

On Functional Interpretations and Applied Proof Theory

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Plan

- Motivation

Proof Mining: What more can we learn from a proof?

- Tools I: Functional interpretations

Compositionality and uniformity

- Tools II: Negative translations

Selection functions and backtracking

- Classical arithmetic and analysis

Induction, comprehension, choice and bar recursion



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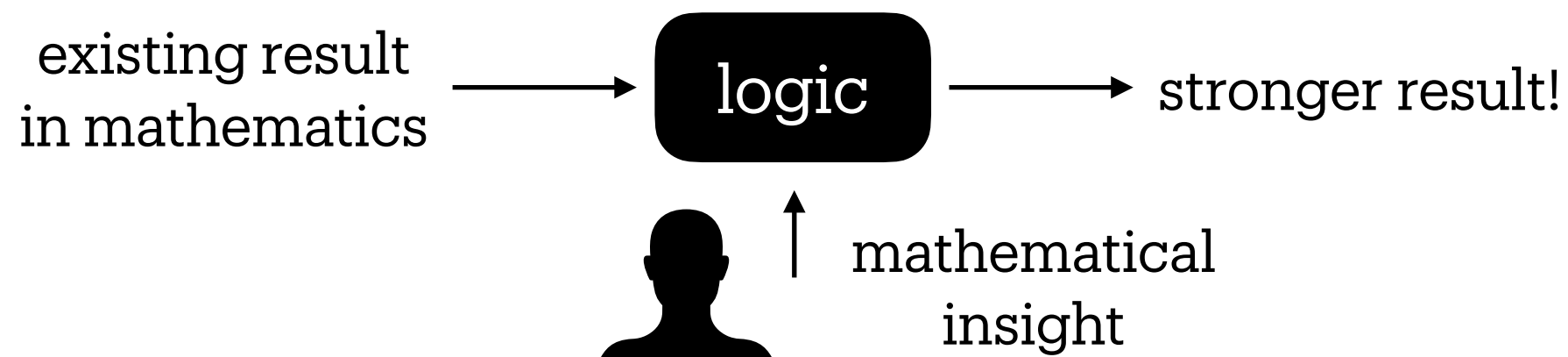


Unwinding of Proofs / Proof Mining

- Originated in 1950s with **Kreisel's** applications of his **no-counterexample interpretation**
- Resurgence from 1990s with **Kohlenbach's** applications of his **monotone functional interpretation**

Proof Mining (Kohlenbach).

Proof mining is the process of logically analysing (ineffective) proofs in mathematics with the aim of obtaining **new information**.



$$\sqrt{2} \notin \mathbb{Q}$$

$$\sqrt{2} \notin \mathbb{Q}$$

$$\forall p, q \in \mathbb{N} \left(\frac{p}{q} \neq \sqrt{2} \right)$$

$$\forall p, q \in \mathbb{N} \exists \varepsilon > 0 \left(\left| \frac{p}{q} - \sqrt{2} \right| \geq \varepsilon \right)$$



Theorem.

$$\sqrt{2} \notin \mathbb{Q}$$

Proof. (qualitative/soft mathematics)

Suppose (1) p, q coprimes

Suppose (2) $\sqrt{2} = p/q$

By (2), $2q^2 = p^2$, so $p = 2p'$ (even)

Hence, $2q^2 = 4(p')^2$

So, $q = 2q'$ (also even)

By (1), a contradiction. $\square$

Theorem.

$$|\sqrt{2} - p/q| \geq 1/4q^2$$

Proof. (quantitative/hard mathematics)

Suppose (1) $2q > p > q$ not both even

Then $2q^2 \neq p^2$ (see qualitative proof)

So $|2q^2 - p^2| \geq 1$

Since (easy to derive)

($\dagger$) $|a^2 - b^2| \geq \delta \rightarrow |a - b| \geq \delta/(a + b)$

we get

$$|\sqrt{2}q - p| \geq 1/(\sqrt{2}q + p) \geq 1/4q$$

That concludes the proof. $\square$

Theorem.

$$\sqrt{2} \notin \mathbb{Q}$$

Theorem.

$$|\sqrt{2} - p/q| \geq 1/4q^2$$

Proof. (qualitative/soft mathematics)

$$\frac{p, q \text{ coprime}}{\perp}$$

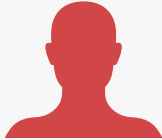
$$\frac{\frac{[\sqrt{2} = p/q]_\alpha}{\frac{2q^2 = p^2}{\dots}}}{p, q \text{ even}} \quad (\alpha)$$

$$\sqrt{2} \neq p/q$$

Proof. (quantitative/hard mathematics)

$$\frac{p, q \text{ not both even}}{\dots}$$

$$2q^2 \neq p^2$$



$$\frac{|2q^2 - p^2| \geq 1}{|\sqrt{2} - p/q| \geq 1/4q^2} \quad (\star)$$

($\star$) new mathematical insight

Proof Mining

- [1992] Chebyshev Approximation (Kohlenbach)
- [2001] L_1 Approximation (Kohlenbach/O.)
- [2000s] Fixed-point Theory
(Kohlenbach, Lambov, Gerhardy, Briseid, Leuştean,...)
- [2010s] Ergodic Theory
(Avigad, Gerhardy, Towsner, Kohlenbach, Leuştean, Safarik,...)
- [2010s] Combinatorics (Kreuzer)
- [2010-2020s] Fixed-point Theory
(Kohlenbach, Ferreira, Leuştean, Sipoş, Nicolae, Dinis, Pinto,...)
- [2020s] Probability Theory (Arthan, O., Pischke, Neri, Powell,...)

<https://sites.google.com/view/proofmining>

https://nicholaspischke.github.io/bib/ref_date.html



“Completing” Statements

$\sqrt{2}$ not rational

$$\forall p, q^{\mathbb{N}} \quad (\sqrt{2} \neq p/q)$$

Uniform continuity

$$\forall \varepsilon > 0 \quad (\exists \delta > 0 \quad \forall x, y \quad (|x - y| < \delta \rightarrow |f(x) - f(y)| < \varepsilon))$$

Convergence

$$\forall \varepsilon > 0 \quad (\exists n \quad \forall i \geq n \quad (|x_i - c| < \varepsilon))$$

Uniqueness of solution

$$\forall x_1, x_2 \quad (f(x_1) = 0 \wedge f(x_2) = 0 \rightarrow x_1 = x_2)$$

Modulus of distance Δ

$$\forall p, q^{\mathbb{N}} \quad (|\sqrt{2} - p/q| \geq \Delta(p, q))$$

Modulus of uniform continuity Φ

$$\forall \varepsilon > 0 \quad \forall x, y \quad (|x - y| < \Phi(\varepsilon) \rightarrow |f(x) - f(y)| < \varepsilon)$$

Modulus of convergence Ψ

$$\forall \varepsilon > 0 \quad \forall i \geq \Psi(\varepsilon) \quad (|x_i - c| < \varepsilon)$$

Modulus of uniqueness Θ

$$\forall x_1, x_2 \quad \forall \varepsilon > 0 \quad (|f(x_1)|, |f(x_2)| < \Theta(\varepsilon) \rightarrow |x_1 - x_2| < \varepsilon)$$



