Weighted Clones

Libor Barto

Department of Algebra Faculty of Mathematics and Physics Charles University in Prague

AAA 89, February 27, 2015

- clones \leftrightarrow relational clones
 - why study clones: almost whole UA + fun
 - why study relational clones: CSP
 - ▶ why we care about ↔: UA ∪ CSP, extensive use in UA (congruences, description of clones, ...)

- clones \leftrightarrow relational clones
 - why study clones: almost whole UA + fun
 - why study relational clones: CSP
 - ▶ why we care about ↔: UA ∪ CSP, extensive use in UA (congruences, description of clones, ...)
- weighted clones \leftrightarrow weighted relational clones
 - why study weighted clones: ? + more fun (more math)
 - why study weighted relational clones: valued CSP
 - why we care about \leftrightarrow : fun \cup vCSP, use in UA?

- clones \leftrightarrow relational clones
 - why study clones: almost whole UA + fun
 - why study relational clones: CSP
 - ▶ why we care about ↔: UA ∪ CSP, extensive use in UA (congruences, description of clones, ...)
- weighted clones \leftrightarrow weighted relational clones
 - why study weighted clones: ? + more fun (more math)
 - why study weighted relational clones: valued CSP
 - why we care about \leftrightarrow : fun \cup vCSP, use in UA?
- this talk:
 - what is weighted (relational) clone
 - what is known + open problems

- Notation
 - D ... finite set (the domain)
 - ▶ A ... set of operations on D
 - \mathbb{A} ... set of relations on D

- Notation
 - D ... finite set (the domain)
 - A . . . set of operations on D
 - \mathbb{A} ... set of relations on D
- ▶ Def: A is a (function) clone if it contains projections and is closed under superposition: f, g_i ∈ A ⇒ f(g₁,...,g_n) ∈ A

- Notation
 - D ... finite set (the domain)
 - A . . . set of operations on D
 - \mathbb{A} ... set of relations on D
- ▶ Def: A is a (function) clone if it contains projections and is closed under superposition: f, g_i ∈ A ⇒ f(g₁,...,g_n) ∈ A
- ▶ Def: A is a relational clone if it is closed under pp-definitions
 - ▶ **Example:** if $R_1, R_2 \in \mathbb{A}$ then S defined by S(x,y) iff $(\exists z) R_1(x,z) \land R_2(z,y,y)$ is in \mathbb{A}

- Notation
 - D . . . finite set (the domain)
 - A . . . set of operations on D
 - \mathbb{A} ... set of relations on D
- ▶ Def: A is a (function) clone if it contains projections and is closed under superposition: f, g_i ∈ A ⇒ f(g₁,...,g_n) ∈ A
- ▶ Def: A is a relational clone if it is closed under pp-definitions
 - ▶ **Example:** if $R_1, R_2 \in \mathbb{A}$ then *S* defined by S(x, y) iff $(\exists z) R_1(x, z) \land R_2(z, y, y)$ is in \mathbb{A}
- ▶ Def: CSP over A is the problem to decide whether a pp-sentence (over A) is true
 - **Example:** Is $(\exists x, y, z) R_1(x, z) \land R_2(z, y, y)$ true?
 - Complexity does not change if we add pp-definable relation
 - \Rightarrow Complexity depends only on the relational clone of \mathbb{A} .

$clones \leftrightarrow relational clones$

- clones and rel. clones are closed objects in a Galois correspondence given by:
- ▶ Def: $f: D^n \to D$ is compatible with $R \subseteq D^m$ if $\mathbf{d}_1, \ldots, \mathbf{d}_n \in R \Rightarrow f(\mathbf{d}_1, \ldots, \mathbf{d}_n) \in R$

$$f \quad f \quad \dots \quad f$$

$$\downarrow \quad \downarrow \quad \dots \quad \downarrow$$

$$\mathbf{d}_1 = (d_{11}, \quad d_{12}, \quad \dots, \quad d_{1m}) \quad \in R$$

$$\mathbf{d}_2 = (d_{21}, \quad d_{22}, \quad \dots, \quad d_{2m}) \quad \in R$$

$$\vdots \qquad \qquad \vdots \qquad \qquad \vdots$$

$$\mathbf{d}_n = (d_{n1}, \quad d_{n2}, \quad \dots, \quad d_{nm}) \quad \in R$$

$$\downarrow$$

$$f(\mathbf{d}_1, \dots, \mathbf{d}_n) = (b_1, \quad b_2, \quad \dots, \quad b_m) \quad \in R$$

$clones \leftrightarrow relational clones$

- clones and rel. clones are closed objects in a Galois correspondence given by:
- ▶ Def: $f : D^n \to D$ is compatible with $R \subseteq D^m$ if $\mathbf{d}_1, \ldots, \mathbf{d}_n \in R \Rightarrow f(\mathbf{d}_1, \ldots, \mathbf{d}_n) \in R$
- ▶ Pol(A) ... all operations compatible with every R ∈ A Fact: always a clone
- ► Inv(A) ... all relations compatible with every f ∈ A Fact: always a relational clone
- ► Theorem: Pol and Inv are mutually inverse bijections clones ↔ relational clones Geiger; Bodnarčuk, Kalužnin, Kotov, Romov

Theorem (Geiger; Bodnarčuk, Kalužnin, Kotov, Romov)

If **A** is a clone, then $\mathbf{A} = Pol(Inv(\mathbf{A}))$.

Proof.

Theorem (Geiger; Bodnarčuk, Kalužnin, Kotov, Romov)

If **A** is a clone, then $\mathbf{A} = Pol(Inv(\mathbf{A}))$.

Proof.

 \subseteq obvious

Theorem (Geiger; Bodnarčuk, Kalužnin, Kotov, Romov)

If **A** is a clone, then $\mathbf{A} = Pol(Inv(\mathbf{A}))$.

Proof.

assume $t \notin \mathbf{A}$ (say *n*-ary).

Theorem (Geiger; Bodnarčuk, Kalužnin, Kotov, Romov)

If **A** is a clone, then $\mathbf{A} = Pol(Inv(\mathbf{A}))$.

