# Relational Colour Refinement for Non-Relational Signatures

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### Introduction

- Colour Refinement is an important and interesting algorithm
- Applied in modern isomorphism solvers
- Can be characterised logically and combinatorially
- Extension to more than graphs seems desirable
- Scheidt and Schweikardt, 2025 introduced Relational Colour Refinement
- Conceptually similar to classical Colour Refinement
- Also has a logical and a combinatorial characterisation

## Contents of this presentation

- 1. Classical Colour Refinement
- 2. Relational Colour Refinement
- 3. Relational Colour Refinement for Structures With Functions
- 4. Restricting RCR to Subclasses of Relational Structures
- 5. Conclusion

**Classical Colour Refinement** 

### **Colour Refinement**

- Also called CR or 1-dimensional Weisfeiler-Leman algorithm
- Iterative graph algorithm
- Constructs colour for every vertex, based on colours of neighbours
- Initial colour for every  $v \in V$ :  $C_0(v) = 0$
- Next rounds:  $C_{i+1}(v) := (C_i(v), \{\!\{C_i(u) : \{v, u\} \in E\}\!\})$
- CR distinguishes two graphs G and H, if
  - there exists  $C_i(v)$  in colouring of G or H, such that the number of vertices with colour  $C_i(v)$  is different in G than in H

### Characterisations of CR

- There are equivalent characterisations for CR
- Logical characterisation: CR distinguishes G and H if, and only if, there exists  $\varphi \in C_2$ , such that  $G \models \varphi$  and  $H \not\models \varphi$
- Combinatorial characterisation: CR distinguishes G and H if, and only if, there exists tree T, such that  $hom(T,G) \neq hom(T,H)$

**Relational Colour Refinement** 

## Relational Colour Refinement (RCR)

- Applies variant of classical Colour Refinement on tuples of structure
- Uses set of relations that contain tuple as part of initial colouring
- Uses pairs of indices as edges to mark shared elements of tuples
- Formally:

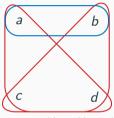
$$\mathsf{atp}(\mathbf{a}) = \{ R \in \sigma : \mathbf{a} \in R \}$$

and

$$\mathsf{stp}(\mathbf{a},\mathbf{b}) = \{(i,j) \in [n] \times [m] : a_i = b_j\}$$

- For relational structure  $\mathfrak A$  and all tuples  $\mathbf a \in \mathbf A$ :
- Initial colour:  $\varrho_0(\mathbf{a}) = (\operatorname{atp}(\mathbf{a}), \operatorname{stp}(\mathbf{a}, \mathbf{a}))$
- For the next rounds:  $\varrho_{i+1}(\mathbf{a}) = (\varrho_i(\mathbf{a}), \{\{(\operatorname{stp}(\mathbf{a}, \mathbf{b}), \varrho_i(\mathbf{b})) : \operatorname{stp}(\mathbf{a}, \mathbf{b}) \neq \emptyset\}\})$

## An Example for RCR

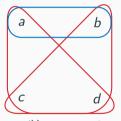


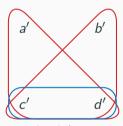
• Structure  $\mathfrak{A} = (A, R^{\mathfrak{A}}, T^{\mathfrak{A}})$ 

- $\varrho_0((a,b)) = (\{R\}, \{(1,1), (2,2)\})$  and  $\varrho_0((a,c,d)) = \varrho_0((b,c,d)) = (\{T\}, \{(1,1), (2,2), (3,3)\})$
- $\varrho_1((a,c,d)) = (\varrho_0((a,c,d)), \{\{(\{(1,1)\}, \varrho_0((a,b))), \dots\}\})$  and  $\varrho_1((b,c,d)) = (\varrho_0((b,c,d)), \{\{(\{(1,2)\}, \varrho_0((a,b))), \dots\}\})$

## Distinguishing Relational Structures with RCR

• RCR distinguishes, if some colour appears differently often in the structures





•  $\varrho_1((a,c,d))$  appears in colouring of left structure but not in right

## **Guarded Fragment of Counting Logic**

- C<sub>2</sub> characterises CR on graphs
- Guarded fragment of counting logic GF(C) characterises RCR