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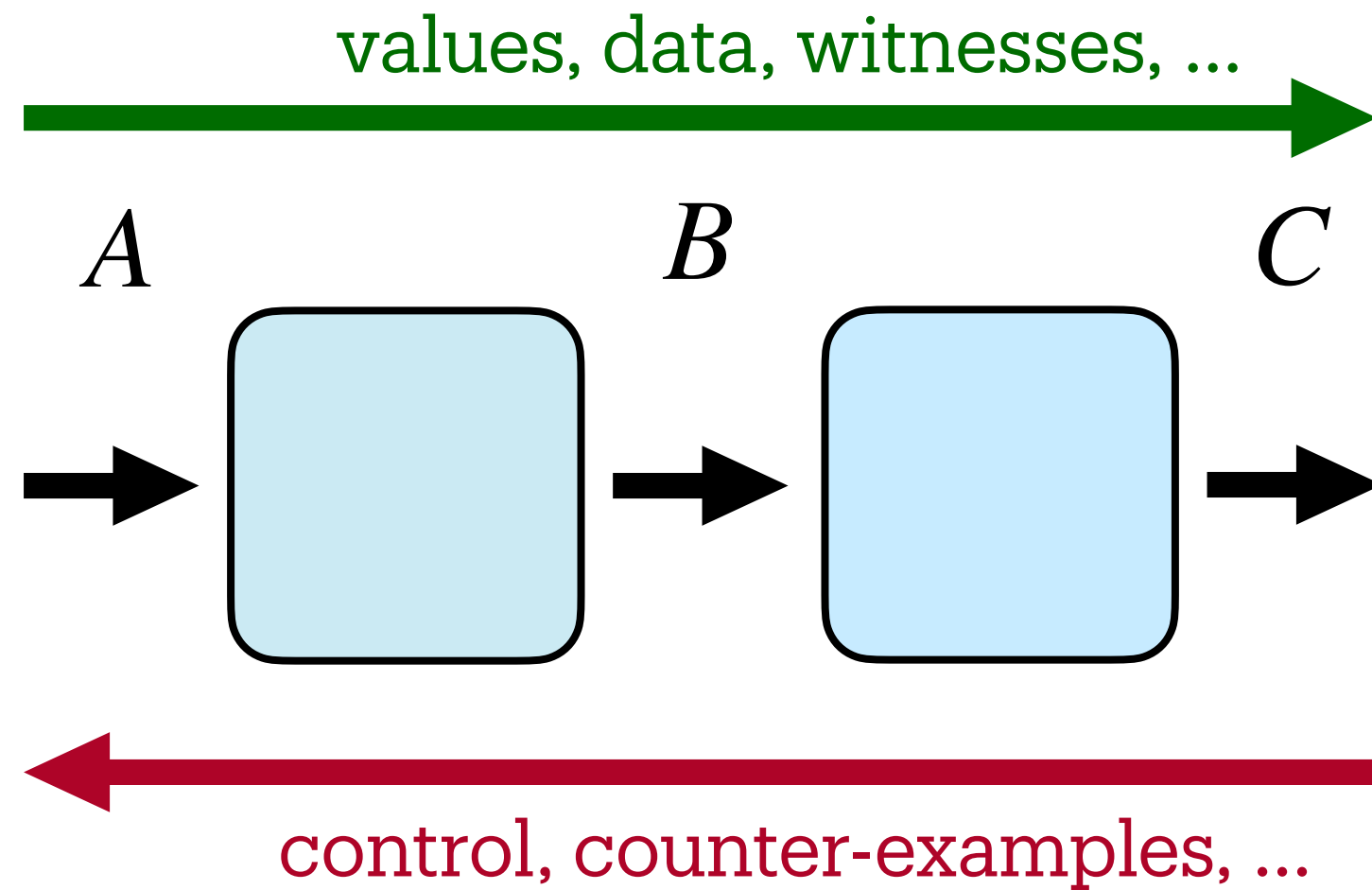
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Functional Interpretations

Turn logical dependence into functional dependence



Functional Interpretations

Definition.

Functional interpretations associate formulas A to triples $(A^+, A^-, |A| \subseteq A^+ \times A^-)$

- A^+ is the set/type of evidence for A
- A^- is the set/type of counter-evidence for A
- $|A|_y^x$ determines whether evidence $x \in A^+$ wins against counter-evidence $y \in A^-$

Games.

Think of $(A^+, A^-, |A|_y^x)$ as a **game**

- A^+ strategies for Eloise
- A^- strategies for Abelard
- $|A|_y^x$ who wins, for $x \in A^+, y \in A^-$

Example ($\sqrt{2} \notin \mathbb{Q}$ game).

$$A \equiv \forall p, q \in \mathbb{N} \exists \varepsilon > 0 (|p/q - \sqrt{2}| \geq \varepsilon)$$

- $A^+ \equiv \mathbb{N}^2 \rightarrow \mathbb{Q}^+$
- $A^- \equiv \mathbb{N}^2$
- $|A|_{p,q}^f \equiv |p/q - \sqrt{2}| \geq f(p, q)$



Functional Interpretations

Definition.

Functional interpretations associate formulas A to triples $(A^+, A^-, |A| \subseteq A^+ \times A^-)$

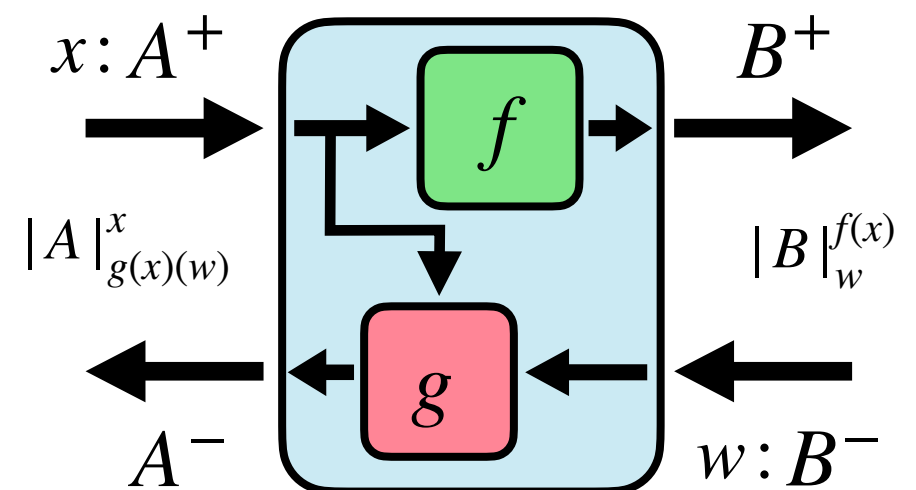
- A^+ is the set/type of evidence for A
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- $|A|_y^x$ determines whether evidence $x \in A^+$ wins against counter-evidence $y \in A^-$

Definition (Interpreting implication).

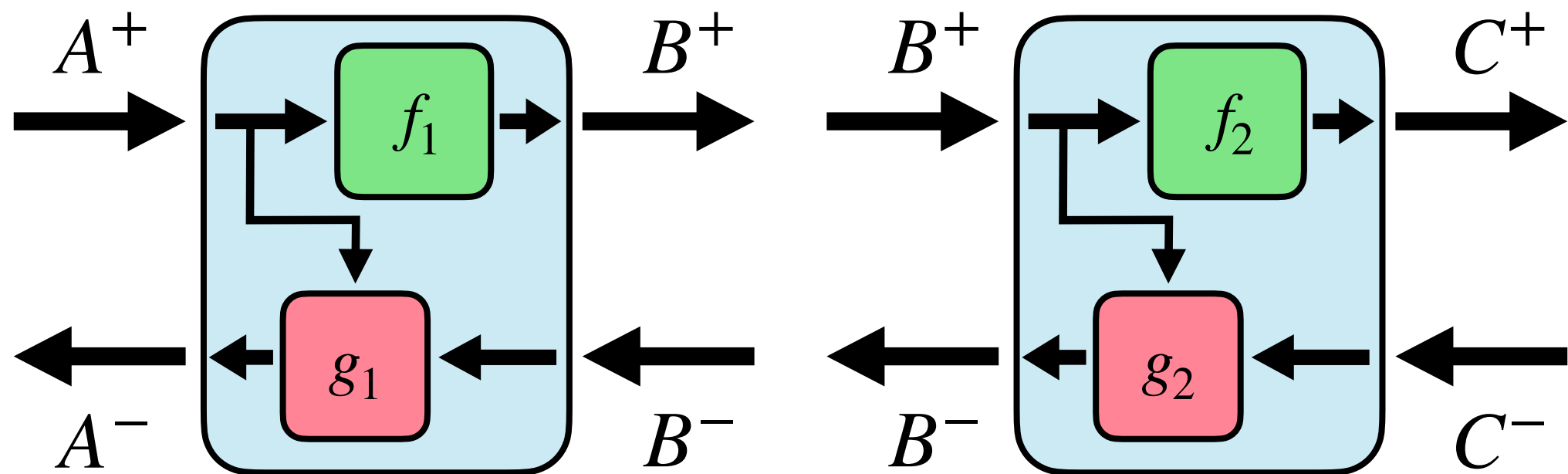
Implication $A \rightarrow B$ is interpreted as a pair of maps:

