

Efficient Coalgebraic Partition Refinement

From Categorical Constructions to Tool Implementation

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Joint work with:

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Thorsten Wißmann

Friedrich-Alexander-Universität Erlangen-Nürnberg

CATMI 2023, Bergen

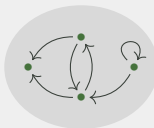
June 28, 2023

Efficient Coalgebraic Partition Refinement

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1. Coalgebras:

State based
systems

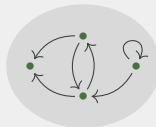


Labels, Non-Determinism,
Probabilities, Automata,
... and their combinations!

Efficient Coalgebraic Partition Refinement

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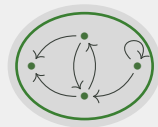
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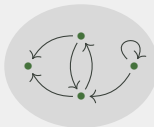
Successively distinguish
different behaviour



Efficient Coalgebraic Partition Refinement

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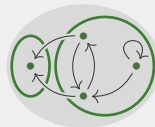
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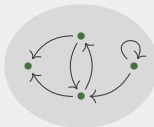
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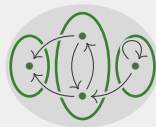
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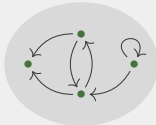
Efficient Coalgebraic Partition Refinement

3. Efficiency:

- (a) Incrementally compute partitions
- (b) Complexity Analysis:
 $\mathcal{O}(m \cdot \log n)$
↑ edges ↑ states
- (c) Tool

1. Coalgebras:

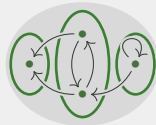
State based systems



Labels, Non-Determinism, Probabilities, Automata, ... and their combinations!

2. Partition Refinement:

Successively distinguish different behaviour



Share Common
Structure & Ideas

Similar
Run-Time

Variations in
Details

Share Common
Structure & Ideas

Deterministic
Finite Automata

$$n \cdot \log n \quad |A| \cdot n \cdot \log n$$

Hopcroft '71 Gries '73
Knuutila '01

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Paige, Tarjan '87

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Segala Systems

$$m \cdot n \cdot (\log m + \log n)$$

Baier, Engelen,
Majster-Cederbaum '00

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Tree Automata

$$m \cdot n$$

Högberg, Maletti,
May '07

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Weighted Systems ("Markov Chain Lumping")

$$m \cdot \log n$$

Valmari, Franceschinis '10



Generic & Efficient
Partition Refinement Algorithm

Deterministic
Finite Automata

$n \cdot \log n$ | $|A| \cdot n \cdot \log n$
Hopcroft '71 Gries '73
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Ingredient 1: Factorizations

Equivalence Relations \cong Quotients \cong Partitions

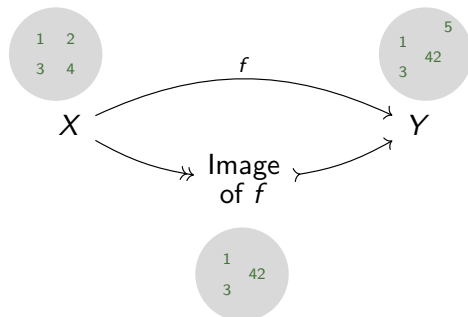
Kernels \cong Regular Epimorphisms

Ingredient 1: Factorizations

Equivalence Relations \cong Quotients \cong Partitions

Kernels \cong Regular Epimorphisms

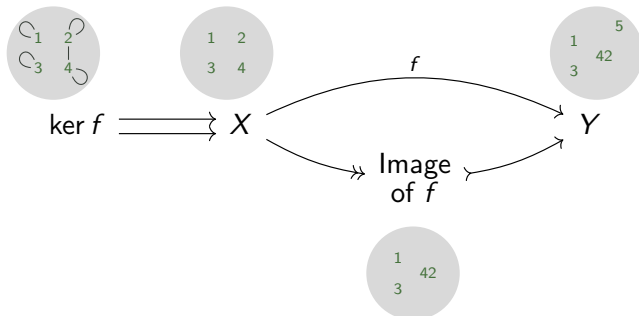
Category with (Regular Epi, Mono)-Factorizations



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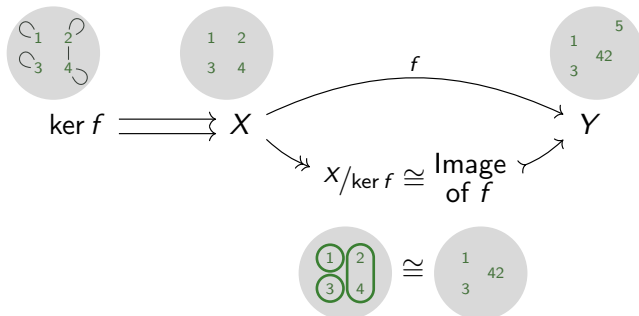


$$\ker f = \{(x_1, x_2) \in X \times X \mid f(x_1) = f(x_2)\}$$

Ingredient 1: Factorizations

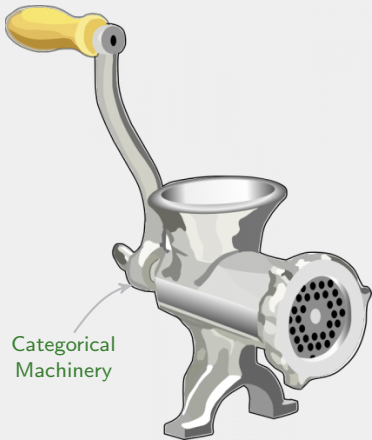
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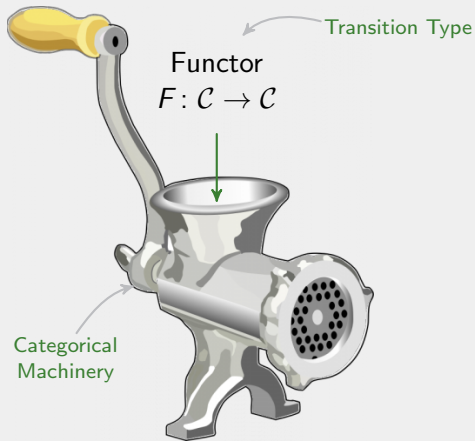


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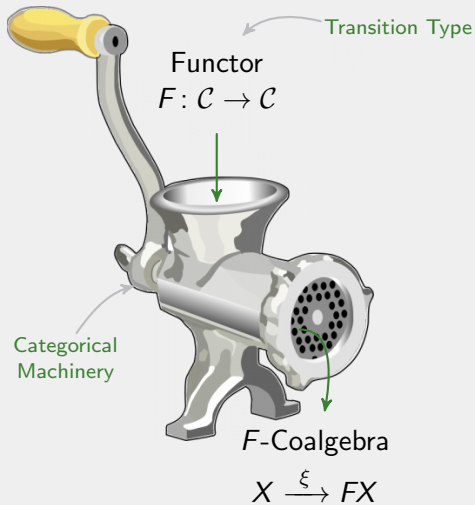
Ingredient 2: Coalgebra – Generic state based systems