Proof.

assume $t \notin \mathbf{A}$ (say *n*-ary).

want: relation R in $Inv(\mathbf{A})$ which is not compatible with t

• ! operation $f: D^n \to D \approx$ tuple **f** of length $|D|^n$

Theorem (Geiger; Bodnarčuk, Kalužnin, Kotov, Romov)

If **A** is a clone, then $\mathbf{A} = Pol(Inv(\mathbf{A}))$.

Proof.

assume $t \notin \mathbf{A}$ (say *n*-ary).

- ! operation $f: D^n \to D \approx$ tuple **f** of length $|D|^n$
- ▶ \Rightarrow set of *n*-ary operations $\approx |D|^n$ -ary relation

Theorem (Geiger; Bodnarčuk, Kalužnin, Kotov, Romov)

If **A** is a clone, then $\mathbf{A} = Pol(Inv(\mathbf{A}))$.

Proof.

assume $t \notin \mathbf{A}$ (say *n*-ary).

- ! operation $f: D^n \to D \approx$ tuple **f** of length $|D|^n$
- ▶ \Rightarrow set of *n*-ary operations $\approx |D|^n$ -ary relation
- Define: R = all n-ary operations in **A**

Theorem (Geiger; Bodnarčuk, Kalužnin, Kotov, Romov)

If **A** is a clone, then $\mathbf{A} = Pol(Inv(\mathbf{A}))$.

Proof.

assume $t \notin \mathbf{A}$ (say *n*-ary).

- ! operation $f: D^n \to D \approx$ tuple **f** of length $|D|^n$
- ▶ \Rightarrow set of *n*-ary operations $\approx |D|^n$ -ary relation
- Define: R = all n-ary operations in A
- ▶ *R* is compatible with every $f \in \mathbf{A}$ since $f(\mathbf{g}_1, \dots, \mathbf{g}_m)$ (component-wise application of *f*) = $f(g_1, \dots, g_m)$ (superposition)

Theorem (Geiger; Bodnarčuk, Kalužnin, Kotov, Romov)

If **A** is a clone, then $\mathbf{A} = Pol(Inv(\mathbf{A}))$.

Proof.

assume $t \notin \mathbf{A}$ (say *n*-ary).

- ! operation $f: D^n \to D \approx$ tuple **f** of length $|D|^n$
- ▶ \Rightarrow set of *n*-ary operations $\approx |D|^n$ -ary relation
- Define: R = all n-ary operations in **A**
- ▶ *R* is compatible with every $f \in \mathbf{A}$ since $f(\mathbf{g}_1, \dots, \mathbf{g}_m)$ (component-wise application of *f*) = $f(g_1, \dots, g_m)$ (superposition)
- ► *t* is not compatible with *R* since $t(\pi_1, \ldots, \pi_n) = \mathbf{t} \notin R$

vCSP, weighted relational clones, weighted clones

Cohen, Cooper, Creed, Jeavons, Živný

- relation \rightarrow weighted relation
- $CSP \rightarrow vCSP$
- \blacktriangleright relational clone \rightarrow weighted relational clone
- operation \rightarrow fractional operation, weighting (2 versions)
- \blacktriangleright clone \rightarrow weighted clone

relations in a weird way

Relation R ⊆ Dⁿ can be alternatively defined as a mapping ρ: Dⁿ → {0,∞} (or to {c,∞})
ρ(d) = 0 if d ∈ R (no penalty for using d)
ρ(d) = ∞ if d ∈ R (very high penalty, never use this tuple)

relations in a weird way

 Relation R ⊆ Dⁿ can be alternatively defined as a mapping ρ: Dⁿ → {0,∞} (or to {c,∞})

 ρ(d) = 0 if d ∈ R (no penalty for using d)

 ρ(d) = ∞ if d ∈ R (very high penalty, never use this tuple)

• pp-definitions \approx minimizing a sum

- **Example:** S(x,y) iff $(\exists z) R_1(x,z) \land R_2(z,y,y)$
- corresponds to $\sigma(x, y) = \min_z \rho_1(x, z) + \rho_2(z, y, y)$

relations in a weird way

Relation R ⊆ Dⁿ can be alternatively defined as a mapping ρ: Dⁿ → {0,∞} (or to {c,∞})
ρ(d) = 0 if d ∈ R (no penalty for using d)
ρ(d) = ∞ if d ∈ R (very high penalty, never use this tuple)

• pp-definitions \approx minimizing a sum

- **Example:** S(x,y) iff $(\exists z) R_1(x,z) \land R_2(z,y,y)$
- corresponds to $\sigma(x, y) = \min_z \rho_1(x, z) + \rho_2(z, y, y)$
- CSP \approx minimizing a sum (over all variables)
 - ► Example: Is $(\exists x, y, z) R_1(x, z) \land R_2(z, y, y)$ true?
 - corresponds to Find $\min_{x,y,z} \rho_1(x,z) + \rho_2(z,y,y)$.

▶ **Def:** weighted relation is a mapping $\rho: D^n \to \overline{\mathbb{Q}} = \mathbb{Q} \cup \{\infty\}$

- $\rho(\mathbf{d}) = 0$ (low penalty for using \mathbf{d})
- $\rho(\mathbf{d}) = 13$ (higher penalty)
- $\rho(\mathbf{d}) = \infty$ (absolutely forbidden tuple)

weighted relation, vCSP

- ▶ **Def:** weighted relation is a mapping $\rho: D^n \to \overline{\mathbb{Q}} = \mathbb{Q} \cup \{\infty\}$
 - $\rho(\mathbf{d}) = 0$ (low penalty for using \mathbf{d})
 - $\rho(\mathbf{d}) = 13$ (higher penalty)
 - $\rho(\mathbf{d}) = \infty$ (absolutely forbidden tuple)

• **Def:** Feas
$$(\rho) = {\mathbf{d} : \rho(\mathbf{d}) < \infty} \subseteq D^n$$

weighted relation, vCSP

- ▶ **Def:** weighted relation is a mapping $\rho: D^n \to \overline{\mathbb{Q}} = \mathbb{Q} \cup \{\infty\}$
 - $\rho(\mathbf{d}) = 0$ (low penalty for using \mathbf{d})
 - $\rho(\mathbf{d}) = 13$ (higher penalty)
 - $\rho(\mathbf{d}) = \infty$ (absolutely forbidden tuple)

• **Def:** Feas
$$(\rho) = {\mathbf{d} : \rho(\mathbf{d}) < \infty} \subseteq D^n$$