- $f: A^+ \rightarrow B^+$ (evidence map)
- $g: A^+ \rightarrow B^- \rightarrow A^-$ (counter-evidence map)
- for $x \in A^+$ and $w \in B^-$, we must have

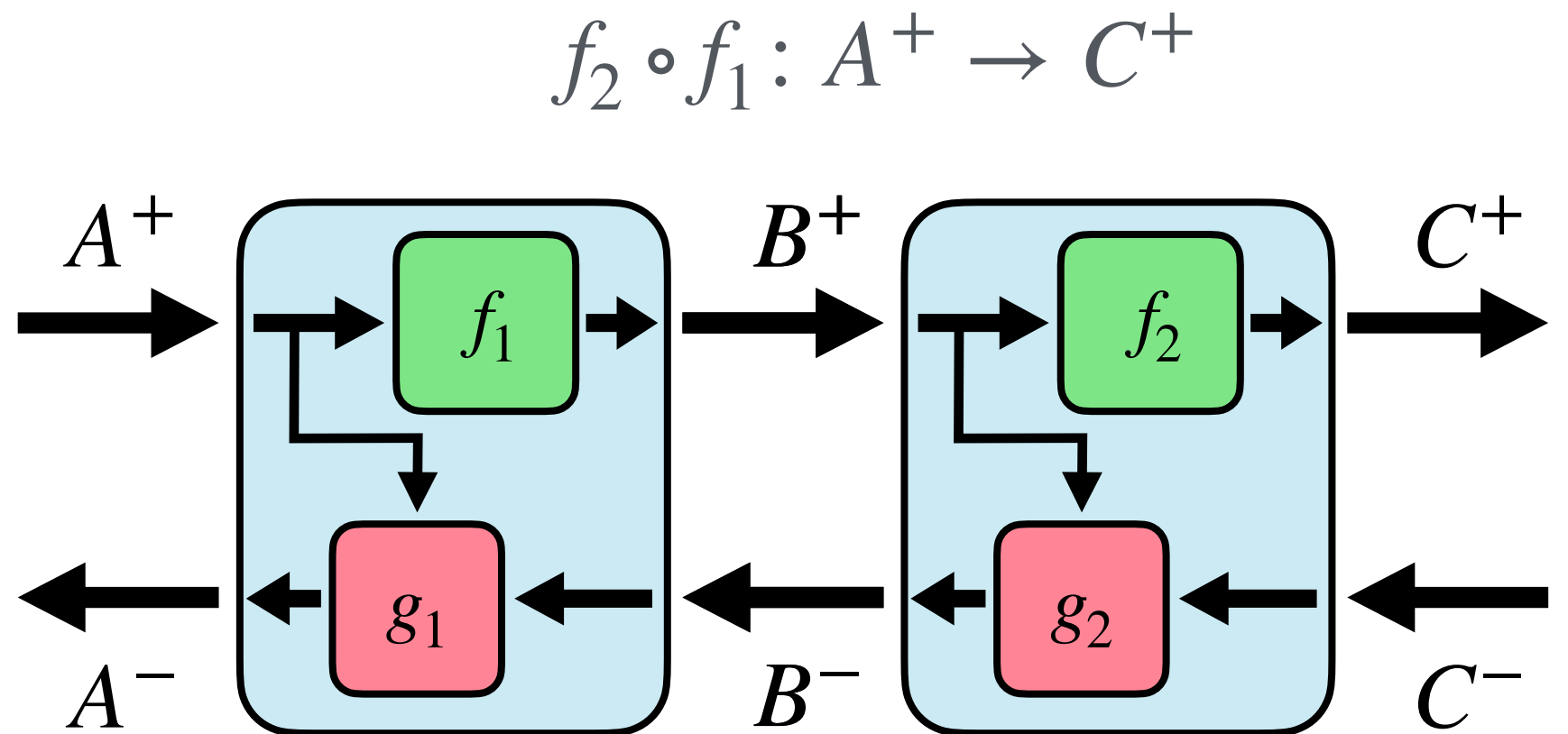
$$|A|_{g(x)(w)}^x \rightarrow |B|_w^{f(x)}$$