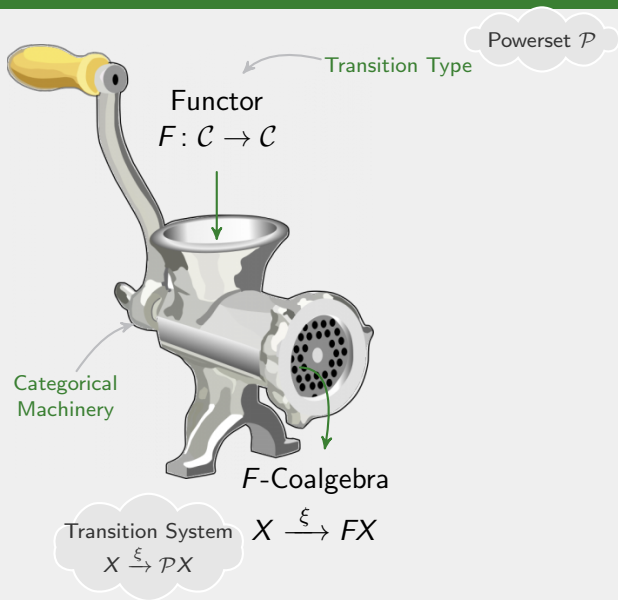
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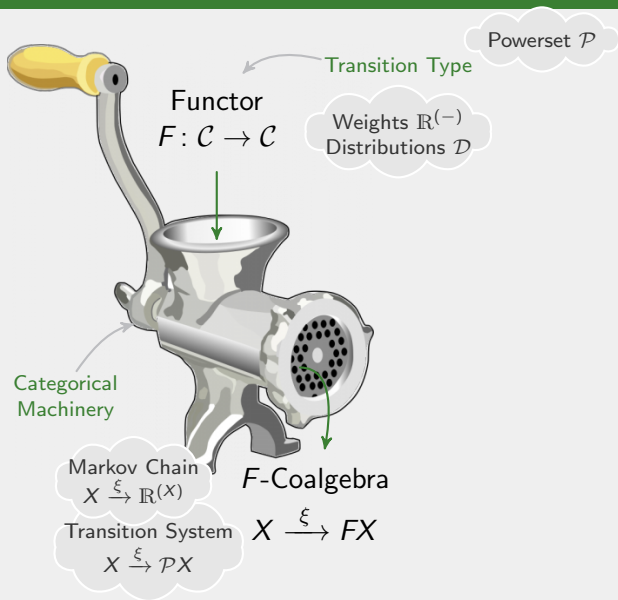
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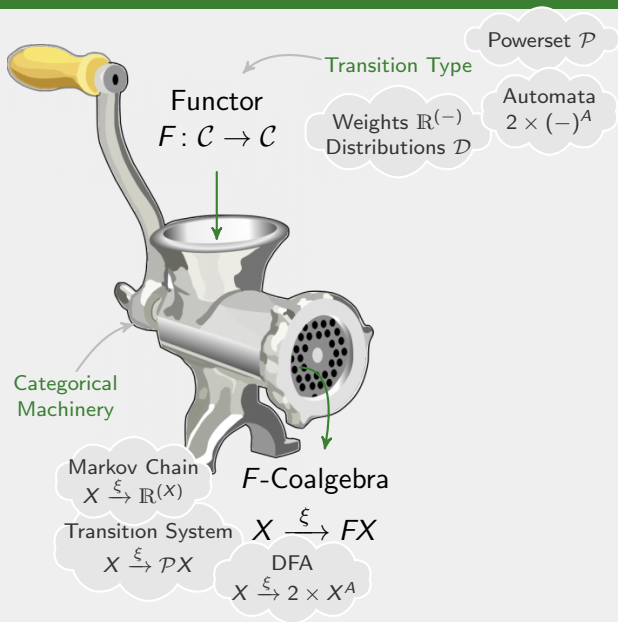
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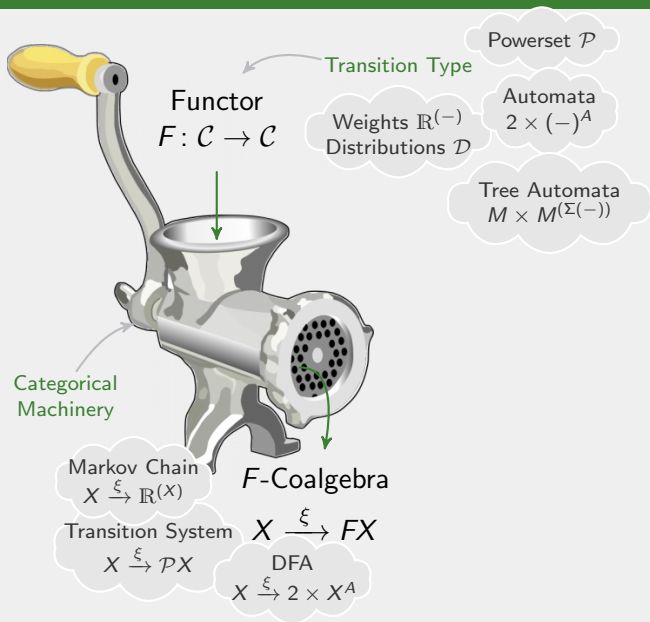
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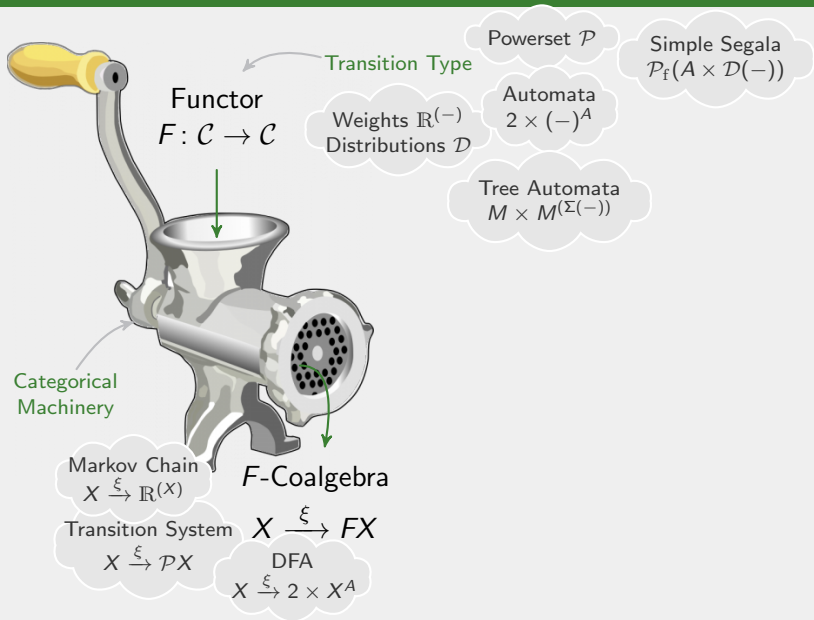
