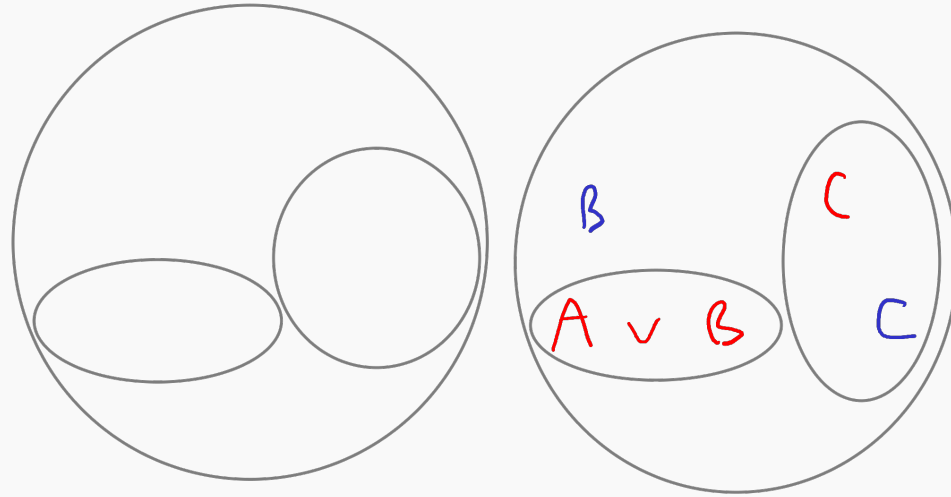
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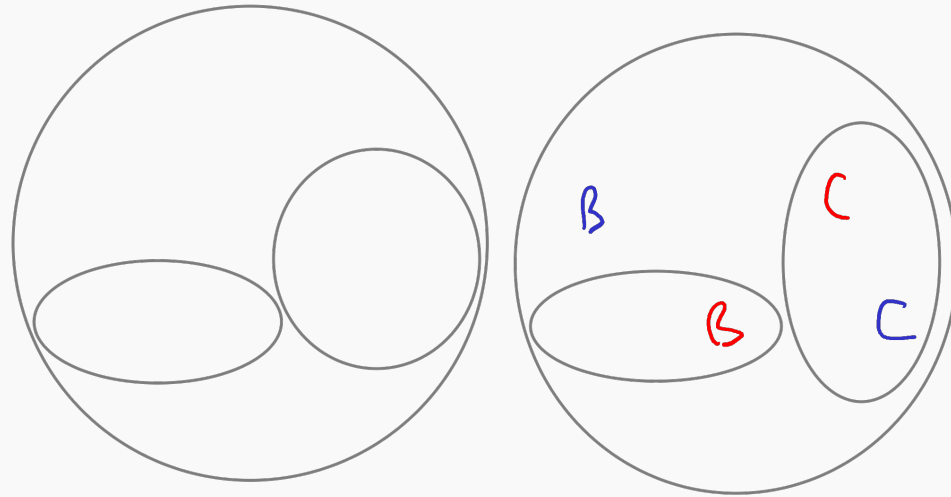
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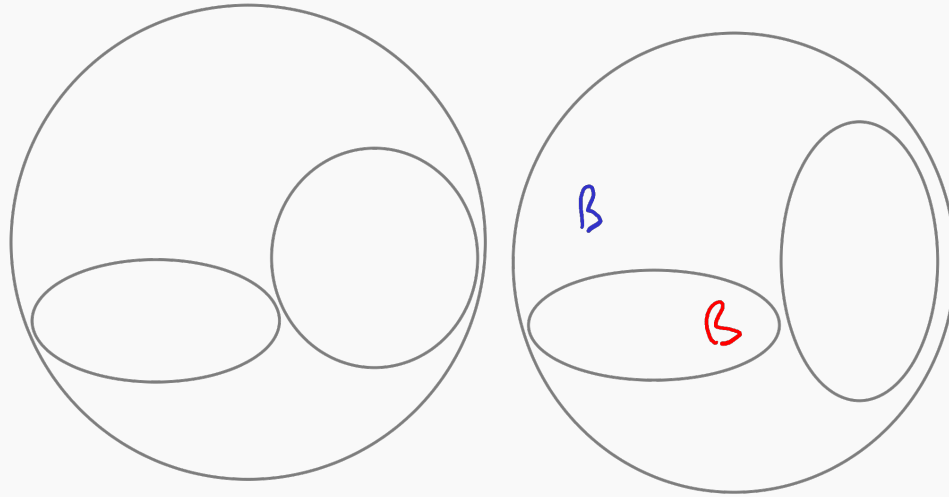
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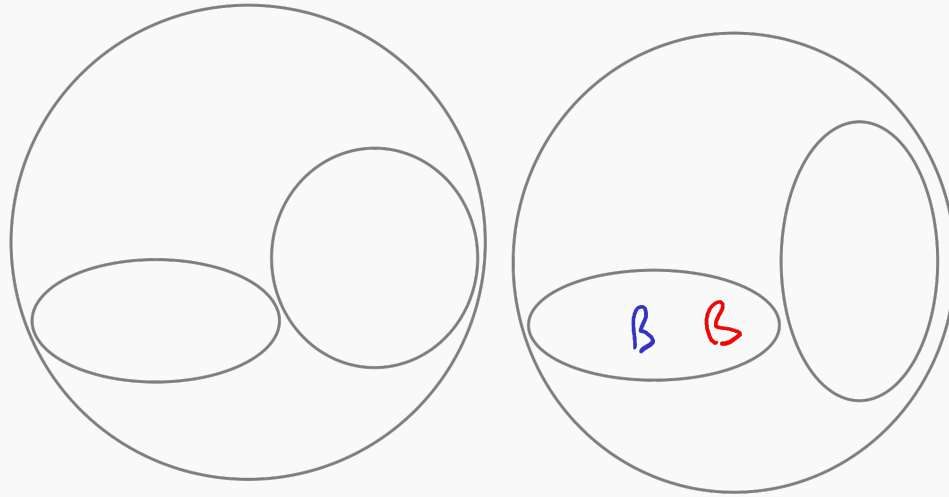