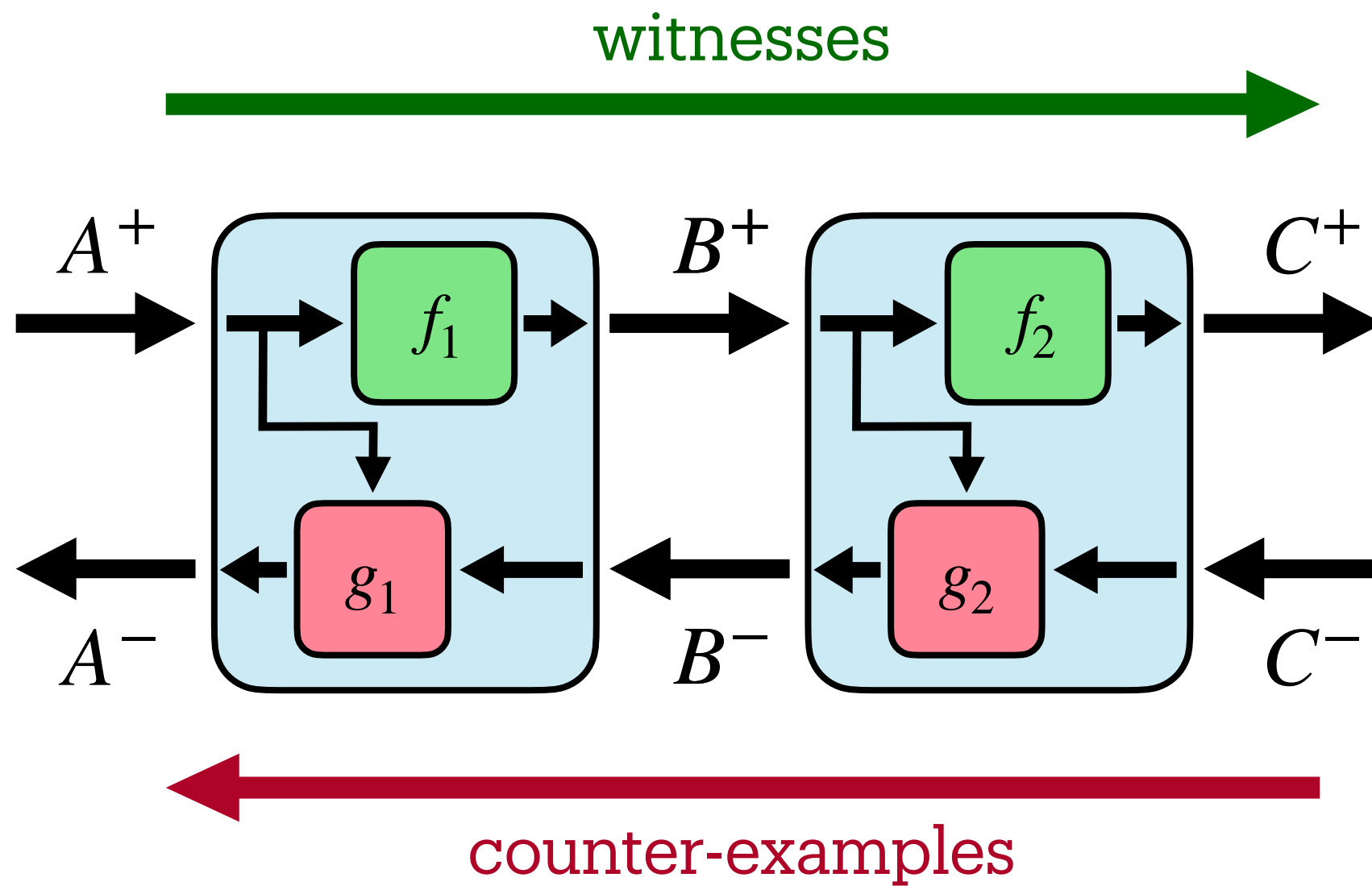
Composition



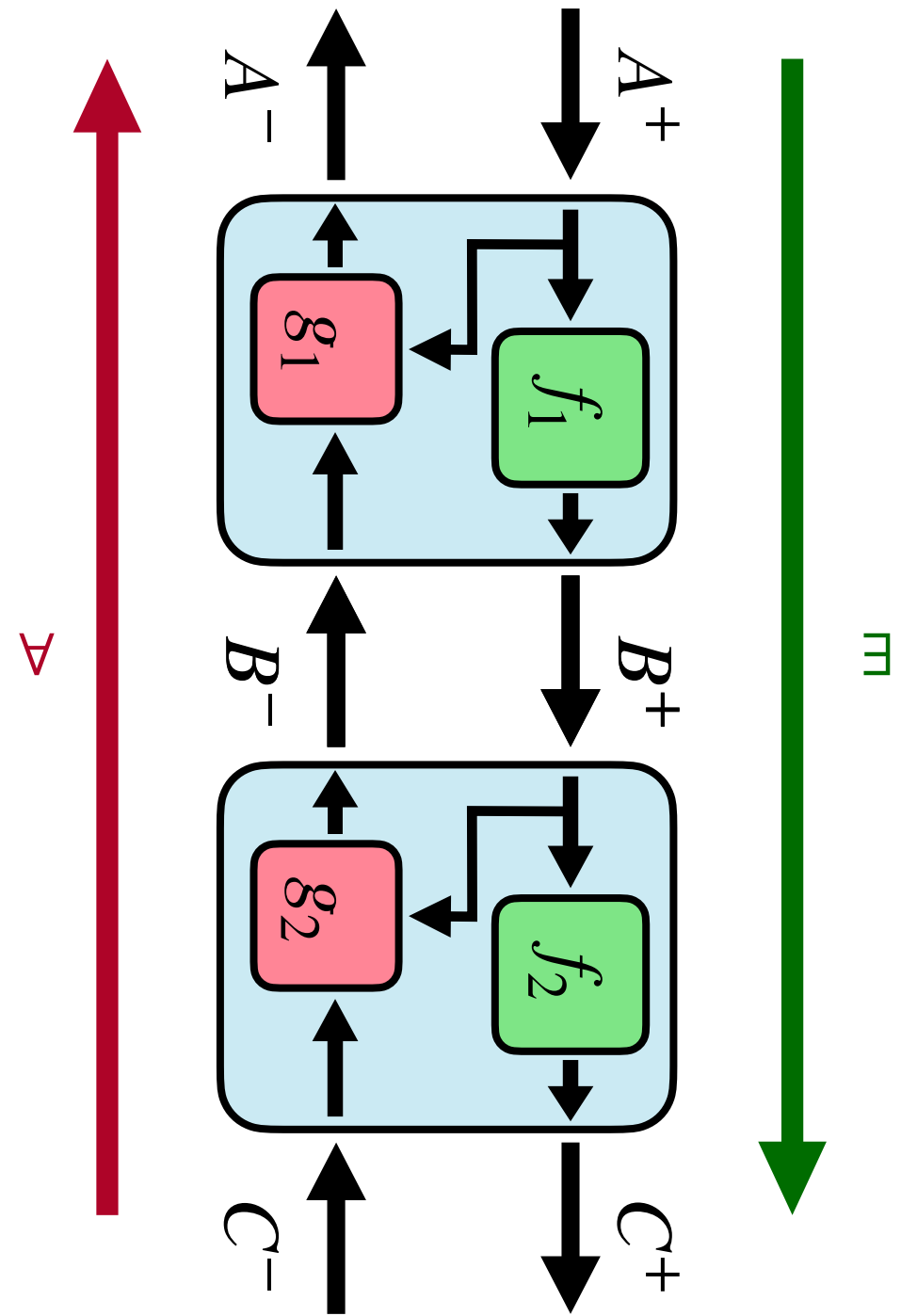
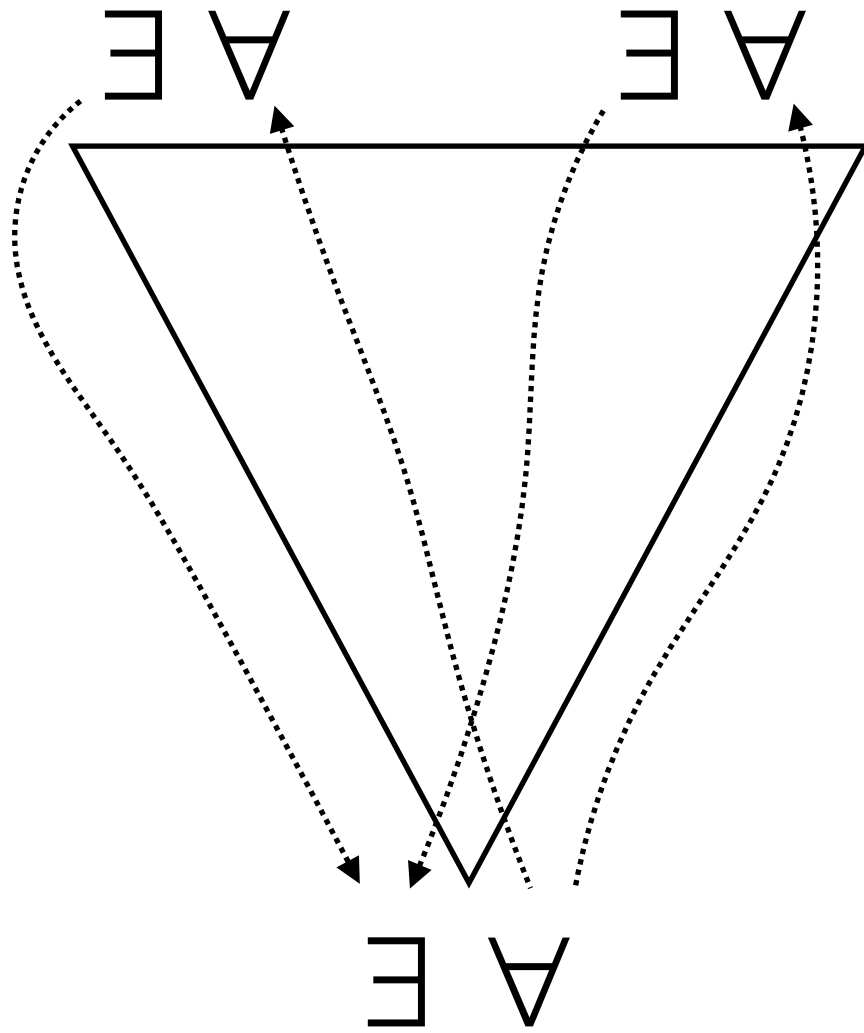
Composition