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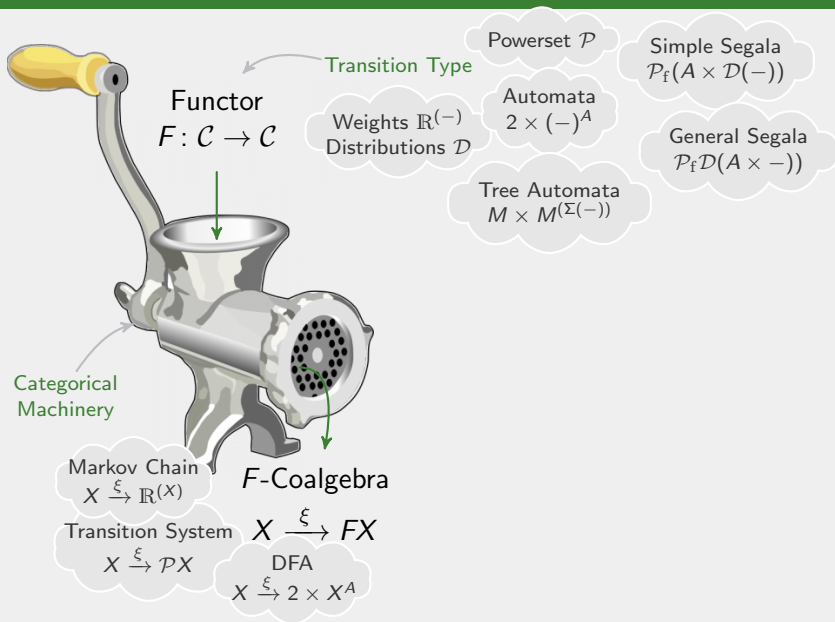
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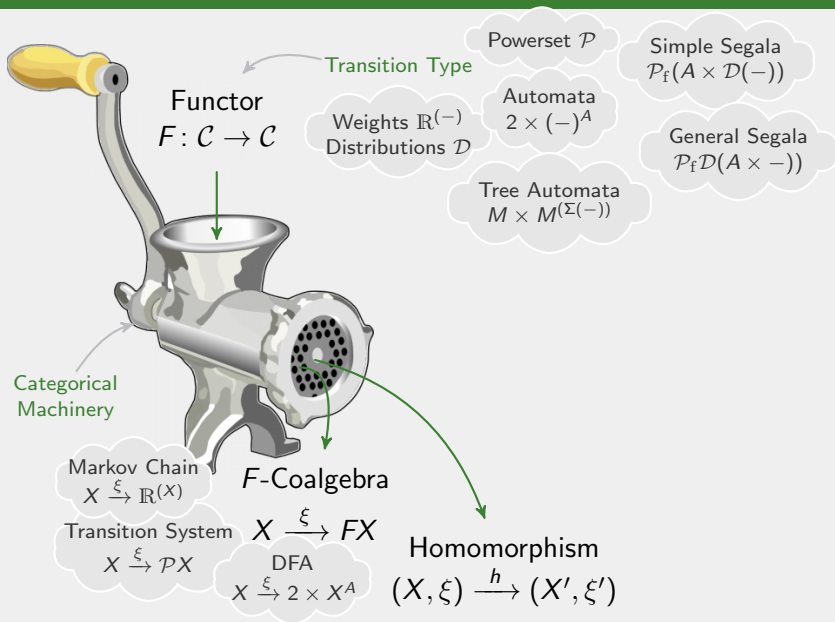
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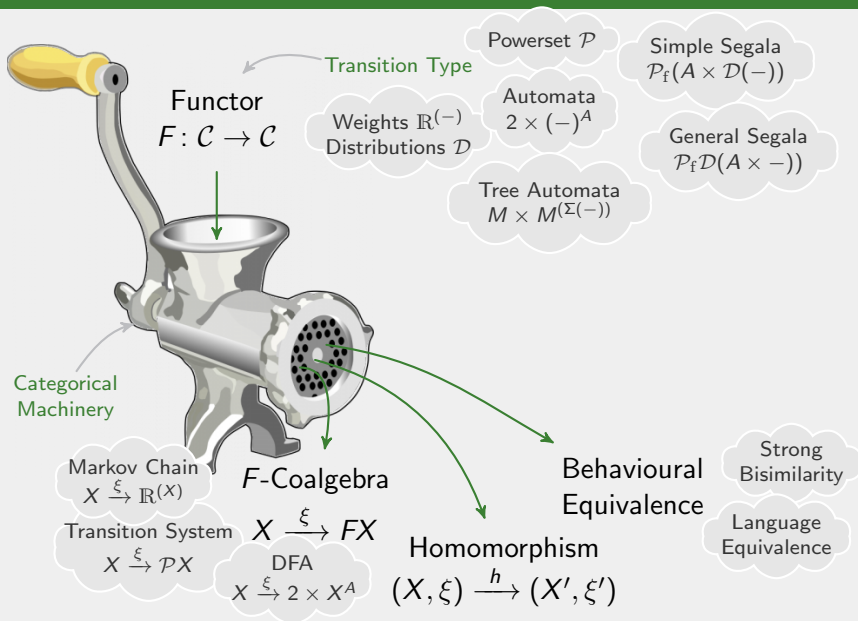
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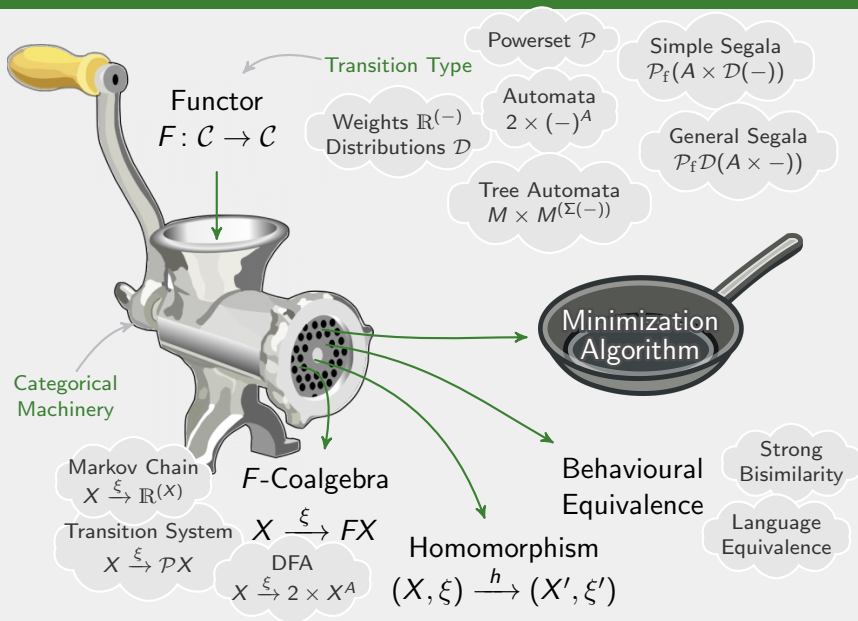
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Ingredient 2: Coalgebra – Generic state based systems