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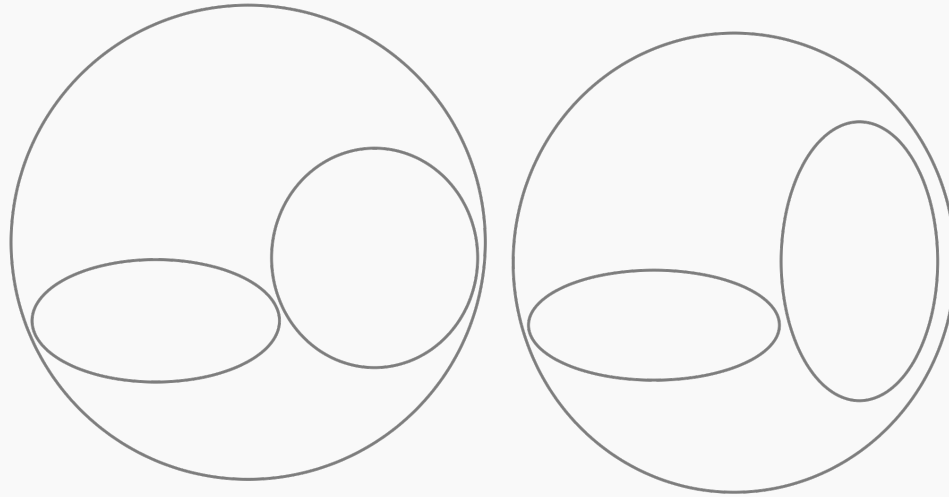
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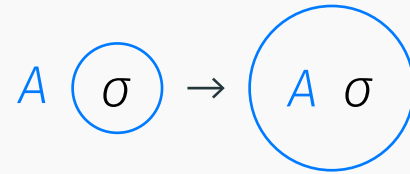
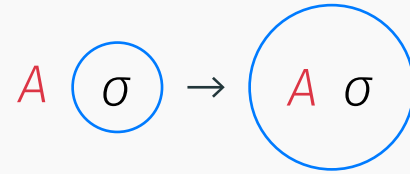
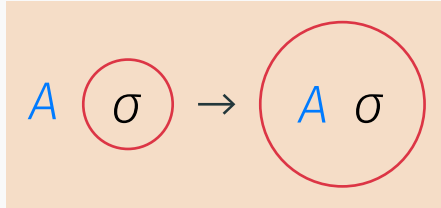