▶ W ... set of weighted relations

- ▶ **Def:** weighted relation is a mapping $\rho: D^n \to \overline{\mathbb{Q}} = \mathbb{Q} \cup \{\infty\}$
 - $\rho(\mathbf{d}) = 0$ (low penalty for using \mathbf{d})
 - $\rho(\mathbf{d}) = 13$ (higher penalty)
 - $\rho(\mathbf{d}) = \infty$ (absolutely forbidden tuple)
- **Def:** Feas $(\rho) = {\mathbf{d} : \rho(\mathbf{d}) < \infty} \subseteq D^n$

▶ W ... set of weighted relations

- ▶ Def: vCSP over W is the problem to minimize a sum (which uses only weighted relations from W)
 - **Example:** Find $\min_{x,y,z} \rho_1(x,z) + \rho_2(z,y,y)$.
 - Complexity does not change if we add ... (next slide)
 - $\blacktriangleright \ \Rightarrow$ complexity only depends on weighted relational clone of $\mathbb W$

► **Def:** W is a weighted relational clone if

contains the equality relation

► **Def:** W is a weighted relational clone if

- contains the equality relation
- ► is closed under addition of constant and non-negative scaling **Example:** if $\rho \in \mathbb{W}$ then $2\rho + 3 \in \mathbb{W}$

► **Def:** W is a weighted relational clone if

- contains the equality relation
- is closed under addition of constant and non-negative scaling
 Example: if ρ ∈ W then 2ρ + 3 ∈ W
- is closed under addition and minimization over some coordinates

Example: if $\rho_1, \rho_2 \in \mathbb{W}$ then σ defined by $\sigma(x, y) = \min_z \rho_1(x, z) + \rho_2(z, y, y)$ is in \mathbb{W}

 Def: *n*-ary fractional operation \u03c6 is a probability distribution over *n*-ary operations, written as a formal linear combination of operations

$$\phi = \sum_{f:D^n o D} \phi(f) f, \quad ext{where } 0 \leq \phi(f) \in \mathbb{Q}, \ \sum_f \phi(f) = 1$$

Def: n-ary fractional operation \u03c6 is a probability distribution over n-ary operations, written as a formal linear combination of operations

$$\phi = \sum_{f:D^n o D} \phi(f) f, \quad ext{where } 0 \leq \phi(f) \in \mathbb{Q}, \ \sum_f \phi(f) = 1$$

► **Example:** A binary fractional operation on $D = \{0, 1\}$ $\phi = 0.1\pi_1 + 0.4 \min + 0.5 \max$

Def: n-ary fractional operation \u03c6 is a probability distribution over n-ary operations, written as a formal linear combination of operations

$$\phi = \sum_{f:D^n o D} \phi(f) f, \quad ext{where } 0 \leq \phi(f) \in \mathbb{Q}, \ \sum_f \phi(f) = 1$$

Example: A binary fractional operation on $D = \{0, 1\}$

$$\phi = 0.1\pi_1 + 0.4 \min + 0.5 \max$$

Natural example:

 $\phi = 0.5 \min + 0.5 \max$

Def: n-ary fractional operation \u03c6 is a probability distribution over n-ary operations, written as a formal linear combination of operations

$$\phi = \sum_{f:D^n o D} \phi(f) f, \quad ext{where } 0 \leq \phi(f) \in \mathbb{Q}, \ \sum_f \phi(f) = 1$$

Example: A binary fractional operation on $D = \{0, 1\}$

 $\phi = 0.1\pi_1 + 0.4 \min + 0.5 \max \qquad \text{supp}(\phi) = \{\pi_1, \min, \max\}$

Natural example:

 $\phi = 0.5 \min + 0.5 \max \qquad \operatorname{supp}(\phi) = \{\min, \max\}$

• **Def:** Support of ϕ is supp $(\phi) = \{f : \phi(f) > 0\}$

compatibility

Def: n-ary φ = ∑ φ(f)f is compatible with ρ : D^m → Q if for any d₁,..., d_n ∈ D^m

 $\mathsf{EXP}_{f \sim \phi} \quad \rho(f(\mathbf{d}_1, \dots, \mathbf{d}_n)) \leq \mathsf{avg} \ \{\rho(\mathbf{d}_1), \dots, \rho(\mathbf{d}_n)\}$

compatibility

▶ Def: n-ary φ = ∑ φ(f)f is compatible with ρ : D^m → Q if for any d₁,..., d_n ∈ D^m

 $\mathsf{EXP}_{f\sim\phi} \ \ \rho(\,f(\mathsf{d}_1,\ldots,\mathsf{d}_n)\,) \leq \mathsf{avg}\,\,\{\rho(\mathsf{d}_1),\ldots,\rho(\mathsf{d}_n)\}$

equivalently

$$\sum_{f\in\mathsf{supp}(\phi)}\phi(f)\,\rho(\,f(\mathsf{d}_1,\ldots,\mathsf{d}_n)\,)\leq \frac{1}{n}\rho(\mathsf{d}_1)+\cdots+\frac{1}{n}\rho(\mathsf{d}_n)$$

compatibility

Def: n-ary φ = ∑ φ(f)f is compatible with ρ : D^m → Q if for any d₁,..., d_n ∈ D^m

 $\mathsf{EXP}_{f\sim\phi} \ \ \rho(f(\mathbf{d}_1,\ldots,\mathbf{d}_n)) \leq \mathsf{avg} \ \{\rho(\mathbf{d}_1),\ldots,\rho(\mathbf{d}_n)\}$

equivalently

$$\sum_{f\in\mathsf{supp}(\phi)}\phi(f)\,\rho(\,f(\mathsf{d}_1,\ldots,\mathsf{d}_n)\,)\leq \frac{1}{n}\rho(\mathsf{d}_1)+\cdots+\frac{1}{n}\rho(\mathsf{d}_n)$$

• **Example:** $D = \{0, 1\}, \phi = 0.5 \min +0.5 \max$

 $0.5 \rho(\max(\mathbf{d}_1, \mathbf{d}_2)) + 0.5 \rho(\min(\mathbf{d}_1, \mathbf{d}_2)) \le 0.5 \rho(\mathbf{d}_1) + 0.5 \rho(\mathbf{d}_2)$

compatibility

Def: n-ary φ = ∑ φ(f)f is compatible with ρ : D^m → Q if for any d₁,..., d_n ∈ D^m