The Coalgebraic Task

For a functor $F: \mathcal{C} \rightarrow \mathcal{C}$

Given a coalgebra $X \xrightarrow{\xi} FX$

$$\begin{array}{ccc} X & \xrightarrow{\xi} & FX \\ h \downarrow & & \downarrow Fh \\ X' & \xrightarrow{\xi'} & FX' \end{array}$$

no proper
quotient

find the **simple** quotient

all equivalent
behaviours
identified

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Instance

For $2 \times (-)^A: \text{Set}$

Automata
minimization

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Markov chain
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...

1. Assume
everything
equivalent

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everything
equivalent



2. Have a
quotient
of X

1. Assume everything equivalent

2. Have a quotient of X

3. Unravel $\xi: X \rightarrow FX$ by one step

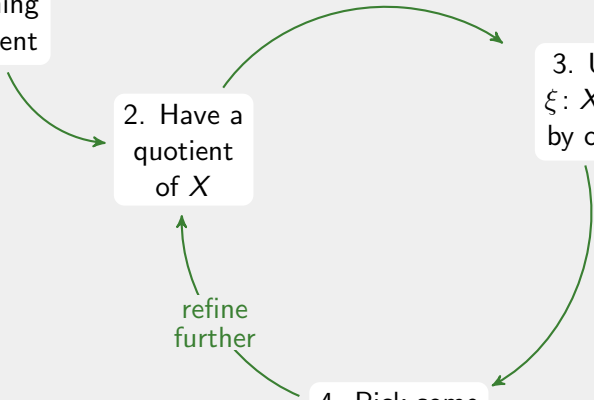
1. Assume everything equivalent

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4. Pick some of the new information