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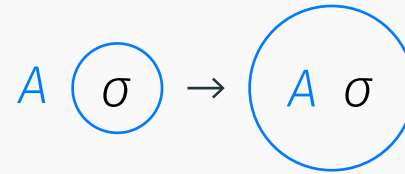
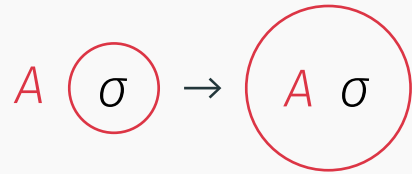
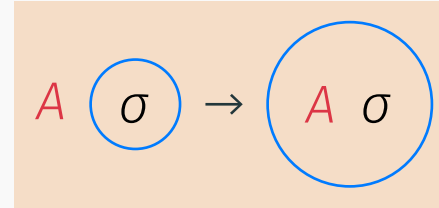
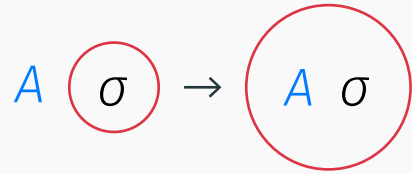
Example proof

Polarized bubbles



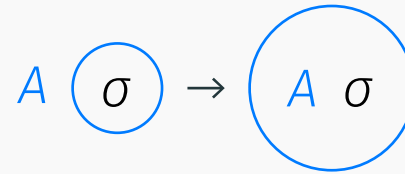
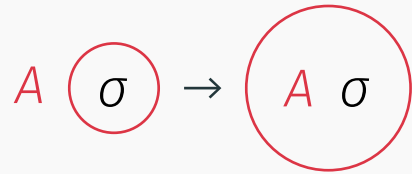
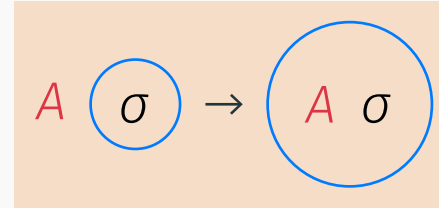
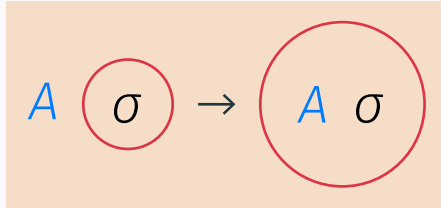
Intuitionistic logic

Polarized bubbles



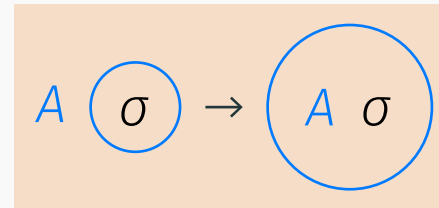
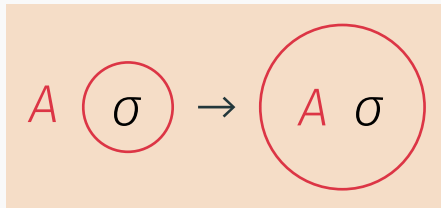
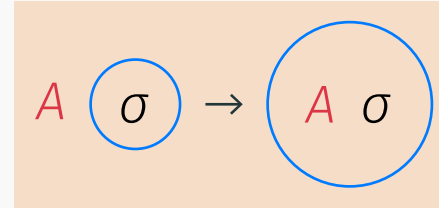
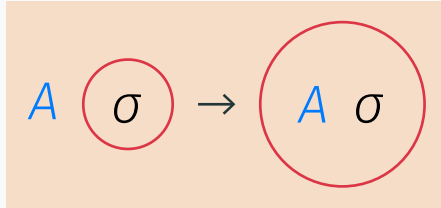
Dual-intuitionistic logic