 $\mathsf{EXP}_{f\sim\phi} \ \ \rho(f(\mathbf{d}_1,\ldots,\mathbf{d}_n)) \leq \mathsf{avg} \ \{\rho(\mathbf{d}_1),\ldots,\rho(\mathbf{d}_n)\}$

equivalently

$$\sum_{f\in\mathsf{supp}(\phi)}\phi(f)\,\rho(\,f(\mathsf{d}_1,\ldots,\mathsf{d}_n)\,)\leq \frac{1}{n}\rho(\mathsf{d}_1)+\cdots+\frac{1}{n}\rho(\mathsf{d}_n)$$

• **Example:** $D = \{0, 1\}, \phi = 0.5 \min +0.5 \max$

 $0.5 \, \rho(\max(\mathbf{d}_1, \mathbf{d}_2)) + 0.5 \, \rho(\min(\mathbf{d}_1, \mathbf{d}_2)) \le 0.5 \, \rho(\mathbf{d}_1) + 0.5 \, \rho(\mathbf{d}_2)$

► Remark (submodularity): $D^m \approx \text{power set of } \{1, \dots, m\}$ $0.5 \rho(\mathbf{d}_1 \cup \mathbf{d}_2) + 0.5 \rho(\mathbf{d}_1 \cap \mathbf{d}_2) \le 0.5 \rho(\mathbf{d}_1) + 0.5 \rho(\mathbf{d}_2)$

▶ good news: if ϕ is compatible with every $\rho \in \mathbb{W}$, then ϕ is compatible with every $\rho \in \mathrm{wRelClo}(\mathbb{W})$

- ▶ good news: if ϕ is compatible with every $\rho \in \mathbb{W}$, then ϕ is compatible with every $\rho \in \mathrm{wRelClo}(\mathbb{W})$
- **good news:** definition of compatibility is beautiful

- ▶ good news: if ϕ is compatible with every $\rho \in \mathbb{W}$, then ϕ is compatible with every $\rho \in \mathrm{wRelClo}(\mathbb{W})$
- **bad news:** superposition (defined naturally) does not work

- ▶ good news: if ϕ is compatible with every $\rho \in \mathbb{W}$, then ϕ is compatible with every $\rho \in \mathrm{wRelClo}(\mathbb{W})$
- **bad news:** superposition (defined naturally) does not work
- ▶ recall for $\phi = 0.5 \min + 0.5 \max$ the inequality was $0.5 \rho(\max(\mathbf{d}_1, \mathbf{d}_2)) + 0.5 \rho(\min(\mathbf{d}_1, \mathbf{d}_2)) \le 0.5 \rho(\mathbf{d}_1) + 0.5 \rho(\mathbf{d}_2)$

- ▶ good news: if ϕ is compatible with every $\rho \in \mathbb{W}$, then ϕ is compatible with every $\rho \in \mathrm{wRelClo}(\mathbb{W})$
- bad news: superposition (defined naturally) does not work
- ► recall for $\phi = 0.5 \min + 0.5 \max$ the inequality was $0.5 \rho(\max(\mathbf{d}_1, \mathbf{d}_2)) + 0.5 \rho(\min(\mathbf{d}_1, \mathbf{d}_2)) \le 0.5 \rho(\mathbf{d}_1) + 0.5 \rho(\mathbf{d}_2)$
- ► this is equivalent to $0.5 \rho(\max(\mathbf{d}_1, \mathbf{d}_2)) + 0.5 \rho(\min(\mathbf{d}_1, \mathbf{d}_2)) - 0.5 \rho(\pi_1(\mathbf{d}_1, \mathbf{d}_2)) - 0.5 \rho(\pi_2(\mathbf{d}_1, \mathbf{d}_2)) \le 0$

- ▶ good news: if ϕ is compatible with every $\rho \in \mathbb{W}$, then ϕ is compatible with every $\rho \in \mathrm{wRelClo}(\mathbb{W})$
- **bad news:** superposition (defined naturally) does not work
- ► recall for $\phi = 0.5 \min + 0.5 \max$ the inequality was $0.5 \rho(\max(\mathbf{d}_1, \mathbf{d}_2)) + 0.5 \rho(\min(\mathbf{d}_1, \mathbf{d}_2)) \le 0.5 \rho(\mathbf{d}_1) + 0.5 \rho(\mathbf{d}_2)$
- ► this is equivalent to $0.5 \rho(\max(\mathbf{d}_1, \mathbf{d}_2)) + 0.5 \rho(\min(\mathbf{d}_1, \mathbf{d}_2)) - 0.5 \rho(\pi_1(\mathbf{d}_1, \mathbf{d}_2)) - 0.5 \rho(\pi_2(\mathbf{d}_1, \mathbf{d}_2)) \le 0$
- ▶ solution: work with $\phi' = 0.5 \min + 0.5 \max 0.5\pi_1 0.5\pi_2$ and define compatibility with RHS=0

- ▶ good news: if ϕ is compatible with every $\rho \in \mathbb{W}$, then ϕ is compatible with every $\rho \in \mathrm{wRelClo}(\mathbb{W})$
- bad news: superposition (defined naturally) does not work
- ▶ recall for $\phi = 0.5 \min + 0.5 \max$ the inequality was $0.5 \rho(\max(\mathbf{d}_1, \mathbf{d}_2)) + 0.5 \rho(\min(\mathbf{d}_1, \mathbf{d}_2)) \le 0.5 \rho(\mathbf{d}_1) + 0.5 \rho(\mathbf{d}_2)$
- ► this is equivalent to $0.5 \rho(\max(\mathbf{d}_1, \mathbf{d}_2)) + 0.5 \rho(\min(\mathbf{d}_1, \mathbf{d}_2)) - 0.5 \rho(\pi_1(\mathbf{d}_1, \mathbf{d}_2)) - 0.5 \rho(\pi_2(\mathbf{d}_1, \mathbf{d}_2)) \le 0$
- ▶ solution: work with $\phi' = 0.5 \min + 0.5 \max 0.5\pi_1 0.5\pi_2$ and define compatibility with RHS=0