refine further



1. Assume everything equivalent

C
 \Downarrow
1

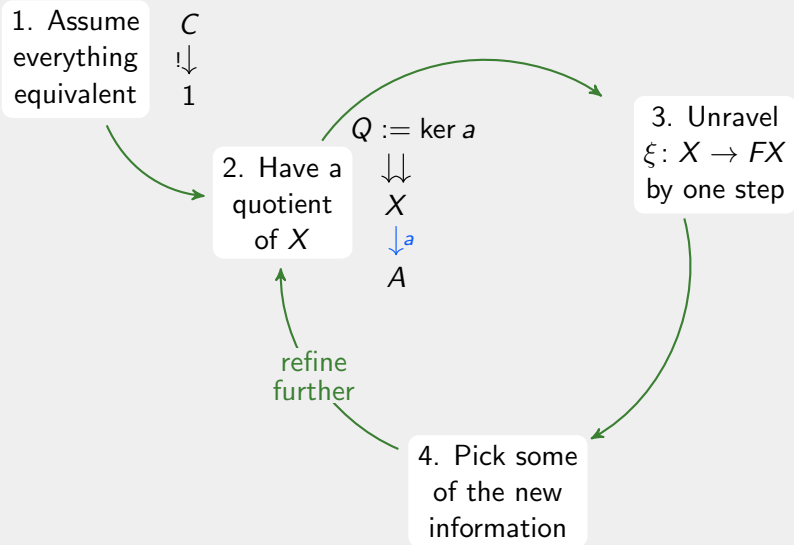
2. Have a quotient of X

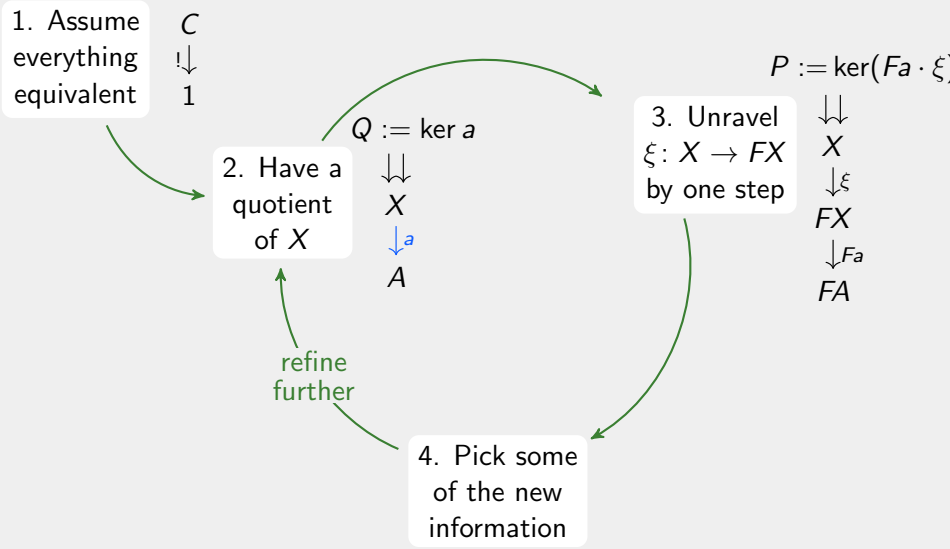
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```
graph TD; 1[1. Assume everything equivalent] --> 2[2. Have a quotient of X]; 2 --> 3[3. Unravel xi: X -> FX by one step]; 3 --> 4[4. Pick some of the new information]; 4 -- refine further --> 2;
```





1. Assume everything equivalent

$$C \twoheadrightarrow 1$$

2. Have a quotient of X

$$Q := \ker a$$

$$X \twoheadrightarrow A$$

3. Unravel $\xi: X \rightarrow FX$ by one step

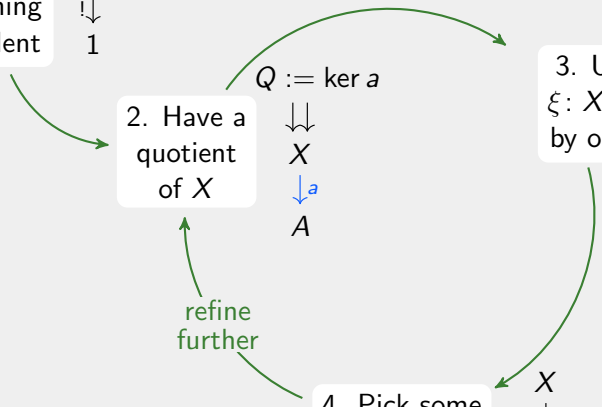
$$P := \ker(Fa \cdot \xi)$$

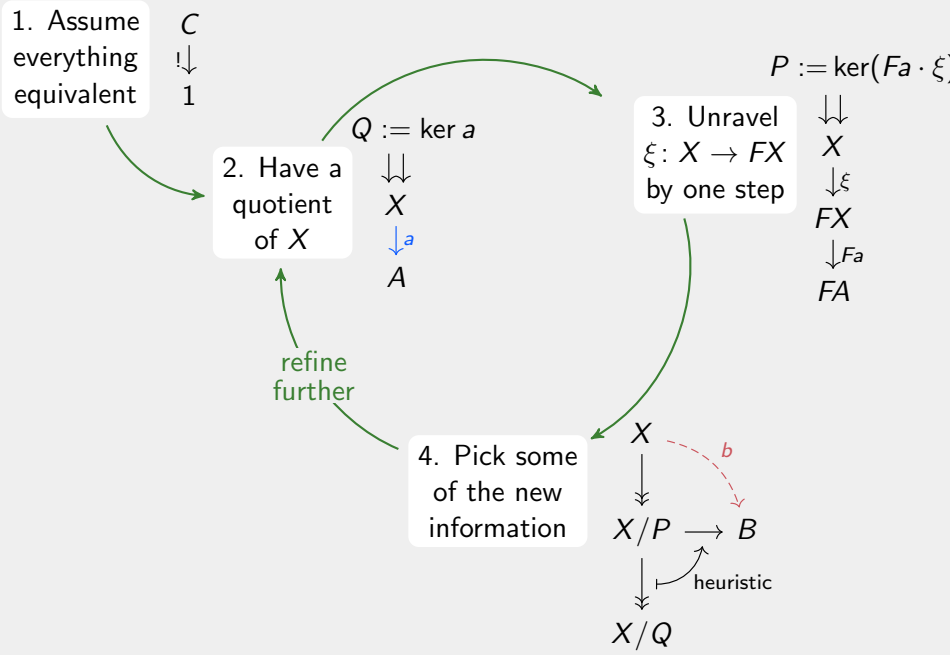
$$X \twoheadrightarrow FX \xrightarrow{Fa} FA$$

refine further

4. Pick some of the new information

$$X \twoheadrightarrow X/P \twoheadrightarrow X/Q$$





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3. Unravel $\xi: X \rightarrow FX$ by one step

$$P := \ker(Fa \cdot \xi)$$

$$X \twoheadrightarrow FX \xrightarrow{Fa} FA$$

$$X \xrightarrow{a' = \langle a, b \rangle} A \times B$$

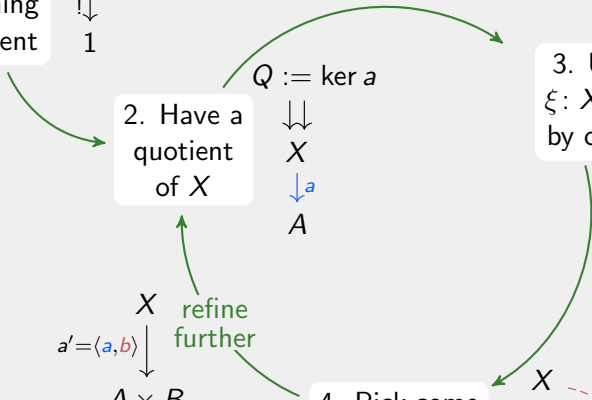
refine further

4. Pick some of the new information

$$X \twoheadrightarrow X/P \xrightarrow{\quad} B$$

heuristic

$$X/P \twoheadrightarrow X/Q$$



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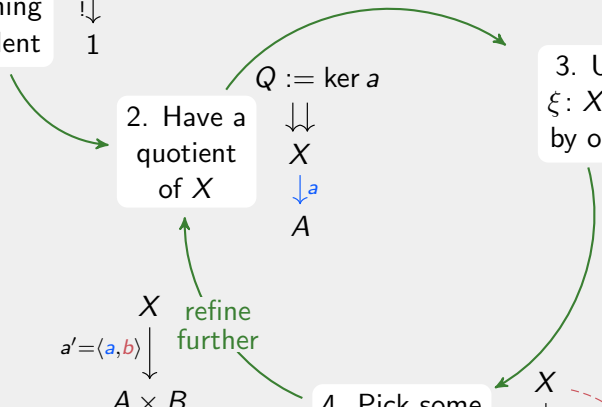
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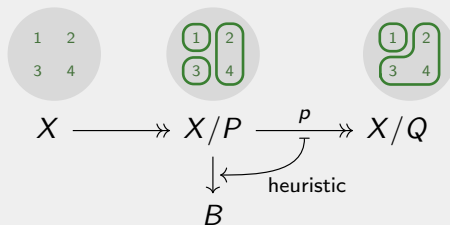
$$X \twoheadrightarrow X/P \xrightarrow{\text{heuristic}} X/Q \rightarrow B$$

id on X/P : use all new information

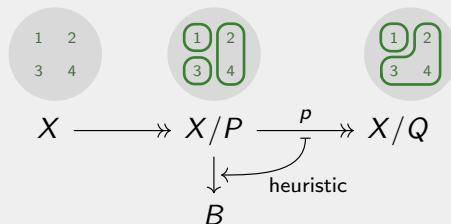
use 'smaller half'



Heuristic



Heuristic

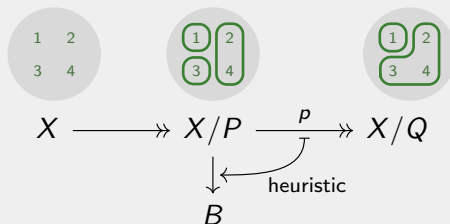


Use all new information

$B = X/P \rightsquigarrow$ Final Chain algorithm

(König, Küpper 2014)

Heuristic



Use all new information

$B = X/P \rightsquigarrow$ Final Chain algorithm

(König, Küpper 2014)

Process the 'smaller half'

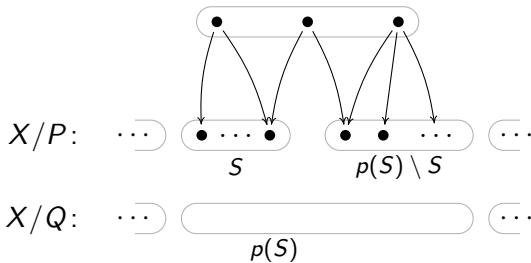
Surrounding block in X/Q

Let $S \in X/P$, such that $2 \cdot |S| \leq |p(S)|$

$B = \{ \overset{\{3\}}{\text{ChosenBlock}}, \overset{\{2, 4\}}{\text{SameSurroundingBlock}}, \overset{\{1\}}{\text{RemainingBlocks}} \}$

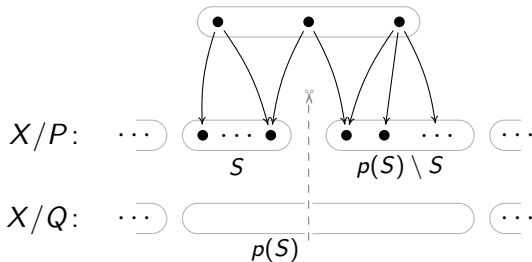
Three-way Splitting

$$X \longrightarrow \twoheadrightarrow X/P \xrightarrow{p} \twoheadrightarrow X/Q$$



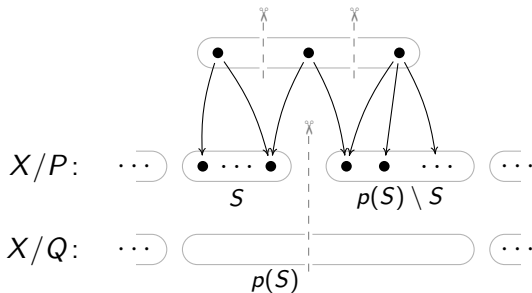
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$$X \longrightarrow \twoheadrightarrow X/P \xrightarrow{P} \twoheadrightarrow X/Q$$



Assume

- Finitely complete category \mathcal{C}
- (RegularEpi, Mono)-factorisations
- F mono-preserving

Theorem (Correctness)

$$\begin{array}{ccc} X & \xrightarrow{\xi} & FX \\ \downarrow & & \downarrow \\ X/P_i & \longrightarrow & F(X/Q_i) \end{array}$$

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- Finitely complete category \mathcal{C}
- (RegularEpi, Mono)-factorisations
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Theorem (Correctness)

$$\begin{array}{ccc} X & \xrightarrow{\xi} & FX \\ \downarrow & & \downarrow \\ X/P_i & \longrightarrow & F(X/Q_i) \end{array}$$

If $P_i \cong Q_i$, then this

1. is a coalgebra
2. has no proper quotient

Efficiency: Incremental Partitions

Incremental partitions

$Q := \ker a$

\Downarrow

X

\downarrow^a

A

Efficiency: Incremental Partitions

Incremental partitions

$$\begin{array}{ccc}
 Q := \ker a & & Q \cap \ker b \\
 \Downarrow & & \Downarrow \\
 X & \longrightarrow & X \\
 \downarrow a & & \downarrow a' = \langle a, b \rangle \\
 A & & A \times B
 \end{array}$$

Efficiency: Incremental Partitions

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 \end{array}$$

$$P := \ker(c \cdot Fa)$$

$$\begin{array}{c}
 \Downarrow \\
 X \\
 \downarrow \xi \\
 FX \\
 \downarrow Fa \\
 FA
 \end{array}$$