Polarized bubbles



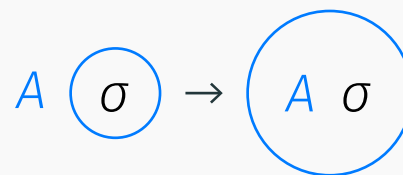
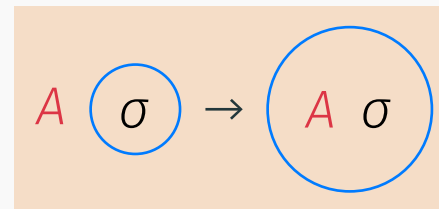
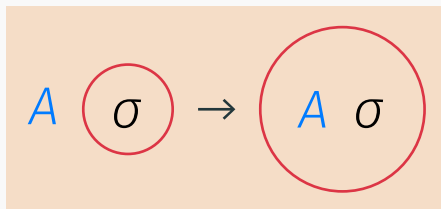
Bi-intuitionistic logic

Polarized bubbles



Classical logic

Polarized bubbles



*Intuitionism = same polarities **repel** each other*

Flower Calculus

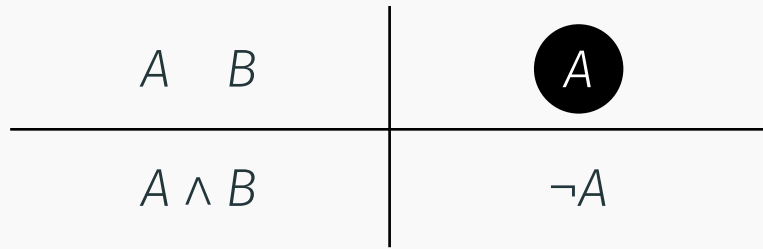
Bubble calculi are not **fully iconic** (need for *symbolic* connectives)

Polarity meets Space

Bubble calculi are not **fully iconic** (need for *symbolic* connectives)

Key insight: **space** is *polarized*, not **objects**

- **Diagrammatic** proof system invented by C. S. Peirce around 1890
- **Topological** representation of **negation** as nested “cuts” (Jordan curves):