### **Guarded Fragment of Counting Logic**

- Everything except for quantifiers defined as in classical counting logic
- For atomic formula  $\Delta \in GF(C)$  and formula  $\varphi \in GF(C)$ , we call  $\Delta$  a guard for  $\varphi$ , if  $free(\Delta) \supseteq free(\varphi)$
- Quantifiers appear only in form  $\exists^{\geq i} \mathbf{v} . (\Delta \wedge \varphi)$ , where  $\Delta$  is guard for  $\varphi$  and  $\mathsf{set}(\mathbf{v}) \subseteq \mathsf{free}(\Delta)$
- Examples:
  - $\circ \exists^{\geq 2}(x,y).(E(x,y) \land T(y)) \in \mathsf{GF}(\mathsf{C})$
  - $\circ \exists^{\geq 3}(x,y,z).(E(x,y) \land E(y,z) \land E(z,x)) \notin \mathsf{GF}(\mathsf{C})$

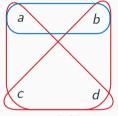
## **Characterising RCR Using Logic**

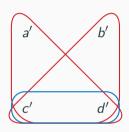
## Theorem B (Scheidt and Schweikardt, 2025)

Let  ${\mathfrak A}$  and  ${\mathfrak B}$  be two relational structures. Then the two following statements are equivalent.

- 1. RCR distinguishes  $\mathfrak A$  and  $\mathfrak B$
- 2. There exists a sentence in GF(C) that is satisfied by  $\mathfrak A$ , but not by  $\mathfrak B$

## **Example for Logical Characterisation of RCR**





- We have seen RCR distinguishes the structures
- Formula  $\exists^{\geq 1}(x,y,z)$ .  $(T(x,y,z) \land \exists^{\geq 1}(y).(R(x,y)))$  satisfied by left and not by right structure

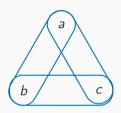
## **Acyclic Structures**

- Counting homomorphisms from trees characterises CR on graphs
- Abstraction from trees to relational structures is needed:  $\alpha$ -acyclic structures (in the following only acyclic structures)

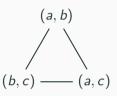
## **Acyclic Structures**

- ullet Relational structure  ${\mathfrak C}$  is acyclic if it has a join tree J
- Join tree J is tree with  $V(J) = \bigcup_{R \in \sigma} R^{\mathfrak{C}}$  and fulfils join-tree-property:
  - $\circ$  For every  $e \in C$ , the set  $\{\mathbf{x} \in V(J) : e \in \mathsf{set}(\mathbf{x})\}$  induces a connected subtree

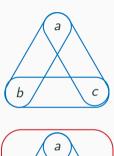
## **Examples for Acyclic Structures**

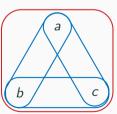


No:

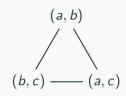


## **Examples for Acyclic Structures**

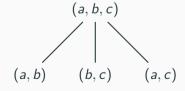








Yes:



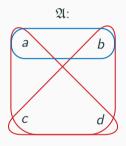
## **Characterising RCR Using Homomorphism Counting**

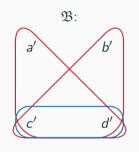
## Theorem A (Scheidt and Schweikardt, 2025)

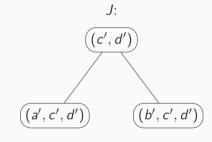
Let  ${\mathfrak A}$  and  ${\mathfrak B}$  be relational structures. Then the two following statements are equivalent.

- 1. RCR distinguishes  $\mathfrak A$  and  $\mathfrak B$
- 2. There exists an acyclic relational structure  $\mathfrak C$ , such that it distinguishes  $\mathfrak A$  and  $\mathfrak B$  by homomorphism count

## **Example for Combinatorial Characterisation of RCR**







- J is join tree for  $\mathfrak{B}$ , therefore  $\mathfrak{B}$  is acyclic
- ullet Identity is homomorphism, so  ${\mathfrak B}$  has at least one homomorphism to itself
- ullet  ${\mathfrak B}$  has no homomorphisms to  ${\mathfrak A}$