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 \Downarrow
 X
 $\downarrow \xi$
 FX
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 FA
 \longrightarrow
 $?? \cap ??$
 \Downarrow
 X
 $\downarrow \xi$
 FX
 $\downarrow F\langle a, b \rangle$
 $F(A \times B)$

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Incremental partitions

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$$\Downarrow$$

$$X$$

$$\downarrow \xi$$

$$FX$$

$$\downarrow Fa$$

$$FA$$


$$?? \cap ??$$

$$\Downarrow$$

$$X$$

$$\downarrow \xi$$

$$FX$$

$$\downarrow F\langle a, b \rangle$$

$$F(A \times B)$$

Question: When is $\ker F\langle a, b \rangle = \ker \langle Fa, Fb \rangle$?

Efficiency: Incremental Partitions

Incremental partitions

$$\begin{array}{ccc}
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$$FA$$


$$?? \cap ??$$

$$\Downarrow$$

$$X$$

$$\downarrow \xi$$

$$FX$$

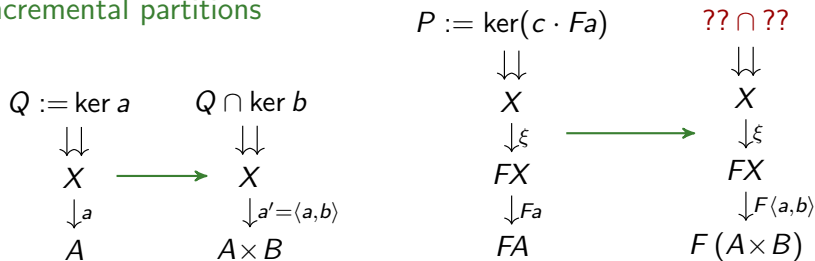
$$\downarrow F\langle a, b \rangle$$

$$F(A \times B)$$

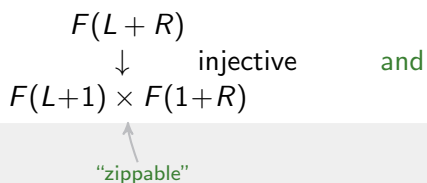
Theorem. In Set, $\ker F\langle a, b \rangle = \ker \langle Fa, Fb \rangle$ if

Efficiency: Incremental Partitions

Incremental partitions



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Efficiency: Incremental Partitions

Incremental partitions

$$\begin{array}{ccc}
 Q := \ker a & & Q \cap \ker b \\
 \Downarrow & & \Downarrow \\
 X & \longrightarrow & X \\
 \downarrow a & & \downarrow a' = \langle a, b \rangle \\
 A & & A \times B
 \end{array}$$

$$P := \ker(c \cdot Fa)$$

 \Downarrow
 X
 $\downarrow \xi$
 FX
 $\downarrow Fa$
 FA
 \longrightarrow

$$?? \cap ??$$

 \Downarrow
 X
 $\downarrow \xi$
 FX
 $\downarrow F\langle a, b \rangle$
 $F(A \times B)$

Theorem. In Set, $\ker F\langle a, b \rangle = \ker \langle Fa, Fb \rangle$ if

$$\begin{array}{c}
 F(L+R) \\
 \downarrow \text{injective} \\
 F(L+1) \times F(1+R)
 \end{array}$$

and

$\ker a \cup \ker b$
an equivalence

“zippable”

Ingredient 1: Zippable Functors

Definition. Functor F is **zippable**, if

$$F(L + R) \xrightarrow{\text{unzip}} F(L + 1) \times F(1 + R) \text{ is monic.}$$

Examples.

- $\text{Id}: \mathcal{C} \rightarrow \mathcal{C}$ (if \mathcal{C} is extensive),
- constant functors,
- products,
- coproducts (for $\mathcal{C} = \text{Set}$),
- subfunctors,
- partially additive functors: $F(X + Y) \rightarrow FX \times FY$,
- $M^{(-)}$, $(-)^*$, \mathcal{P}_f on Set .

natural in X, Y



Examples for sets $L = \{a_1, a_2, a_3\}$, $R = \{b_1, b_2\}$, $1 = \{-\}$

$a_1 \ a_2 \ b_1 \ a_3 \ b_2$ $\xrightarrow{\text{unzip}}$
 $(a_1 \ a_2 \ - \ a_3 \ - ,$
 $\ - \ - \ b_1 \ - \ b_2)$
 $(-)^*$ is zippable

$\{a_1, a_2, b_1\}$ $\xrightarrow{\text{unzip}}$
 $(\{a_1, a_2, -\},$
 $\ \{-, b_1\})$
 \mathcal{P}_f is zippable

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$$\begin{array}{l} a_1 \ a_2 \ b_1 \ a_3 \ b_2 \xrightarrow{\text{unzip}} \\ (a_1 \ a_2 \ - \ a_3 \ -, \\ \ - \ - \ b_1 \ - \ b_2) \\ (-)^* \text{ is zippable} \end{array}$$

$$\begin{array}{l} \{a_1, a_2, b_1\} \xrightarrow{\text{unzip}} \\ (\{a_1, a_2, -\}, \\ \{-, b_1\}) \\ \mathcal{P}_f \text{ is zippable} \end{array}$$

$$\begin{array}{l} \{\{a_1, b_1\}, \{a_2, b_2\}\} \quad \{\{a_1, b_2\}, \{a_2, b_1\}\} \\ \text{unzip} \left[\begin{array}{l} \left(\left\{ \{a_1, -\}, \{a_2, -\} \right\}, \right. \\ \left. \left\{ \{-, b_1\}, \{-, b_2\} \right\} \right) \end{array} \right] \text{unzip} \\ \mathcal{P}_f \mathcal{P}_f \text{ is not zippable} \end{array}$$

~~Composition~~

~~Quotients~~

Ingredient 2: Well-behaved Heuristics

$\ker a \cup \ker b$ is an equivalence in Set

$$A \xleftarrow{a} X \xrightarrow{b} B$$

$\Leftrightarrow \ker a \cup \ker b$ transitive

$\Leftrightarrow \forall x \in C : [x]_a \subseteq [x]_b \text{ or } [x]_a \supseteq [x]_b$

Example



Non-Example