• in general
$$\phi' = \phi - 1/n \sum_i \pi_i$$

- ▶ good news: if ϕ is compatible with every $\rho \in \mathbb{W}$, then ϕ is compatible with every $\rho \in \mathrm{wRelClo}(\mathbb{W})$
- bad news: superposition (defined naturally) does not work
- ▶ recall for $\phi = 0.5 \min + 0.5 \max$ the inequality was $0.5 \rho(\max(\mathbf{d}_1, \mathbf{d}_2)) + 0.5 \rho(\min(\mathbf{d}_1, \mathbf{d}_2)) \le 0.5 \rho(\mathbf{d}_1) + 0.5 \rho(\mathbf{d}_2)$
- ► this is equivalent to $0.5 \rho(\max(\mathbf{d}_1, \mathbf{d}_2)) + 0.5 \rho(\min(\mathbf{d}_1, \mathbf{d}_2)) - 0.5 \rho(\pi_1(\mathbf{d}_1, \mathbf{d}_2)) - 0.5 \rho(\pi_2(\mathbf{d}_1, \mathbf{d}_2)) \le 0$
- ▶ solution: work with $\phi' = 0.5 \min + 0.5 \max 0.5\pi_1 0.5\pi_2$ and define compatibility with RHS=0
- in general $\phi' = \phi 1/n \sum_i \pi_i$
- sum of weights is 0 and

- ▶ good news: if ϕ is compatible with every $\rho \in \mathbb{W}$, then ϕ is compatible with every $\rho \in \mathrm{wRelClo}(\mathbb{W})$
- bad news: superposition (defined naturally) does not work
- ▶ recall for $\phi = 0.5 \min + 0.5 \max$ the inequality was $0.5 \rho(\max(\mathbf{d}_1, \mathbf{d}_2)) + 0.5 \rho(\min(\mathbf{d}_1, \mathbf{d}_2)) \le 0.5 \rho(\mathbf{d}_1) + 0.5 \rho(\mathbf{d}_2)$
- ► this is equivalent to $0.5 \rho(\max(\mathbf{d}_1, \mathbf{d}_2)) + 0.5 \rho(\min(\mathbf{d}_1, \mathbf{d}_2)) - 0.5 \rho(\pi_1(\mathbf{d}_1, \mathbf{d}_2)) - 0.5 \rho(\pi_2(\mathbf{d}_1, \mathbf{d}_2)) \le 0$
- ▶ solution: work with $\phi' = 0.5 \min + 0.5 \max 0.5\pi_1 0.5\pi_2$ and define compatibility with RHS=0

• in general
$$\phi' = \phi - 1/n \sum_i \pi_i$$

sum of weights is 0 and only projections can have negative weight (otherwise 1st item false)

• **Def:** *n*-ary weighting ϕ is

a formal linear combination of operations

$$\phi = \sum_{f:D^n o D} \phi(f) f$$
, where $\sum_f \phi(f) = 0$ and $\phi(f) < 0 \Rightarrow f = \pi_i$

• **Def:** *n*-ary weighting ϕ is

a formal linear combination of operations

$$\phi = \sum_{f:D^n o D} \phi(f) f$$
, where $\sum_f \phi(f) = 0$ and $\phi(f) < 0 \Rightarrow f = \pi_i$

Example: A binary weighting on the domain $D = \{0, 1\}$

$$\phi = 0.5\min + 0.5\max - 0.5\pi_1 - 0.5\pi_2$$

• **Def:** *n*-ary weighting ϕ is

a formal linear combination of operations

$$\phi = \sum_{f:D^n o D} \phi(f) f$$
, where $\sum_f \phi(f) = 0$ and $\phi(f) < 0 \Rightarrow f = \pi_i$

• **Example:** A binary weighting on the domain $D = \{0, 1\}$

$$\phi = 0.5\min + 0.5\max - 0.5\pi_1 - 0.5\pi_2$$

Def: n-ary φ = ∑ φ(f)f is compatible with ρ : D^m → Q if for any d₁,..., d_n ∈ Feas(ρ)

$$\sum_{f \in \mathsf{supp}(\phi)} \phi(f) \, \rho(f(\mathbf{d}_1, \dots, \mathbf{d}_n)) \leq 0$$

• **Def:** *n*-ary weighting ϕ is

a formal linear combination of operations

$$\phi = \sum_{f:D^n o D} \phi(f) f$$
, where $\sum_f \phi(f) = 0$ and $\phi(f) < 0 \Rightarrow f = \pi_i$

• **Example:** A binary weighting on the domain $D = \{0, 1\}$

$$\phi = 0.5\min + 0.5\max - 0.5\pi_1 - 0.5\pi_2$$

Def: n-ary φ = ∑ φ(f)f is compatible with ρ : D^m → Q if for any d₁,..., d_n ∈ Feas(ρ)

$$\sum_{f \in \mathsf{supp}(\phi)} \phi(f) \, \rho(f(\mathbf{d}_1, \dots, \mathbf{d}_n)) \leq 0$$

wPol, wInv defined analogously to Pol, Inv.

superposition

- Weighting can be superposed with operations in a natural way
- Example:
 - binary $\phi = 0.3 \max + 0.2\pi_1 0.5\pi_2$
 - will be superposed with ternary $f_1 = \pi_3$, $f_2 = \max_{123}$

superposition

- Weighting can be superposed with operations in a natural way
- Example:
 - binary $\phi = 0.3 \max + 0.2\pi_1 0.5\pi_2$
 - will be superposed with ternary $f_1 = \pi_3$, $f_2 = \max_{123}$
 - we get

$$\begin{aligned} \phi(\pi_3, \max_{123}) &= 0.3 \max(\pi_3, \max_{123}) + 0.2\pi_1(\pi_3, \max_{123}) \\ &\quad -0.5\pi_2(\pi_3, \max_{123}) \\ &= 0.3 \max_{123} + 0.2\pi_3 - 0.5 \max_{123} \\ &= 0.2\pi_3 - 0.2 \max_{123} \end{aligned}$$

superposition

- Weighting can be superposed with operations in a natural way
- Example:
 - binary $\phi = 0.3 \max + 0.2\pi_1 0.5\pi_2$
 - will be superposed with ternary $f_1 = \pi_3$, $f_2 = \max_{123}$
 - we get

$$\phi(\pi_3, \max_{123}) = 0.3 \max(\pi_3, \max_{123}) + 0.2\pi_1(\pi_3, \max_{123}) \\ - 0.5\pi_2(\pi_3, \max_{123}) \\ = 0.3 \max_{123} + 0.2\pi_3 - 0.5 \max_{123} \\ = 0.2\pi_3 - 0.2 \max_{123}$$