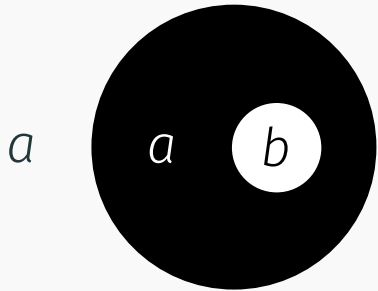


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Illative transformations

Inference rules on **locations**



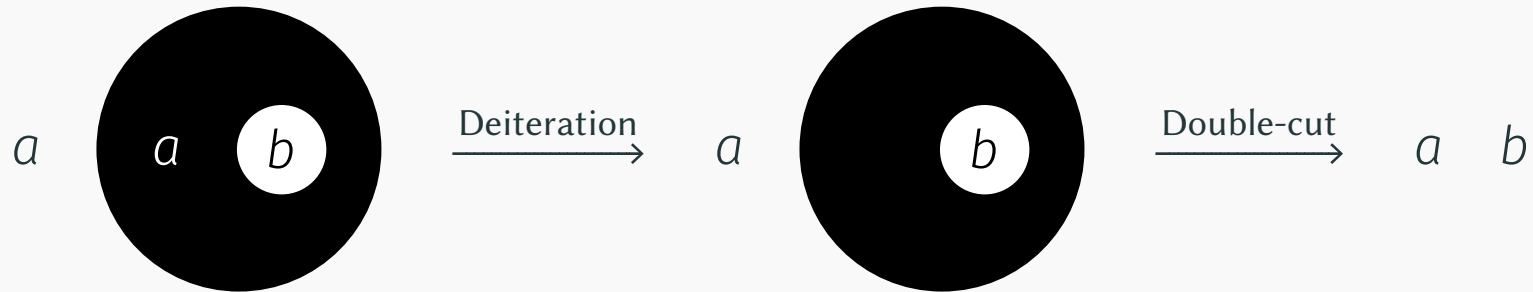
Illative transformations

Inference rules on **locations**



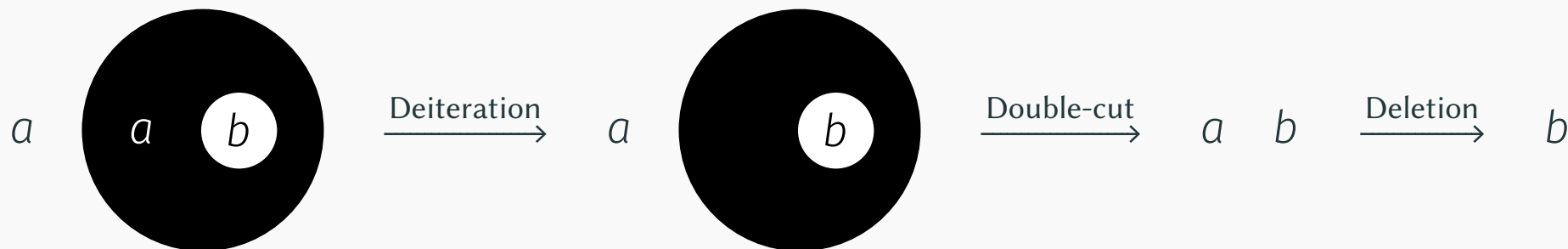
Illative transformations

Inference rules on **locations**

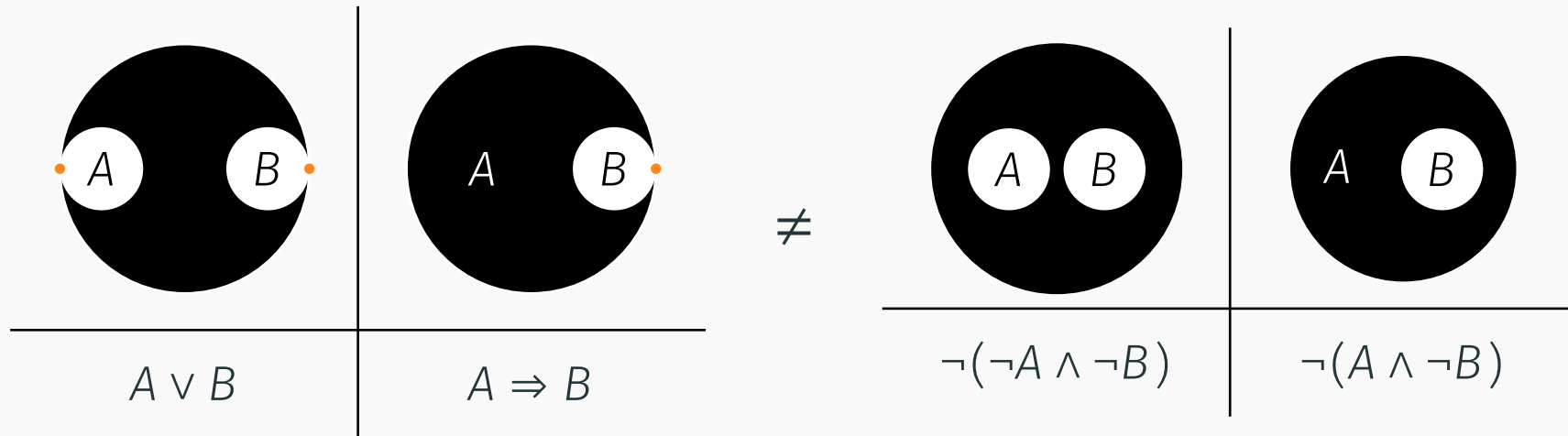


Illative transformations