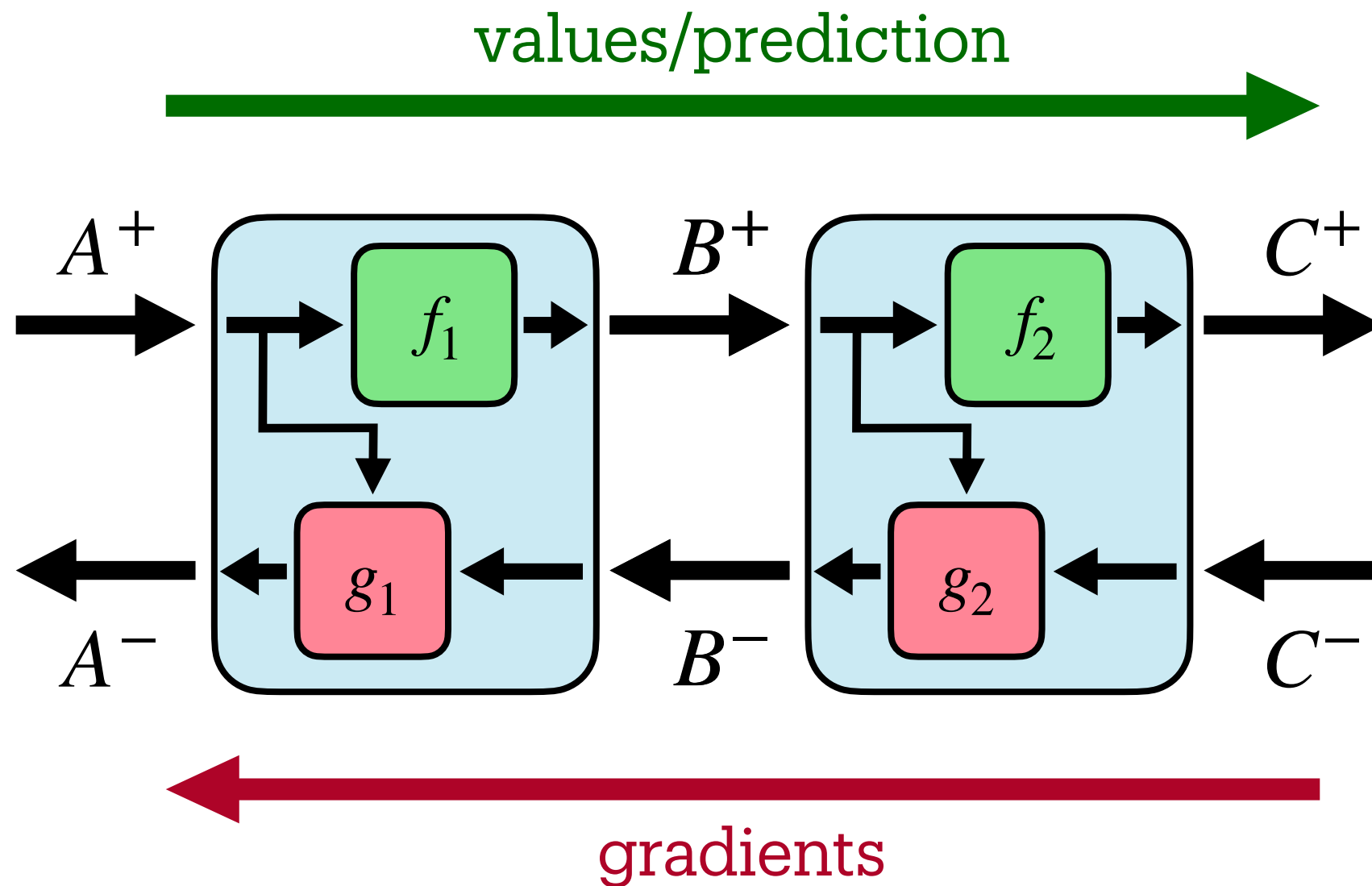
Logic



Functional Interpretations



Machine Learning (Neural Nets)



Kohlenbach Monotone Interpretations

Definition (Howard'73).

For each finite type τ define $x \leq_\tau^* a$, read “ a **majorizes** x ”, inductively as

$$\begin{aligned} n \leq_{\mathbb{N}}^* m &::= n \leq m \\ f \leq_{\rho \rightarrow \tau}^* g &::= \forall a \forall x \leq_\rho^* a (f(x) \leq_\tau^* g(a)) \end{aligned}$$

Definition (Kohlenbach'96).

Given interpretation $(A^+, A^-, |A|_y^x)$ for A , its **monotone realizer** is an a such that

$$\exists x \leq_{A^+}^* a \forall y |A|_y^x$$

Key Idea.

If $A(v)$ but $v \leq^* t$ then monotone realizer is **uniform** on v (only depends on bound t)



Functional Interpretation of Linear Logic

Definition (de Paiva'1989, Shirahata'2006).

Suppose each atomic P of **LL** is associated with a triple $(P^+, P^-, |P| \subseteq P^+ \times P^-)$.

This can be extended to all formulas as

$$\begin{array}{ll}
 |A \otimes B|_{f,g}^{x,v} & \equiv |A|_{g(v)}^x \text{ and } |B|_{f(x)}^v & |A^\perp|_x^y & \equiv \text{not } |A|_y^x \\
 |A \oplus B|_{y,w}^{b,x,v} & \equiv |A|_y^x \text{ if } b \text{ else } |B|_w^v & |\forall z A(z)|_{v,y}^f & \equiv |A(v)|_y^{f(v)} \\
 |A \multimap B|_{x,w}^{f,g} & \equiv |A|_{g(w)}^x \text{ implies } |B|_w^{f(x)} & |!A|_g^x & \equiv \forall y \in g(x) |A|_y^x
 \end{array}$$

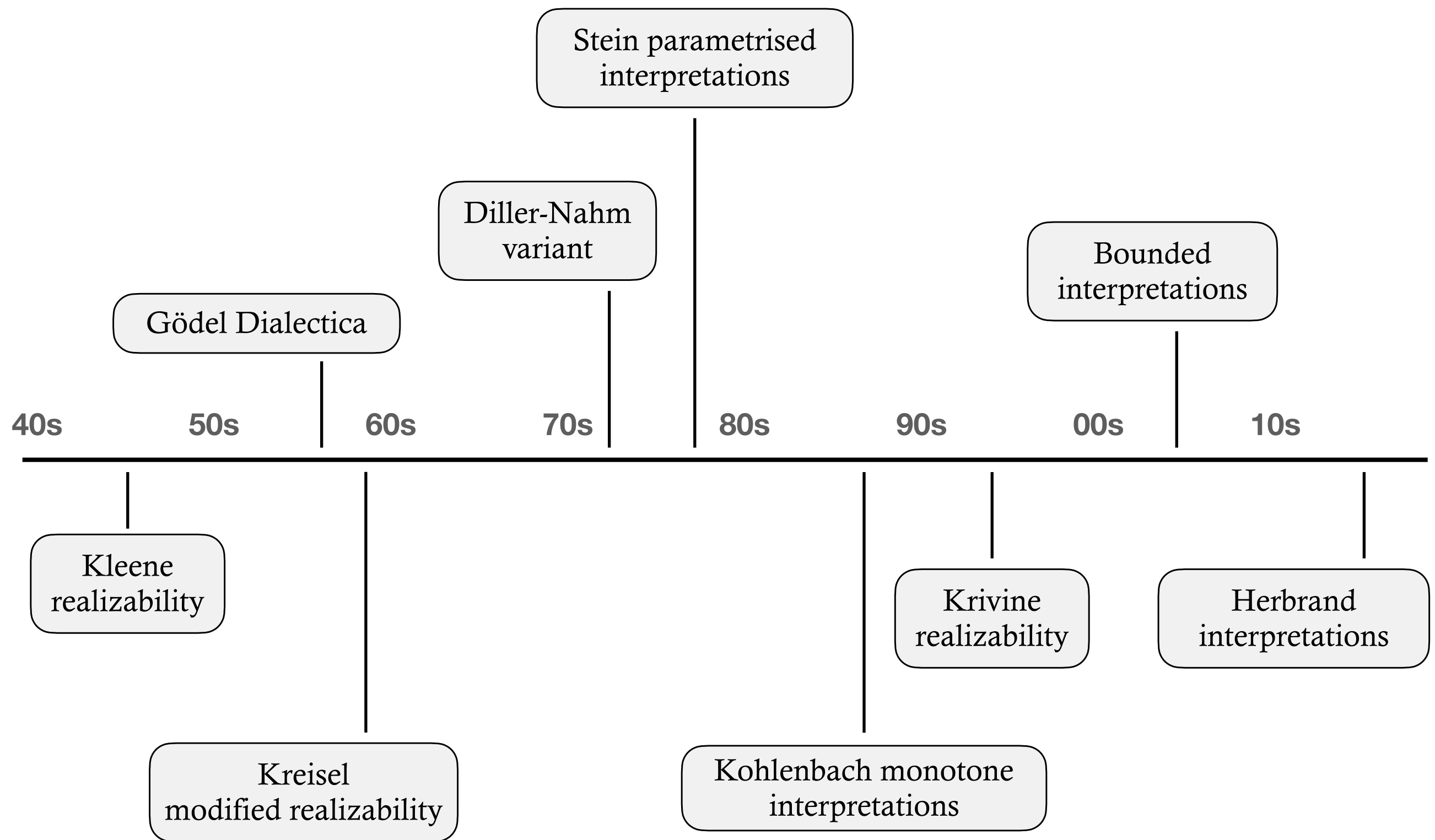
Definition (Other interpretations — see next slide).