 ▶ Oops, this is not a weighting (negative weight on a non-projection)
 → this superposition is improper

- ► the following two weighted relational clones over D = {0,1} have no nonzero compatible weightings
 - \blacktriangleright all weighted relations ρ
 - ▶ all weighted relations p with Feas(p) in the smallest relational clone
- these weighted clones are different

- ► the following two weighted relational clones over D = {0,1} have no nonzero compatible weightings
 - \blacktriangleright all weighted relations ρ
 - ▶ all weighted relations p with Feas(p) in the smallest relational clone
- these weighted clones are different
- Solution: Define weighting and weighted clone over a fixed (normal) clone
- (and adjust the definition of wlnv accordingly)

weighted clones

- Def: Let A be a clone. A weighted clone over A is a set of weightings W, whose supports are contained in A, and which is closed under
 - (1) nonnegative scaling,
 - (2) addition of weightings, and
 - (3) proper superposition with operations from A.

weighted clones

- Def: Let A be a clone. A weighted clone over A is a set of weightings W, whose supports are contained in A, and which is closed under
 - (1) nonnegative scaling,
 - (2) addition of weightings, and
 - (3) proper superposition with operations from A.
- Fact: if φ is a weighting that can be generated from W by using (1),(2), and all superpositions, then φ can be generated by (1),(2),(3).

weighted clones

- Def: Let A be a clone. A weighted clone over A is a set of weightings W, whose supports are contained in A, and which is closed under
 - (1) nonnegative scaling,
 - (2) addition of weightings, and
 - (3) proper superposition with operations from A.
- Fact: if φ is a weighting that can be generated from W by using (1),(2), and all superpositions, then φ can be generated by (1),(2),(3).
- Corollary: if W is a set of weightings over A, then

$$\mathsf{wClo}^{k}(\mathbf{W}) = \left\{ \sum_{i} a_{i} \phi_{i}(f_{i1}, \dots, f_{ik_{i}}) : a_{i} \geq 0, \phi_{i} \in \mathbf{W}, f i j \in \mathbf{A} \right\}$$
$$\cap \{\mathsf{all } k\text{-ary weightings} \}$$

Theorem (Cohen, Cooper, Creed, Jeavons, Živný)

If W is a finitely generated weighted clone over A then $W = {\sf wPol}({\sf wInv}_A(W))$

Theorem (Cohen, Cooper, Creed, Jeavons, Živný)

If W is a finitely generated weighted clone over A then $W = {\sf wPol}({\sf wInv}_A(W))$

Proof similar to unweighted situation + Farkas' lemma:

Theorem (Cohen, Cooper, Creed, Jeavons, Živný)

If W is a finitely generated weighted clone over A then $W = \mathsf{wPol}(\mathsf{wInv}_A(W))$

Proof similar to unweighted situation + Farkas' lemma:

Is there a solution with $x, y, z \ge 0$?

$$4x - 5y - 4z = 2$$
$$3x - 3y - 2z = 1$$

Theorem (Cohen, Cooper, Creed, Jeavons, Živný)

If W is a finitely generated weighted clone over A then $W = \mathsf{wPol}(\mathsf{wInv}_A(W))$

Proof similar to unweighted situation + Farkas' lemma:

Is there a solution with $x, y, z \ge 0$?

$$4x - 5y - 4z = 2$$
$$3x - 3y - 2z = 1$$

No! 2×1 st equation -3×2 nd equation gives

$$-x - y - 2z = 1$$

Theorem (Cohen, Cooper, Creed, Jeavons, Živný)

If W is a finitely generated weighted clone over A then $W = {\sf wPol}({\sf wInv}_A(W))$

Proof similar to unweighted situation + Farkas' lemma:

Is there a solution with $x, y, z \ge 0$?

$$4x - 5y - 4z = 2$$
$$3x - 3y - 2z = 1$$

No! 2×1 st equation -3×2 nd equation gives

$$-x - y - 2z = 1$$

Farkas' lemma: if $A\mathbf{x} = \mathbf{b}, \mathbf{x} \ge \mathbf{o}$ unsolvable then $\exists \mathbf{y} \text{ such that } \mathbf{y}^T A \le \mathbf{o}, \ \mathbf{y}^T \mathbf{b} > 0$

Theorem (Cohen, Cooper, Creed, Jeavons, Živný)

If W is a finitely generated weighted clone over A then $W = \mathsf{wPol}(\mathsf{wInv}_A(W))$

Proof.

assume $\tau \notin \mathbf{W} = \text{wClo}(\phi_1, \dots, \phi_k)$ (say *n*-ary). want: $\rho \in \text{wInv}(\mathbf{W})$ which is not compatible with τ

Theorem (Cohen, Cooper, Creed, Jeavons, Živný)

If W is a finitely generated weighted clone over A then $W = \mathsf{wPol}(\mathsf{wInv}_A(W))$

Proof.

assume $\tau \notin \mathbf{W} = \mathsf{wClo}(\phi_1, \dots, \phi_k)$ (say *n*-ary).

want: $ho \in \mathsf{wInv}(\mathbf{W})$ which is not compatible with au

► Feas(ρ) := all n-ary operations in A (|D|ⁿ-ary)

Theorem (Cohen, Cooper, Creed, Jeavons, Živný)

If W is a finitely generated weighted clone over A then $W = \mathsf{wPol}(\mathsf{wInv}_A(W))$

Proof.

assume $\tau \notin \mathbf{W} = \mathsf{wClo}(\phi_1, \dots, \phi_k)$ (say *n*-ary).

- ► Feas(ρ) := all n-ary operations in A (|D|ⁿ-ary)
- $\tau = \sum_{i=1}^{k} \sum_{\mathbf{f}...\mathbf{tuple}} \text{ of } n\text{-ary op's } x_{i,s}\phi_i(\mathbf{f})$

Theorem (Cohen, Cooper, Creed, Jeavons, Živný)

If W is a finitely generated weighted clone over A then $W = \mathsf{wPol}(\mathsf{wInv}_A(W))$

Proof.

assume
$$\tau \notin \mathbf{W} = \mathsf{wClo}(\phi_1, \dots, \phi_k)$$
 (say *n*-ary).