**Relational Colour Refinement for Structures** 

With Functions

### **Relational Colour Refinement for Structures With Functions**

- Many interesting structures use functions
- Colour Refinement algorithm for such structures seems desirable
- Will use the results of Scheidt and Schweikardt and investigate how robust they are
- Following structure:
  - 1. Presentation of two approaches for Colour Refinement for non-relational signatures
  - 2. Logical characterisation of both approaches
  - 3. Discussion on combinatorial characterisation

### Naive RCR

- Goal: Encode non-relational structures and signatures as relational ones
- Functions can directly be interpreted as relations:

$$f(\mathbf{x}) = y \iff (\mathbf{x}y) \in R_f$$

- For non-relational signature  $\sigma$  define relational signature  $\sigma'$ :
  - $\circ$  Inherit relation symbols from  $\sigma$
  - $\circ$  Function symbol  $f \in \sigma$  of arity  $n \to \text{introduce } R_f \in \sigma'$  of arity n+1
- Encode  $\sigma$ -structure  $\mathfrak A$  as  $\sigma'$ -structure  $\mathfrak A'$ :
  - $\circ$  Relations like in  $\mathfrak A$
  - For function symbol  $f \in \sigma$ :  $R_f^{\mathfrak{A}'} := \{(\mathbf{x}y) : f^{\mathfrak{A}}(\mathbf{x}) = y\}$
- ullet We say naive RCR distinguishes  ${\mathfrak A}$  and  ${\mathfrak B}$ , if RCR distinguishes the encodings

## Idea of the Transitive Expansion

- Approach is only defined for unary function symbols
- Encoding emulates the nesting of function applications
- Encode function f as family of relations  $R_{f^1}, R_{f^2}, \ldots$ , where  $(x, y) \in R_{f^i}$  if  $\underbrace{f(f(\ldots f(x)))}_{i \text{ times}} = y$
- In the following:  $f^i(x)$  written for  $\underbrace{f(f(...f(x)))}_{i \text{ times}}$
- ullet For multiple functions, also encode alternations, for example  $R_{fg}$  or  $R_{g^2f^3}$

## Transitive Expansion i

### **Alternations of Function Applications**

- Let  $\sigma$  be signature with unary function symbols
- Define set of all allowed function application alternations Alters $_n^k$  as all sequences of up to k function symbols, where
  - 1. Every function symbol has exponent in [n]
  - 2. Two succeeding function symbols are different
- Example:

$$\circ \sigma = \{f/1, g/1\}$$

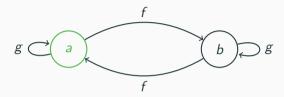
$$\circ \mathsf{Alters}_2^2(\sigma) = \underbrace{\{\mathsf{id}\}}_{k=0} \cup \underbrace{\{f, f^2, g, g^2\}}_{k=1} \cup \underbrace{\{fg, fg^2, f^2g, f^2g^2, gf, \dots\}}_{k=2}$$

## Transitive Expansion ii

### **Transitive Expansion**

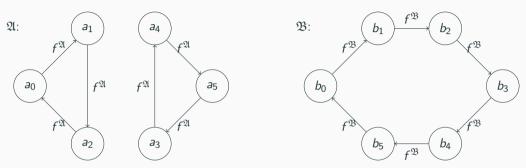
- For alternation depth k and  $\sigma$ -structure  $\mathfrak A$  with  $|\mathfrak A|=n$  define signature  $\widetilde{\sigma}$  and transitive expansion  $\widetilde{\mathfrak A}$  as  $\widetilde{\sigma}$ -structure
- For all  $\alpha, \beta, \alpha_1, \ldots, \alpha_\ell \in \mathsf{Alters}^k_n(\sigma)$  and relation symbol  $R \in \sigma$  of arity  $\ell$ , insert relation symbol  $\mathsf{Eq}_{\alpha,\beta}$  of arity 2 and relation symbol  $R_{\alpha_1,\ldots,\alpha_\ell}$  of arity  $\ell$  into  $\widetilde{\sigma}$
- Define  $\mathsf{Eq}_{\alpha,\beta}^{\widetilde{\mathfrak{A}}} \coloneqq \{(x,y) : \alpha^{\mathfrak{A}}(x) = \beta^{\mathfrak{A}}(y)\}$  and  $R_{\alpha_{1},\dots,\alpha_{\ell}}^{\widetilde{\mathfrak{A}}} \coloneqq \{(x_{1},\dots,x_{\ell}) : (\alpha_{1}^{\mathfrak{A}}(x_{1}),\dots,\alpha_{\ell}^{\mathfrak{A}}(x_{\ell})) \in R^{\mathfrak{A}}\}$
- For  $k \in \mathbb{N}$  we say that  $RCR_k$  distinguishes structures  $\mathfrak A$  and  $\mathfrak B$ , if RCR distinguishes the transitive expansions with alternation depth k