$$\begin{array}{ll}
 |!A|_g^x & \equiv |A|_{g(x)}^x & |!A|_g^x & \equiv \forall y \leq^* g(x) |A|_y^x \\
 |!A|_g^x & \equiv \forall y \in g(x) |A|_y^x & |!A|_g^x & \equiv \forall y \in g(x) |A|_y^x \wedge A \\
 |!A|^x & \equiv \forall y |A|_y^x & |!A|^x & \equiv \forall y |A|_y^x \wedge A
 \end{array}$$

Valéria de Paiva, *A Dialectica-like model of linear logic*, 1989

Masaru Shirahata, *The Dialectica interpretation of first-order classical linear logic*, 2006





Unifying Functional Interpretations

- Parametrised interpretation of IL (2006)

P. O., Unifying functional interpretations, NDJFL, 2006

- Parametrised interpretation of CLL and ILL (2007-2010)

P. O., Modified realizability interpretation of classical linear logic, LICS, 2007

P. O., Computational interpretations of classical linear logic, WoLLiC, 2007

Gilda Ferreira & P. O., Functional interpretations of intuitionistic linear logic, CSL, 2009

P. O., Functional interpretations of intuitionistic linear logic, Information & Computation, 2010

- Hybrid functional interpretations (2008-2012)

Mircea-Dan Hernest & P. O., Hybrid functional interpretations, CiE, 2008

P. O., Hybrid functional interpretations of linear and intuitionistic logic, JLC, 2012

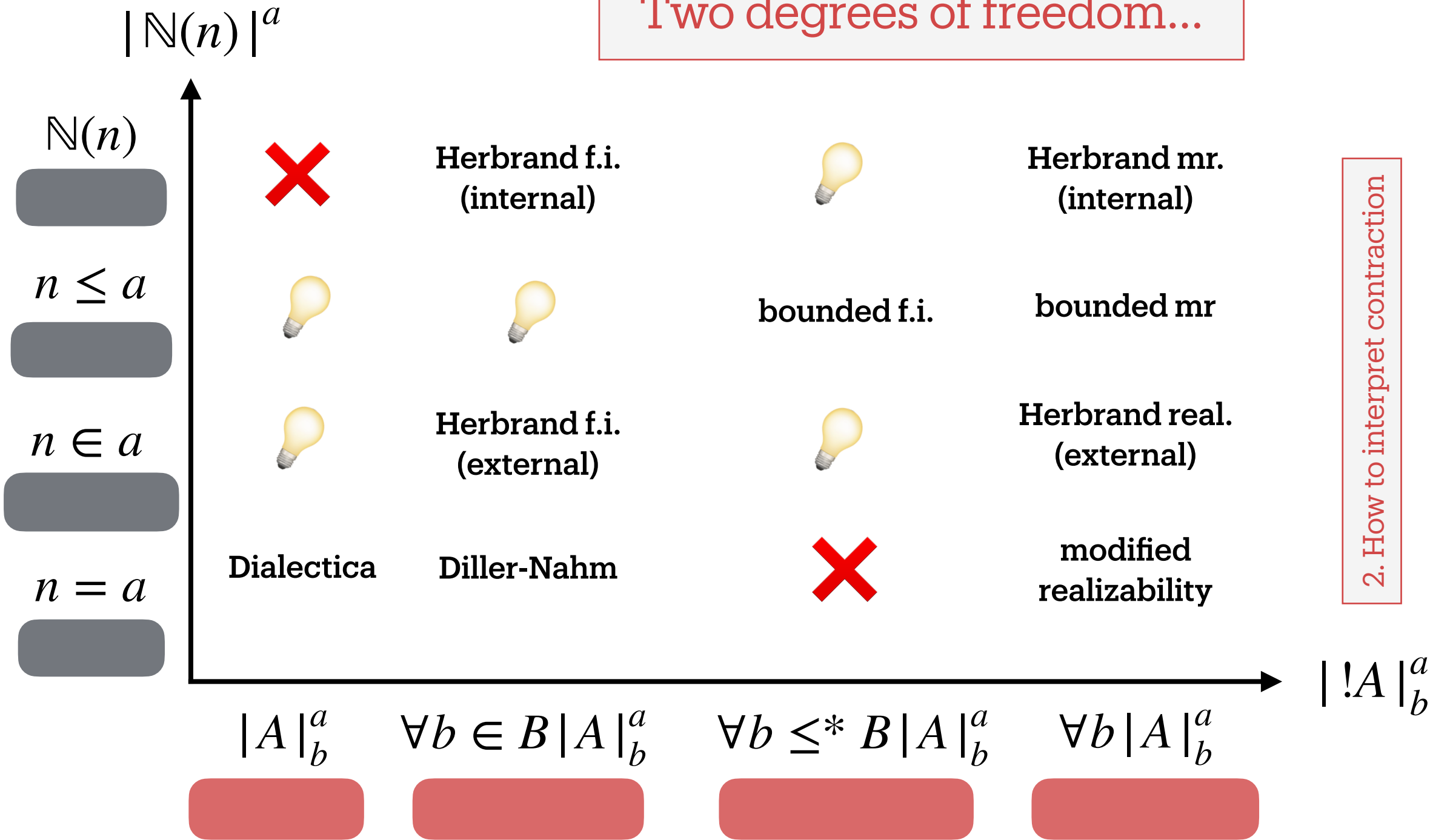
- Interpretations with truth (2010)

Jaime Gaspar & P. O., Proof interpretations with truth, MLQ, 2010



1. How to interpret atomic formulas

Two degrees of freedom...



2. How to interpret contraction

Bruno Dinis & P. O., A parametrised functional interpretation of Heyting arithmetic, 2021

Fernando Ferreira & P. O., The uniform functional interpretation with informative types, in preparation



Functional Interpretations: Uniformity



Definition (Computational interpretation of quantifiers).

Assume $A(z^\tau)$ has interpretation $(A^+, A^-, |A| \subseteq A^+ \times A^-)$.

Let $(\exists z^\tau A)^+ \equiv \tau \times A^+$ and $(\exists z^\tau A)^- \equiv A^-$ and

$$|\exists z^\tau A(z)|_y^{\nu, x} \equiv |A(\nu)|_y^x$$

Let $(\forall z^\tau A)^+ \equiv \tau \rightarrow A^+$ and $(\forall z^\tau A)^- \equiv \tau \times A^-$ and

$$|\forall z^\tau A(z)|_{\nu, y}^f \equiv |A(\nu)|_y^{f(\nu)}$$

Definition (Uniform interpretation of quantifiers).

Let $(\exists z^\tau A)^+ \equiv A^+$ and $(\exists z^\tau A)^- \equiv (A^-)^*$ and

$$|\exists z^\tau A(z)|_S^x \equiv \exists z^\tau \forall y \in S |A(z)|_y^x$$

Let $(\forall z^\tau A)^+ \equiv A^+$ and $(\forall z^\tau A)^- \equiv A^-$ and

$$|\forall z^\tau A(z)|_y^x \equiv \forall z^\tau |A(z)|_y^x$$



Uniform Functional Interpretation

Idea (F. Ferreira & P. O., work in progress).