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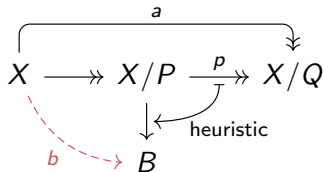
Example



Non-Example



Heuristics **respecting compound blocks**:



s.th. $\ker a \cup \ker b$ equivalence

E.g. **use all new information** and **process the smaller half**

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 X & & X \\
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 & & \text{an equivalence}
 \end{array}$$

“zippable”

Efficiency: Incremental Partitions

Concrete
Algorithm?

Incremental partitions

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“zippable”

Setting for complexity analysis

Category:

Set

Heuristic:
process the
smaller half

Functor:
zippable &
**refinement
interface**

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Definition.

Functor encoding: set L of edge labels plus family of functions

$$b_X: FX \rightarrow \mathcal{B}_f(L \times X) \quad (\text{not natural})$$

Encoding of coalgebra: $X \xrightarrow{\xi} FX \xrightarrow{\langle F!, b_X \rangle} F1 \times \mathcal{B}_f(L \times X)$ has

$$n = |X| \text{ states and } m = \sum_{x \in X} |b_X(\xi(x))| \text{ edges.}$$

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E.g.

$$L = 1, b_X: \mathcal{P}_f X \rightarrow \mathcal{B}_f(1 \times X)$$

$$L = \mathbb{N}, b_X: F_\Sigma X \rightarrow \mathcal{B}_f(\mathbb{N} \times X)$$

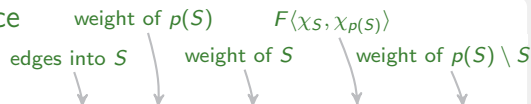
$$b_X(\sigma(\vec{x}_i)) = \{(1, x_1), \dots, (n, x_n)\}$$

Definition. Refinement Interface

Set W (of weights) plus

$$\text{init: } F1 \times \mathcal{B}_f(L) \rightarrow W, \quad \text{update: } \mathcal{B}_f L \times W \longrightarrow W \times F(2 \times 2) \times W$$

s.th. some axioms are satisfied.



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$$\text{init}: F1 \times \mathcal{B}_f(L) \rightarrow W, \quad \text{update}: \mathcal{B}_f L \times W \rightarrow W \times F(2 \times 2) \times W$$

s.th. there exists a **weight function** $w: \mathcal{P}_f X \rightarrow (FX \rightarrow W)$ satisfying

$$\begin{array}{ccc}
 F1 \times \mathcal{B}_f L & \xrightarrow{\text{init}} & W \\
 \uparrow \langle F!, \text{fil}_X \cdot b_X \rangle & \nearrow w(X) & \\
 FX & & \\
 \\
 \mathcal{B}_f L \times W & \xrightarrow{\text{update}} & W \times F(2 \times 2) \times W \\
 \uparrow \langle \text{fil}_S \cdot b_X, w(T) \rangle & \nearrow \langle w(S), F\langle \chi_S, \chi_T \rangle, w(T \setminus S) \rangle & \\
 FX & &
 \end{array}$$

$p(S)$
 \downarrow
 for all $S \subseteq T \subseteq X$

where $\text{fil}_S: \mathcal{B}_f(A \times X) \rightarrow \mathcal{B}_f(A)$, $\text{fil}_S(f)(a) = \sum_{y \in S} f(a, y)$

Examples

- For $F = \mathcal{P}_f$: $L = 1$, $W = 2 \times \mathbb{N}$,

$$w: \mathcal{P}_f X \rightarrow (\mathcal{P}_f X \rightarrow 2 \times \mathbb{N}) \quad w(T)(t) = (|t \setminus T| \stackrel{?}{>} 0, |t \cap T|)$$

$$\text{init}: \mathcal{P}_f 1 \times \mathbb{N} \rightarrow 2 \times \mathbb{N} \quad \text{init}(z, n) = (0, n)$$

$$\text{update}: \mathbb{N} \times (2 \times \mathbb{N}) \rightarrow (2 \times \mathbb{N}) \times \mathcal{P}_f 3 \times (2 \times \mathbb{N})$$

$$\begin{aligned} \text{update}(n_S, (r, n_{T \setminus S})) = & ((r \vee (n_{T \setminus S} \stackrel{?}{>} 0), n_S), \\ & (r, n_{T \setminus S} \stackrel{?}{>} 0, n_S \stackrel{?}{>} 0), \\ & (r \vee (n_S \stackrel{?}{>} 0), n_{T \setminus S})), \end{aligned}$$

Examples

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- | Functor: | $G^{(-)}$ | \mathcal{B}_f | \mathcal{D} | F_Σ |
|----------------------------|--------------|------------------------|------------------------|-------------------|
| Labels L : | G | \mathbb{N} | $[0, 1]$ | \mathbb{N} |
| Weights W : | $G^{(2)}$ | $\mathcal{B}_f 2$ | $\mathcal{D} 2$ | $F_\Sigma 2$ |
| $w(T)$, $T \subseteq X$: | $G_{\chi T}$ | $\mathcal{B}_f \chi T$ | $\mathcal{D}_{\chi T}$ | $F_\Sigma \chi T$ |

INITIALIZATION