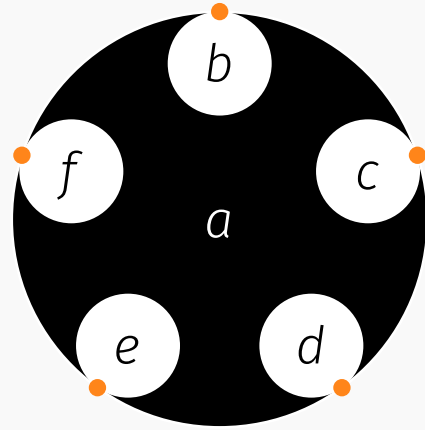
Inference rules on **locations**



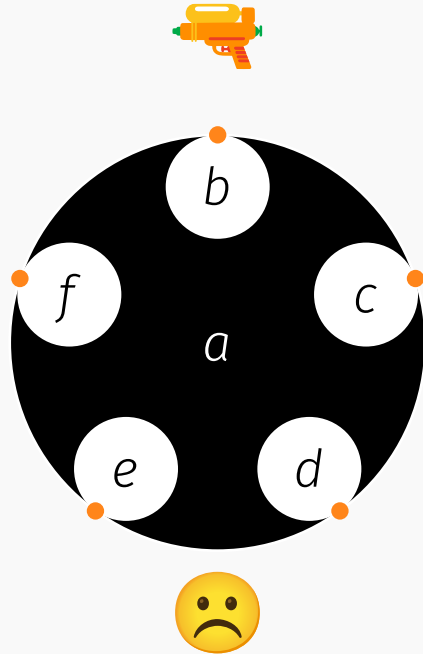
- Topological representation of **implication** with Peirce's "scroll"
- Scroll = **continuously** joined nested cuts:



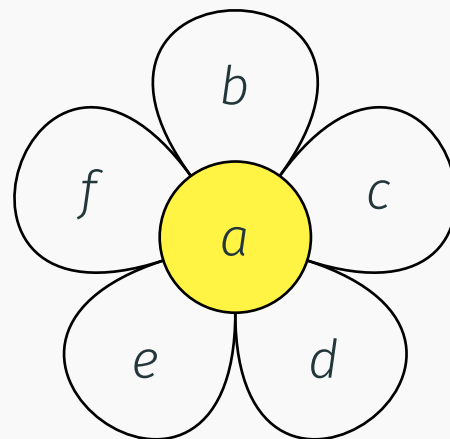
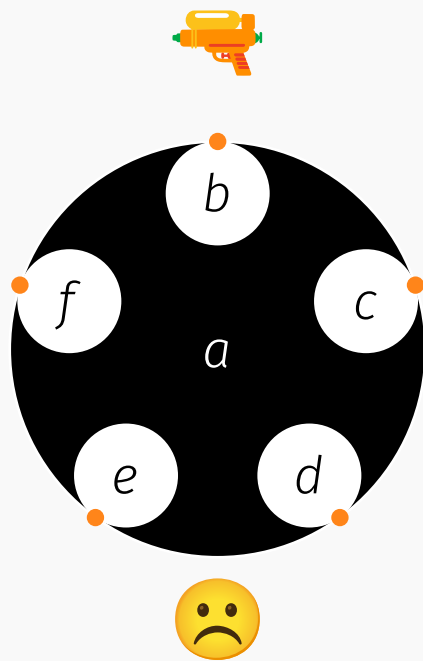
Blooming



Blooming

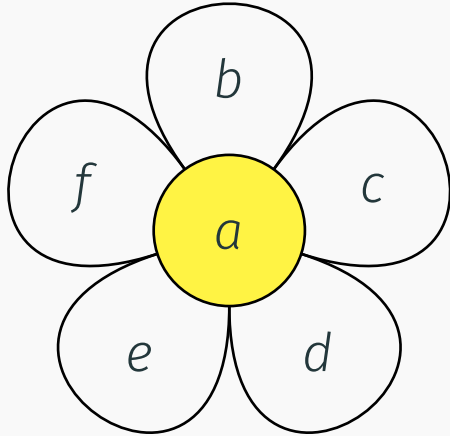
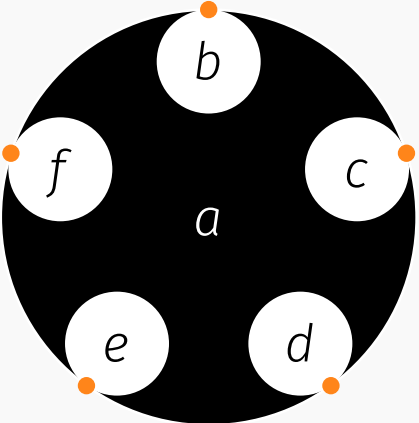