## **Example for the Transitive Expansion**



- Structure  $\mathfrak{A} = (A, R^{\mathfrak{A}}, f^{\mathfrak{A}}, g^{\mathfrak{A}})$
- k = 1 and n = 2: Alters $\frac{1}{2}(\sigma) = \{id, f, f^2, g, g^2\}$
- $\bullet \ \ \widetilde{\sigma} = \{R_{\mathsf{id}}, R_f, R_{f^2}, R_g, R_{g^2}, \mathsf{Eq}_{\mathsf{id},\mathsf{id}}, \mathsf{Eq}_{\mathsf{id},f}, \mathsf{Eq}_{\mathsf{id},f^2}, \dots, \mathsf{Eq}_{g^2,g^2}\}$
- Examples:
  - $\circ \ R_f^{\widetilde{\mathfrak{A}}} = \{b\}$
  - $\circ \ \mathsf{Eq}^{\widetilde{\mathfrak{A}}}_{f^2,\mathsf{id}} = \{(a,a),(b,b)\}$
  - $\circ \ \mathsf{Eq}^{\widetilde{\mathfrak{A}}}_{g,f} = \{(a,b),(b,a)\}$

## Naive Encoding versus Transitive Expansion



- Cannot be distinguishes by naive RCR: Encodings result in regular graphs
- But: Distinguished by Transitive Expansion Encoding
  - $\circ \ \mbox{We find that} \ \mbox{Eq}_{f^1, \mbox{id}}^{\widetilde{\mathfrak{A}}} = \mbox{Eq}_{f^4, \mbox{id}}^{\widetilde{\mathfrak{A}}}, \ \mbox{not for} \ \widetilde{\mathfrak{B}}$
  - $\circ \ \, \mathsf{Sentence} \,\, \exists^{\geq 6}(x,y) \, . \, \big(\mathsf{Eq}_{f^1,\mathsf{id}}(x,y) \, \land \, \mathsf{Eq}_{f^4,\mathsf{id}}(x,y)\big) \in \mathsf{GF}(\mathsf{C}) \,\, \mathsf{distinguishes} \,\, \mathsf{encodings}$

# Relational Colour Refinement for Structures

With Functions

**Logical Characterisations for Both Approaches** 

## Nesting-Free Guarded Fragment of Counting Logic

## nfGF(C)

- Extends given definition of GF(C) for non-relational signatures
- Allow atomics of the following forms
  - Relation symbols and variable equations like in GF(C)
  - For function symbol f of arity  $\ell$  and variables  $x_1, \ldots, x_\ell, y$ :  $f(x_1, \ldots, x_\ell) = y \in \mathsf{nfGF}(\mathsf{C})$
- Forbid nesting of terms, for example f(g(x), y) = z
- Informally: Usage of function symbols like relation symbols

## **Characterising Naive RCR Logically**

## Logical Characterisation of Naive RCR

Let  $\mathfrak A$  and  $\mathfrak B$  be structures.

Naive RCR distinguishes  $\mathfrak A$  and  $\mathfrak B$  iff.

There exists a sentence  $\varphi \in nfGF(C)$  which is fulfilled by  $\mathfrak A$ , but not by  $\mathfrak B$ 

### Proof idea:

- Naive RCR distinguishes structures iff. RCR distinguishes encodings iff. there
  exists a sentence in GF(C) that distinguishes the encodings
- Define translation of GF(C) to and from nfGF(C)
  - Replace  $R_f(\mathbf{x}y)$  by  $f(\mathbf{x}) = y$