- ► Feas(ρ) := all n-ary operations in A (|D|ⁿ-ary)
- $\tau = \sum_{i=1}^{k} \sum_{\mathbf{f}...\mathbf{tuple}} \text{ of } n\text{-ary op's } x_{i,s}\phi_i(\mathbf{f})$
- ▶ system of LE: variables $x_{i,s}$, one equation for each $f \in \mathbf{A}$

Theorem (Cohen, Cooper, Creed, Jeavons, Živný)

If W is a finitely generated weighted clone over A then $W = \mathsf{wPol}(\mathsf{wInv}_A(W))$

Proof.

assume
$$\tau \notin \mathbf{W} = \mathsf{wClo}(\phi_1, \dots, \phi_k)$$
 (say *n*-ary).

•
$$\tau = \sum_{i=1}^{k} \sum_{\mathbf{f}...\mathbf{tuple}} \text{ of } n\text{-ary op's } x_{i,s}\phi_i(\mathbf{f})$$

- ▶ system of LE: variables $x_{i,s}$, one equation for each $f \in \mathbf{A}$
- does not have a nonnegative solution (since $\tau \notin \mathbf{W}$)

Theorem (Cohen, Cooper, Creed, Jeavons, Živný)

If W is a finitely generated weighted clone over A then $W = {\sf wPol}({\sf wInv}_A(W))$

Proof.

assume
$$\tau \notin \mathbf{W} = \mathsf{wClo}(\phi_1, \dots, \phi_k)$$
 (say *n*-ary).

•
$$\tau = \sum_{i=1}^{k} \sum_{\mathbf{f}...\mathbf{tuple}} \text{ of } n\text{-ary op's } x_{i,s}\phi_i(\mathbf{f})$$

- ▶ system of LE: variables $x_{i,s}$, one equation for each $f \in \mathbf{A}$
- does not have a nonnegative solution (since $\tau \notin \mathbf{W}$)
- Farkas' lemma $\rightarrow y_f$ for each $f \in \mathbf{A}$. Put $\rho(f) = y_f$.

Theorem (Cohen, Cooper, Creed, Jeavons, Živný)

If W is a finitely generated weighted clone over A then $W = {\sf wPol}({\sf wInv}_A(W))$

Proof.

assume
$$\tau \notin \mathbf{W} = \mathsf{wClo}(\phi_1, \dots, \phi_k)$$
 (say *n*-ary).

- ► $\tau = \sum_{i=1}^{k} \sum_{\mathbf{f}...\mathbf{tuple}} \text{ of } n\text{-ary op's } x_{i,s}\phi_i(\mathbf{f})$
- ▶ system of LE: variables $x_{i,s}$, one equation for each $f \in \mathbf{A}$
- ▶ does not have a nonnegative solution (since $\tau \notin \mathbf{W}$)
- Farkas' lemma $\rightarrow y_f$ for each $f \in \mathbf{A}$. Put $\rho(f) = y_f$.
- ρ is in wlnv(**W**) and not compatible with au

many lattices of weighted clones

- lattice of weighted clones over a fixed clone A
- lattice of weighted clones (neglect A)

many lattices of weighted clones

- lattice of weighted clones over a fixed clone A
- lattice of weighted clones (neglect A)
- for non-finitely generated weighted clones (still on finite domain)
 - \blacktriangleright we need $\mathbb R$ instead of $\mathbb Q$
 - we need to consider closed weighted clones

Fulla, Živný

results and questions

- minimal and maximal clones
- Boolean domain
- nicer weightings
- positive part

- Thm: Creed, Živný; Thapper, Živný
 Every non-trivial weighted clone W contains a weighting whose support is
 - ▶ a set of unary operations (not projection), or
 - ▶ a set of binary idempotent operations (not projections), or
 - a set of majority operations, or
 - a set of minority operations, or
 - a set of majority operations with total weight 2 and a set of minority operations with total weight 1, or
 - a set of k-ary semiprojections (for some $k \ge 3$)
- ▶ 9 minimal weighted clones on |D| = 2
- ▶ 4 minimal weighted clones over the full clone on |D| = 2

- Thm: Creed, Živný; Thapper, Živný
 Every non-trivial weighted clone W contains a weighting whose support is
 - ▶ a set of unary operations (not projection), or
 - ▶ a set of binary idempotent operations (not projections), or
 - a set of majority operations, or
 - a set of minority operations, or
 - a set of majority operations with total weight 2 and a set of minority operations with total weight 1, or
 - a set of k-ary semiprojections (for some $k \ge 3$)
- 9 minimal weighted clones on |D| = 2
- ▶ 4 minimal weighted clones over the full clone on |D| = 2
- **Problem:** minimal weighted clones (over a given **A**)

- Thm: Creed, Živný; Thapper, Živný
 Every non-trivial weighted clone W contains a weighting whose support is
 - ▶ a set of unary operations (not projection), or
 - ▶ a set of binary idempotent operations (not projections), or
 - a set of majority operations, or
 - a set of minority operations, or
 - a set of majority operations with total weight 2 and a set of minority operations with total weight 1, or
 - a set of k-ary semiprojections (for some $k \ge 3$)
- ▶ 9 minimal weighted clones on |D| = 2
- ▶ 4 minimal weighted clones over the full clone on |D| = 2
- Problem: minimal weighted clones (over a given A)
- Problem: maximal weighted clones (over a given A)

- Thm: Creed, Živný; Thapper, Živný
 Every non-trivial weighted clone W contains a weighting whose support is
 - ▶ a set of unary operations (not projection), or
 - a set of binary idempotent operations (not projections), or
 - a set of majority operations, or
 - a set of minority operations, or
 - a set of majority operations with total weight 2 and a set of minority operations with total weight 1, or
 - a set of k-ary semiprojections (for some $k \ge 3$)
- 9 minimal weighted clones on |D| = 2
- ▶ 4 minimal weighted clones over the full clone on |D| = 2
- Problem: minimal weighted clones (over a given A)
- Problem: maximal weighted clones (over a given A)
- Problem: criterions for W = all weightings (of A)