1. Treat all quantifiers uniformly

2. Add new atomic formulas $I_\tau(x^\tau)$

3. Control interpretation of quantifications over x^τ via the interpretation of $I_\tau(x^\tau)$

$$|I_\tau(x^\tau)|^a \equiv x = a \text{ (precise)} \quad \text{or} \quad |I_\tau(x^\tau)| \equiv \text{true (uniform)}$$

4. Function types $\rho \rightarrow \tau$ can be given new interpretations, including *canonical* one:

$$|I_{\rho \rightarrow \tau}(\phi)|_{x,w}^{f,g} \equiv \forall z^\rho (\forall y \in g(x, w) |I_\rho(z)|_y^x \rightarrow |I_\tau(\phi(z))|_w^{f(x)})$$

5. Restricted (bounded) quantifiers $\forall x^\tau (R(x) \rightarrow A(x))$ can be treated *uniformly* if

$$\forall x^\tau (R(x) \rightarrow I_\tau(x))$$

is uniformly interpretable



Uniform Functional Interpretation

Proposition (F. Ferreira & P. O., work in progress).

With **precise** interpretation of $I_{\mathbb{N}}(n)$ and **canonical** interpretation at function types

$$|I_{\rho \rightarrow \tau}(\phi)|_{x,w}^{f,g} \equiv \forall z^\rho (\forall y \in g(x, w) |I_\rho(z)|_y^x \rightarrow |I_\tau(\phi(z))|_w^{f(x)})$$

the **extensionality axiom** for type 2 functionals becomes interpretable:

$$\forall F^2, \alpha, \beta^1 (\alpha =_1 \beta \rightarrow F(\alpha) =_0 F(\beta))$$

Proposition (F. Ferreira & P. O., work in progress).

With the **bounding** interpretation of $I_{\mathbb{N}}(n)$ and **canonical** interpretation at function types, quantifications $\forall \alpha \leq_1 t A(\alpha)$ and $\exists \alpha \leq_1 t A(\alpha)$ can be treated uniformly

$$|\forall \alpha \leq_1 t A(\alpha)|_y^x \equiv \forall \alpha \leq_1 t |A(\alpha)|_y^x \quad |\exists \alpha \leq_1 t A(\alpha)|_S^x \equiv \exists \alpha \leq_1 t \forall y \in S |A(\alpha)|_y^x$$



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Compositionality and uniformity

- **Tools II: Negative translations**

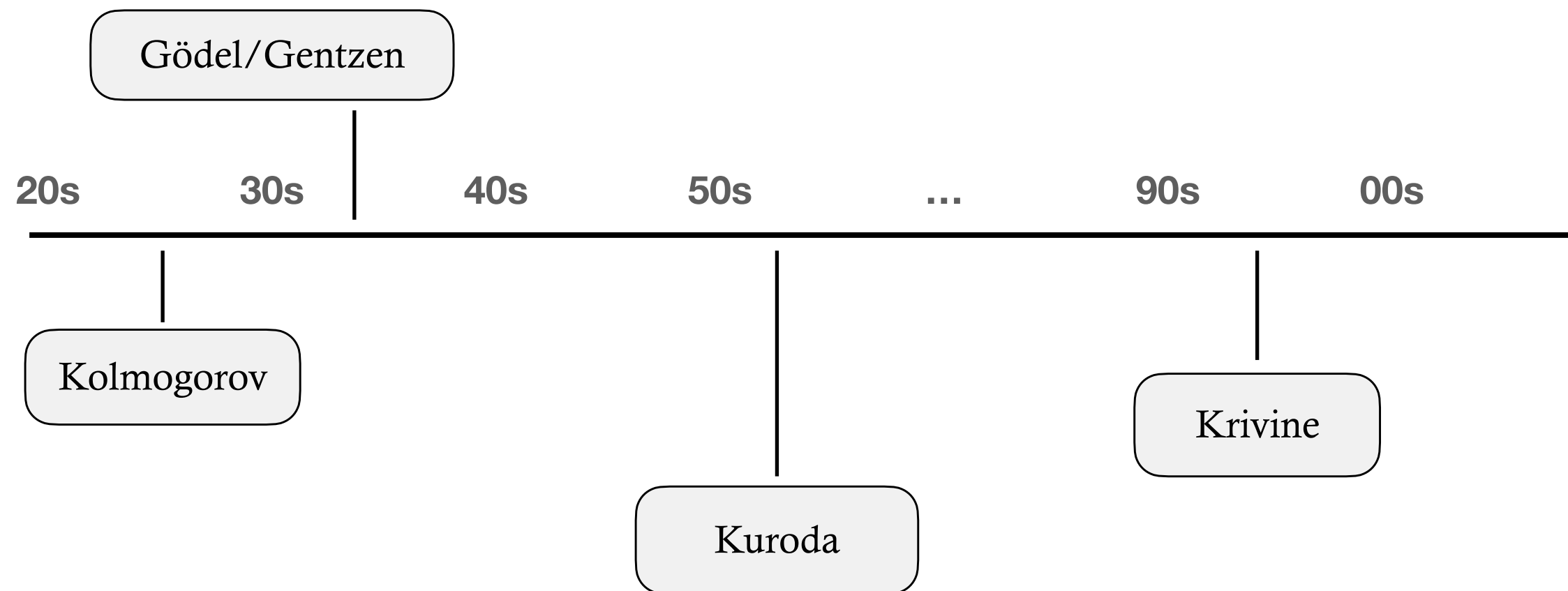
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Negative (Double Negation) Translations



Excluded Middle “Tamed”

$$\boxed{\vdash A \vee \neg A}$$

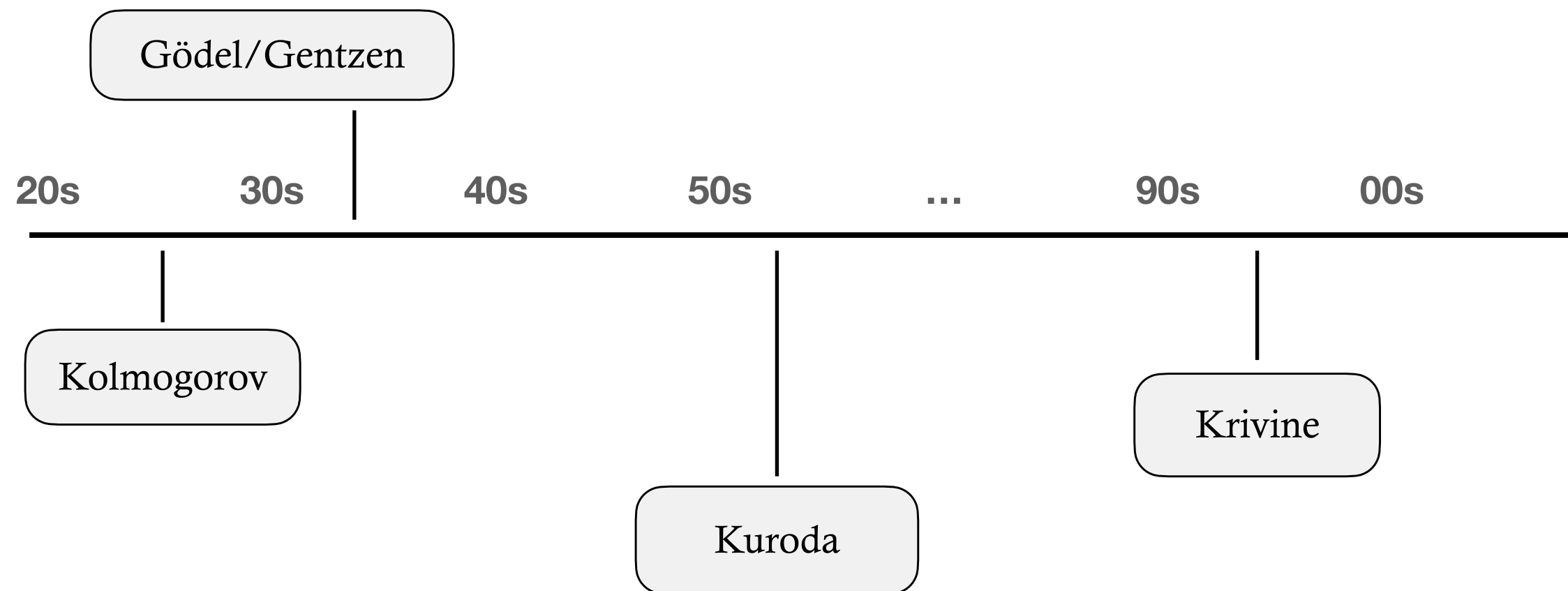
$$\frac{\frac{\frac{[A]_\alpha}{A \vee \neg A} \quad [\neg(A \vee \neg A)]_\gamma}{\perp} \alpha}{\frac{\neg A}{A \vee \neg A} \quad [\neg(A \vee \neg A)]_\gamma} \frac{\perp}{A \vee \neg A} \text{PBC}, \gamma$$