# GF(C) with alternation depth k ( $GF(C)_k$ )

## GF(C) with alternation depth k

- Fixate  $k \in \mathbb{N}$
- Atomics are defined like in natural extension to non-relational signatures, with one restriction
- For every formula in  $GF(C)_k$  and every term t that appears in it, there must exist a  $n \in \mathbb{N}$ , such that  $t = \alpha$  for a  $\alpha \in Alters_n^k(\sigma)$
- Restrict number of alternations of function applications to k
- No restriction of number of application of same function in series
- Examples:
  - $\circ f^2(g(h^3(x))) = y \notin GF(C)_2, \text{ but in } GF(C)_3$
  - $\circ f^i(x) = y \in GF(C)_1 \text{ for all } i \in \mathbb{N}$

## Characterising RCR<sub>k</sub> Logically

## Logical Characterisation of RCR<sub>k</sub>

Let  $k \in \mathbb{N}$  and let  $\mathfrak{A}$  and  $\mathfrak{B}$  be two structures.

 $\mathsf{RCR}_k$  distinguishes  $\mathfrak A$  and  $\mathfrak B$  iff.

There exists a sentence in  $GF(C)_k$  that is fulfilled by  $\mathfrak{A}$ , but not by  $\mathfrak{B}$ 

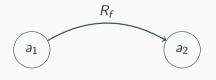
- 1. to 2.: Similar to before, translation from GF(C) to  $GF(C)_k$  very simple
- 2. to 1.:
  - $\circ$  Assume  $n = |\mathfrak{A}| = |\mathfrak{B}|$
  - Translate and replace all atomic subformulae by formula that:
     is equivalent for all structures with n elements
    - only contains terms  $f^{i}(s(x))$  with  $i \leq n$
  - Rearrange resulting formula to get valid GF(C)<sub>k</sub>-sentence
  - Results in equivalent formula for structures with n elements and for every term t there exists an  $\alpha \in \mathsf{Alters}_n^k(\sigma)$ , such that  $t = \alpha$
  - $\circ$  Can easily be translated into sentence in GF(C) of signature  $\widetilde{\sigma}$

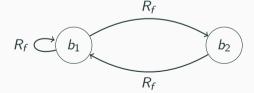
**Relational Colour Refinement for Structures** With Functions

Discussion on the Combinatorial Characterisation

### **Total and Functional Structures**

- ullet Let  $\sigma$  be a signature,  $\sigma'$  its naive encoding and  $\mathfrak{A}'$  a  $\sigma'$ -structure
- We call  $\mathfrak{A}'$  total if for every function symbol  $f \in \sigma$  and every tuple  $\mathbf{x}$  there is a y, such that  $(\mathbf{x}y) \in R_f^{\mathfrak{A}'}$
- We call  $\mathfrak{A}'$  functional if for every function symbol  $f \in \sigma$  there are no two tuples  $(\mathbf{x}y), (\mathbf{x}z) \in R_f^{\mathfrak{A}'}$





## Non-Relational Acyclic Structures

• Will define acyclicity w.r.t. the naive encoding

## **Non-Relational Acyclic Structures**

- $\bullet$  Let  ${\mathfrak A}$  be a non-relational structure
- $\bullet$  We call  ${\mathfrak A}$  acyclic, if its naive encoding  ${\mathfrak A}'$  is acyclic

## **Total and Functional Structures as Encodings**

• Desired equivalence:

Non-relational, acyclic structure distinguishes  ${\mathfrak A}$  and  ${\mathfrak B}$  by homomorphism count ?

Naive RCR distinguishes  ${\mathfrak A}$  and  ${\mathfrak B}$ 

- Result: Forward direction holds, backwards does not
- First step: Reformulate first statement:

Some non-relational, acyclic structure dist.  ${\mathfrak A}$  and  ${\mathfrak B}$  by hom. count iff.

Some total, functional and acyclic structure dist. encodings  $\mathfrak{A}'$  and  $\mathfrak{B}'$  by hom. count

## **Enforcing Functionality**

• We can show:

Acyclic  $\sigma'$ -structure dist.  $\mathfrak{A}'$  and  $\mathfrak{B}'$  by hom. count iff.