- **Known:** minimal clones
- Known: all weighted clones over some clones at the bottom of the Post lattice Barto, Vančura

- Known: minimal clones
- Known: all weighted clones over some clones at the bottom of the Post lattice Barto, Vančura
- Problem: find maximal weighted clones (over A)

- Known: minimal clones
- Known: all weighted clones over some clones at the bottom of the Post lattice Barto, Vančura
- Problem: find maximal weighted clones (over A)
- Problem: find all weighted clones (over A)
- Problem: weighted clones over A = monotone idempotent operations

- Known: minimal clones
- Known: all weighted clones over some clones at the bottom of the Post lattice Barto, Vančura
- Problem: find maximal weighted clones (over A)
- Problem: find all weighted clones (over A)
- Problem: weighted clones over A = monotone idempotent operations
- possibly easier:
 - find all "fake" weighted clones (negative weights on non-projections allowed) (btw. Question: is there a relational counterpart?)
 - 2. look at proper weightings in these "weighted clones"

• **Theorem:** Thapper, Živný; Kolmogorov

 $\forall k \geq 2 \ \forall \mathbf{W}$ over the full clone if $\exists \phi \in \mathbf{W}$ whose supp. contains a *k*-ary symmetric op then $\exists \phi \in \mathbf{W}$ whose supp. contains only *k*-ary symmetric op's

• **Theorem:** Thapper, Živný; Kolmogorov

 $\forall k \geq 2 \ \forall \mathbf{W}$ over the full clone if $\exists \phi \in \mathbf{W}$ whose supp. contains a *k*-ary symmetric op then $\exists \phi \in \mathbf{W}$ whose supp. contains only *k*-ary symmetric op's

► Theorem: Kozik, Ochremiak

if $\exists \phi \in \mathbf{W}$ whose supp. contains a *k*-ary cyclic op then $\exists \phi \in \mathbf{W}$ whose supp. contains only *k*-ary cyclic op's

• **Theorem:** Thapper, Živný; Kolmogorov

 $\forall k \geq 2 \ \forall \mathbf{W}$ over the full clone if $\exists \phi \in \mathbf{W}$ whose supp. contains a *k*-ary symmetric op then $\exists \phi \in \mathbf{W}$ whose supp. contains only *k*-ary symmetric op's

► Theorem: Kozik, Ochremiak

if $\exists \phi \in \mathbf{W}$ whose supp. contains a *k*-ary cyclic op then $\exists \phi \in \mathbf{W}$ whose supp. contains only *k*-ary cyclic op's

Problem: Assume ∃φ ∈ W whose support contains a majority operation. Does there necessarily ∃φ ∈ W with at least 1/3-weight on majorities?

• **Theorem:** Thapper, Živný; Kolmogorov

 $\forall k \geq 2 \ \forall \mathbf{W}$ over the full clone if $\exists \phi \in \mathbf{W}$ whose supp. contains a *k*-ary symmetric op then $\exists \phi \in \mathbf{W}$ whose supp. contains only *k*-ary symmetric op's

► Theorem: Kozik, Ochremiak

if $\exists \phi \in \mathbf{W}$ whose supp. contains a *k*-ary cyclic op then $\exists \phi \in \mathbf{W}$ whose supp. contains only *k*-ary cyclic op's

- Problem: Assume ∃φ ∈ W whose support contains a majority operation. Does there necessarily ∃φ ∈ W with at least 1/3-weight on majorities?
- ▶ Problem: Assume ∃φ ∈ W whose support contains a Maltsev operation. Does there necessarily ∃φ ∈ W whose support contains only majorities and Maltsevs?

- Def: Positive clone of W is the union of all supports + projections
- Notation: Pos(W)
- ► Fact: always a clone Kozik, Ochremiak

- Def: Positive clone of W is the union of all supports + projections
- Notation: Pos(W)
- Fact: always a clone Kozik, Ochremiak
- ► Theorem: Thapper, Živný; Kolmogorov ∀W over the full clone binary commutative ∈ Pos(W) iff k-ary symmetric ∈ Pos(W) iff k-ary cyclic ∈ Pos(W)

- Def: Positive clone of W is the union of all supports + projections
- Notation: Pos(W)
- Fact: always a clone Kozik, Ochremiak
- Theorem: Thapper, Živný; Kolmogorov
 VW over the full clone

```
binary commutative \in Pos(\mathbf{W}) iff 
k-ary symmetric \in Pos(\mathbf{W}) iff
```

k-ary cyclic $\in \mathsf{Pos}(\mathbf{W})$

Problem: what clones are equal to Pos(W) for some W over a fixed A

- Def: Positive clone of W is the union of all supports + projections
- Notation: Pos(W)
- Fact: always a clone Kozik, Ochremiak
- Theorem: Thapper, Živný; Kolmogorov
 VW over the full clone

binary commutative $\in Pos(\mathbf{W})$ iff *k*-ary symmetric $\in Pos(\mathbf{W})$ iff *k*-ary cyclic $\in Pos(\mathbf{W})$

- Problem: what clones are equal to Pos(W) for some W over a fixed A
- Problem: if W is finitely related, is Pos(W) necessarily finitely related?

weighted varieties – works nicely Kozik, Ochremiak

- weighted varieties works nicely Kozik, Ochremiak
- elements of D can also be weighted seems useful

- weighted varieties works nicely Kozik, Ochremiak
- elements of D can also be weighted seems useful
- use in (normal) UA??? (some indications)

- weighted varieties works nicely Kozik, Ochremiak
- elements of D can also be weighted seems useful
- use in (normal) UA??? (some indications)

Reading:

- ▶ Živný: The complexity of valued constraint satisfaction problems
- Jeavons, Krokhin, Živný: The complexity of valued constraint satisfaction
- Cohen, Cooper, Creed, Jeavons, Živný: An algebraic theory of complexity for discrete optimisation

- weighted varieties works nicely Kozik, Ochremiak
- elements of D can also be weighted seems useful
- use in (normal) UA??? (some indications)

Reading:

- Živný: The complexity of valued constraint satisfaction problems
- Jeavons, Krokhin, Živný: The complexity of valued constraint satisfaction
- Cohen, Cooper, Creed, Jeavons, Živný: An algebraic theory of complexity for discrete optimisation

Thank you!