Blooming



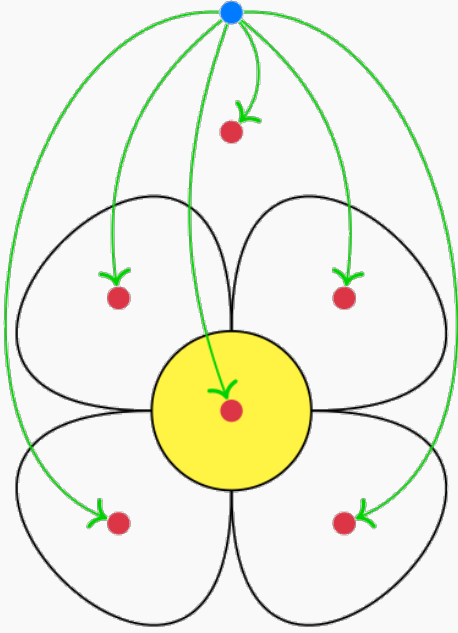
Turn inloops into petals.

Blooming

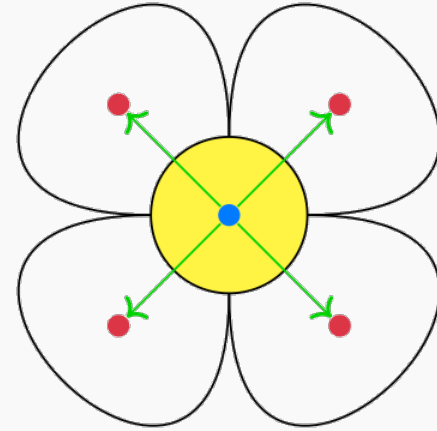


"Make love, not war"

Pollination

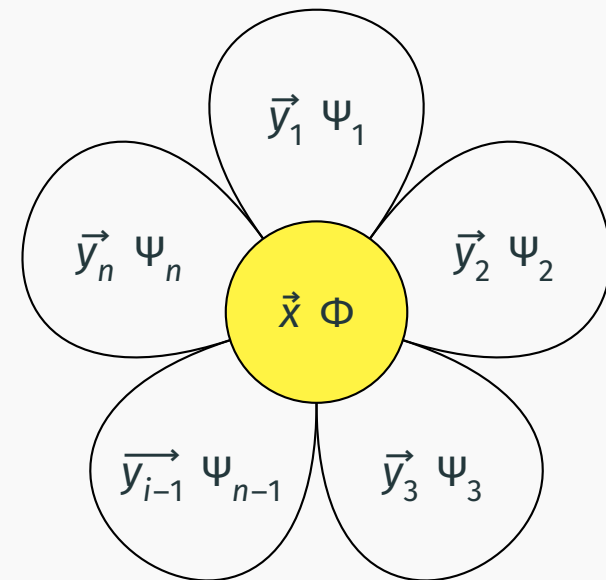


Cross-pollination



Self-pollination

- Support for **quantification** with *binders* \vec{x}
- Interpretation as **geometric** formulas from *topos theory*
- Inference rules divided in two fragments:
 - **Nature** ✿ = **analytic** and invertible
 - **Culture** ✂ = non-invertible



$$\forall \vec{x}. \left(\bigwedge \Phi \Rightarrow \bigvee_i \exists \vec{y}_i. \Psi_i \right)$$

Theorem (Analytic completeness): If a flower is *valid* (i.e. true in every Kripke model), then it is ✿ -provable.

GUI in the Proof-by-Action paradigm based on the flower calculus

- Represent flowers as nested **boxes**
- **Modal interface** to interpret gestural actions:

Proof mode \iff Natural (invertible and analytic) rules

Edit mode \iff Cultural (non-invertible) rules

Navigation mode \iff Contextual closure (functoriality)

Thank you!

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