Functional and acyclic  $\sigma'$ -structure dist.  $\mathfrak{A}'$  and  $\mathfrak{B}'$  by hom. count

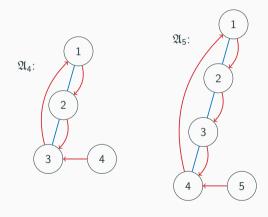
### Proof idea:

- Backwards direction is obvious
- Forwards direction eliminates collisions of the form  $(xy), (xz) \in R_f$  by contracting y and z
- This can be done while maintaining the homomorphisms and acyclicity and can be repeated until no collisions remain

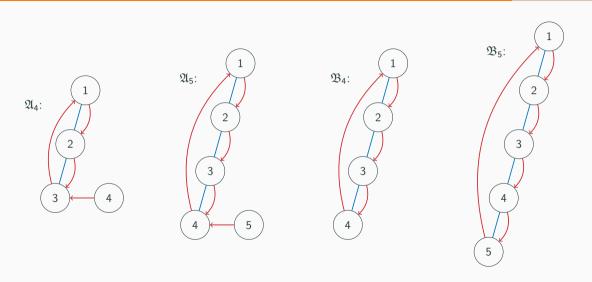
## Non-Enforceability of Totality

- There are structures that are distinguished by naive RCR, but there is no acyclic and total structure that distinguishes the encodings by homomorphism count
- Define signature  $\sigma = \{E/2, f/1\}$
- Two families of  $\sigma$ -structures  $(\mathfrak{A}_i)_{i\in\mathbb{N}_{\geq 4}}$  and  $(\mathfrak{B}_i)_{i\in\mathbb{N}_{\geq 4}}$
- For all  $i \in \mathbb{N}_{\geq 4}$ : Naive RCR distinguishes  $\mathfrak{A}_i$  and  $\mathfrak{B}_i$ , but no total and acyclic structure can distinguish the encodings by hom. count

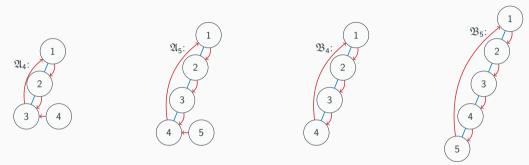
## Non-Enforceability of Totality ii



## Non-Enforceability of Totality ii



## Non-Enforceability of Totality iii



- Obviously distinguished by naive RCR
- If structure has  $R_f$ -loops or  $R_f$ -2-cycles, then no homomorphisms to either structure
- ullet Because total, it has to contain larger  $R_f$ -cycles, but then cannot be acyclic

### Results of combinatorial characterisation of naive RCR

We have the following results:

Naive RCR distinguishes  $\mathfrak A$  and  $\mathfrak B$ 

1

There exists acyclic structure that dist. encodings  $\mathfrak{A}'$  and  $\mathfrak{B}'$  by hom. count

1

There exists functional and acyclic structure that dist. encodings by hom. count

↑, but ∦

There exists *total*, functional and acyclic structure that dist. encodings by hom. count

 $\downarrow$ 

There exists *non-relational* and acyclic structure that dist.  $\mathfrak A$  and  $\mathfrak B$  by hom. count

Restricting RCR to Subclasses of Relational

**Structures** 

## **Restricting the Class of Structures**

ullet For what subclass  ${\cal S}$  of relational structures do we have the following equivalence:

Two structures from  $\mathcal S$  get distinguished by RCR iff.

There exists an acyclic structure from  ${\cal S}$  that dist. the structures by hom. count

- Does not hold for class of total structures
  - Encodings of families of structures from before are total, but no total and acyclic structure dist. them by hom. count
- Another class to investigate: Class of symmetric structures

## **Restriction to Symmetric Structures**

• Relational Structure is symmetric, if for every relation R and for every tuple  $\mathbf{x} \in R$ , every permutation of the elements in  $\mathbf{x}$  is also in R

## **Restriction to Symmetric Structures**

- Relational Structure is symmetric, if for every relation R and for every tuple  $x \in R$ , every permutation of the elements in x is also in R
- For two symmetric structures we can show
  - There exists acyclic structure that dist. the structures by hom. count iff.
  - There exists symmetric and acyclic structure that dist. the structure by hom. count
- From this, restriction to symmetric structures is possible

# Conclusion

### Conclusion

- We presented classical CR and Scheidt's and Schweikardt's RCR algorithm
- We defined two possible ways to apply their algorithm to non-relational signatures
- We showed a logical characterisation for each of the approaches
- We disproved the characterisation by homomorphism counting
- We showed results for the restriction to two subclasses of the relational structures