$$\boxed{\vdash \neg\neg(A \vee \neg A)}$$

$$\frac{\frac{\frac{[A]_\alpha}{A \vee \neg A} \quad [\neg(A \vee \neg A)]_\gamma}{\perp} \alpha}{\frac{\neg A}{A \vee \neg A} \quad [\neg(A \vee \neg A)]_\gamma} \frac{\perp}{\neg\neg(A \vee \neg A)} \rightarrow I, \gamma$$



Negative (Double Negation) Translations



Theorem (Gödel/Gentzen 1933).

If **CL** proves $\Gamma \vdash A$ then **IL** proves $\Gamma^G \vdash A^G$

$$\begin{array}{ll}
 (A \wedge B)^G \equiv A^G \wedge B^G & (P(\vec{x}))^G \equiv \neg \neg P(\vec{x}) \\
 (A \vee B)^G \equiv \neg \neg (A^G \vee B^G) & (\forall x A)^G \equiv \forall x A^G \\
 (A \rightarrow B)^G \equiv A^G \rightarrow B^G & (\exists x A)^G \equiv \neg \neg \exists x A^G
 \end{array}$$

Theorem (Kuroda 1951).

If **CL** proves $\Gamma \vdash A$ then **IL** proves $\Gamma^K \vdash \neg \neg A^K$

$$\begin{array}{ll}
 (A \wedge B)^K \equiv A^K \wedge B^K & (P(\vec{x}))^K \equiv P(\vec{x}) \\
 (A \vee B)^K \equiv A^K \vee B^K & (\forall x A)^K \equiv \forall x \neg \neg A^K \\
 (A \rightarrow B)^K \equiv A^K \rightarrow B^K & (\exists x A)^K \equiv \exists x A^K
 \end{array}$$

Theorem (Ferreira/O'2012).

Gödel/Gentzen and Kuroda can be seen as **systematic simplifications** of the Kolmogorov translation (“from outside” and “from inside”, respectively).



Excluded Middle: Backtracking

$$\boxed{\vdash A \vee \neg A}$$

- Backtracking (learning) interpretation:
 - Claim $A \rightarrow \perp$
 - If claim gets used, with some A , to get contradiction ($\perp$)
 - Backtrack, claim A (using given A)

Thierry Coquand, Computational Content of Classical, 2009

Stefano Berardi, Thierry Coquand & Susumu Hayashi, Games with 1-backtracking, 2010



Functional interpretation of $\neg\neg A$

Observation.

If A has interpretation $(A^+, A^-, |A|_y^x)$ then

$$(\neg A)^+ \equiv A^+ \rightarrow A^- \quad (\neg A)^- \equiv A^+ \quad |\neg A|_x^f \equiv \neg |A|_{f(x)}^x$$

and

$$(\neg\neg A)^+ \equiv (A^+ \rightarrow A^-) \rightarrow A^+ \quad (\neg\neg A)^- \equiv A^+ \rightarrow A^- \quad |\neg\neg A|_f^\varepsilon \equiv \neg\neg |A|_{f(\varepsilon(f))}^{\varepsilon(f)}$$

Definition (Martín Escardó & P. O.).

We call a functional $\varepsilon: (X \rightarrow R) \rightarrow X$ a **selection function**.

For any (fixed) R the type mapping $J_R(X) = (X \rightarrow R) \rightarrow X$ is a **(strong) monad**.

The interpretation of $\neg\neg A \wedge \neg\neg B \rightarrow \neg\neg(A \wedge B)$ is given by the **product of selection functions** $\otimes: J_R(X) \times J_R(Y) \rightarrow J_R(X \times Y)$

Existence of certain selection function for X means X a “compact” types (Escardó)

$$\neg\neg(\exists n P(n) \vee \forall n \neg P(n))$$

Example.

$A = \neg\neg(\exists n P(n) \vee \forall m \neg P(m))$ has (precise) interpretation:

$$A^+ \equiv (\mathbb{B} \times \mathbb{N} \rightarrow \mathbb{N}) \rightarrow \mathbb{B} \times \mathbb{N} \quad A^- \equiv \mathbb{B} \times \mathbb{N} \rightarrow \mathbb{N}$$

and

$$|A|_f^\varepsilon \equiv \begin{cases} P(\varepsilon_1(f)) & \varepsilon_0(f) \\ \neg P(\varepsilon_1(f)) & \neg \varepsilon_0(f) \end{cases}$$

Indeed, we can take

$$\varepsilon(f^{\mathbb{B} \times \mathbb{N} \rightarrow \mathbb{N}})^{\mathbb{B} \times \mathbb{N}} = \begin{cases} (\text{true}, f(\text{false}, 0)) & P(f(\text{false}, 0)) \\ (\text{false}, 0) & \neg P(f(\text{false}, 0)) \end{cases}$$

Intuition.

Claim $\forall m \neg P(m)$, i.e. false (witness 0 no relevant)

If $m = f(\text{false}, 0)$ is such that $P(m)$ we backtrack to $\exists n P(n)$ — i.e. (true, m)



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Induction

- Assume $A^- \equiv B^- \equiv R$
- The finite “double negation shift”

$$\neg\neg A \wedge \neg\neg B \rightarrow \neg\neg(A \wedge B)$$

is interpreted by the **binary product of selection functions**:

$$\otimes : J_R(A^+) \times J_R(B^+) \rightarrow J_R(A^+ \times B^+)$$

- To interpret **induction** it is sufficient to interpret:

$$\forall i < n \neg\neg A(i) \rightarrow \neg\neg \forall i < n A(i)$$

which can be done via the **finite product of selection functions**:

$$\bigotimes_n : \prod_{i < n} J_R(A^+) \rightarrow J_R(\prod_{i < n} A^+)$$

Countable choice

- Countable choice $\mathbf{AC}_0$ is the axiom schema

$$\forall n^{\mathbb{N}} \exists x^{\tau} A_n(x) \rightarrow \exists \alpha^{\mathbb{N} \rightarrow \tau} \forall n A_n(\alpha(n))$$

- To interpret $\mathbf{AC}_0$ it is sufficient to interpret $\mathbf{DNS}$

$$\forall n^{\mathbb{N}} \neg \neg A(n) \rightarrow \neg \neg \forall n A(n)$$

using the **unbounded product of selection functions**

$$\bigotimes : \prod_{n: \mathbb{N}} J_R(A_n^+) \rightarrow J_R(\prod_{n: \mathbb{N}} A_n^+)$$

(shown to be equivalent to bar recursion)



Summary

- Proofs often carry more information than what is stated in theorem
- **Functional interpretations** view formulas as triples
$$A \quad \mapsto \quad (A^+, A^-, |A| \subseteq A^+ \times A^-)$$
- These can be seen as **games** between two players
- **Implication** is interpreted as two-way maps between games
- Two degrees of freedom: **atomic formulas** & **contraction**
- **Negative translations** are simplifications of Kolmogorov translation
- Realizers for double negated formulas are **selection functions**
- The **product of selection functions** (classically) interprets countable choice and comprehension (*equivalent to bar recursion*)



Thank You!