```

for  $e \in E$ ,  $e = x \xrightarrow{a} y$  do
  add  $e$  to  $\text{toSub}[x]$  and  $\text{pred}[y]$ 
for  $x \in X$  do
   $p_X :=$  new cell in  $\text{deref}$  containing  $\text{init}(\text{type}[x], \mathcal{B}_f(\pi_2 \cdot \text{graph})(\text{toSub}[x]))$ 
  for  $e \in \text{toSub}[x]$  do  $\text{lastW}[e] = p_X$ 
   $\text{toSub}[x] := \emptyset$ 
 $X/P :=$  group  $X$  by type:  $X \rightarrow H1$ ;  $X/Q := \{X\}$ .

```

$$= p(S) \in X/Q$$

SPLIT($X/P, S \subseteq T \subseteq X$)

```

 $M := \emptyset \subseteq X/P \times H3$ 
for  $y \in S$ ,  $e \in \text{pred}[y]$  do
   $x \xrightarrow{a} y := e$ 
   $B :=$  block with  $x \in B \in X/P$ 
  if  $\text{mark}_B$  is empty then
     $w_T^x := \text{deref} \cdot \text{lastW}[e]$ 
     $v_\emptyset := \pi_2 \cdot \text{update}(\emptyset, w_T^x)$ 
    add  $(B, v_\emptyset)$  to  $M$ 
  if  $\text{toSub}[x] = \emptyset$  then
    add  $(x, \text{lastW}[e])$  to  $\text{mark}_B$ 
  add  $e$  to  $\text{toSub}[x]$ 

```

```

for  $(B, v_\emptyset) \in M$  do
   $B_{\neq \emptyset} := \emptyset \subseteq X \times H3$ 
  for  $(x, p_T)$  in  $\text{mark}_B$  do
     $\ell := \mathcal{B}_f(\pi_2 \cdot \text{graph})(\text{toSub}[x])$ 
     $(w_S^x, v^x, w_{T \setminus S}^x) := \text{update}(\ell, \text{deref}[p_T])$ 
     $\text{deref}[p_T] := w_{T \setminus S}^x$ 
     $p_S :=$  new cell containing  $w_S^x$ 
    for  $e \in \text{toSub}[x]$  do  $\text{lastW}[e] := p_S$ 
     $\text{toSub}[x] := \emptyset$ 
    if  $v^x \neq v_\emptyset$  then
      remove  $x$  from  $B$ 
      insert  $(x, v^x)$  into  $B_{\neq \emptyset}$ 
   $\text{mark}_B := \emptyset$ 
   $B_1 \times \{v_1\}, \dots, B_\ell \times \{v_\ell\} :=$ 
  group  $B_{\neq \emptyset}$  by  $\pi_2: X \times H3 \rightarrow H3$ 
  insert  $B_1, \dots, B_\ell :=$  into  $X/P$ 

```

(a) Collecting predecessor blocks

(b) Splitting predecessor blocks

Assumptions.

$\ell \in \mathcal{B}_f(L)$ states edges

- Refinement interface running in time $\mathcal{O}(|\ell| \cdot c(n, m))$
{ type W, type L, init(), update() }

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$\ell \in \mathcal{B}_f(L)$ states edges

- Refinement interface running in time $\mathcal{O}(|\ell| \cdot c(n, m))$
 { type W, type L, init(), update() }
- coalgebra structure as edges with labels

$$C \xrightarrow{c} FC \xrightarrow{bc} \mathcal{B}_f(L \times C)$$

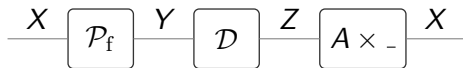
\Rightarrow compute “smaller half” intersections in “linear” time

Theorem

- Pseudocode **correctly** computes the simple quotient.
- Overall **complexity**: $\mathcal{O}((m + n) \cdot \log n \cdot c(n, m))$

Modularity (and how to deal with non-zippable functors)

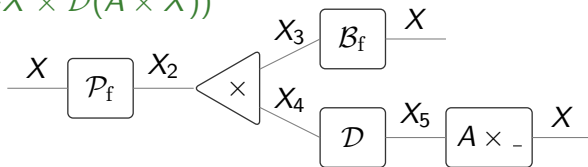
$$FX = \mathcal{P}_f(\mathcal{D}(A \times X))$$



$$H: \text{Set}^3 \rightarrow \text{Set}^3$$

$$H(X, Y, Z) = (\mathcal{P}_f Y, \mathcal{D}Z, A \times X)$$

$$FX = \mathcal{P}_f(\mathcal{B}_f X \times \mathcal{D}(A \times X))$$



$$H: \text{Set}^5 \rightarrow \text{Set}^5$$

$$H(X, X_2, X_3, X_4, X_5) = (\mathcal{P}_f X_2, X_3 \times X_4, \mathcal{B}_f X, \mathcal{D}X_5, A \times X)$$

$$FX = \mathcal{P}_f(\mathcal{D}(A \times X)) \quad \rightsquigarrow \quad H(X, Y, Z) = (\mathcal{P}_f Y, \mathcal{D}Z, A \times X)$$

$$X \rightarrow FX \text{ in Set} \quad \rightsquigarrow \quad (X, Y, Z) \rightarrow (\mathcal{P}_f Y, \mathcal{D}Z, A \times X) \text{ in Set}^3$$

Summing up, one gets back to Set:

$$X + Y + Z \rightarrow \mathcal{P}_f Y + \mathcal{D}Z + A \times X \xrightarrow{\text{can}} (\mathcal{P}_f + \mathcal{D} + A \times _)(X + Y + Z)$$

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The simple quotient of the ‘summed up’ coalgebra yields the simple quotient of the given coalgebra (X, ξ) .

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Remark.

For zippable functors F_1, \dots, F_n with their refinement interfaces one can easily construct a refinement interface for $\coprod F_i$.

The Tool CoPaR

Wißmann, Deifel, Milius, Schröder
 FM 2019, Form. Asp. Comput. 2021

Generic and flexible implementation of the algorithm

- Implemented basic refinement interfaces: Σ , \mathcal{P}_f , \mathcal{B}_f , \mathcal{D} , $M^{(-)}$,
 for $M = \mathbb{N} \mid \mathbb{Z} \mid \mathbb{Q} \mid \mathbb{R} \mid (\mathbb{Z}, \max) \mid (\mathbb{R}, \max)$ ↑
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monoid
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- Interfaces for composed functors are automatically derived,
e.g. for $\mathcal{P}_f(A \times \mathcal{D}(-))$; in general according to the grammar

$$\begin{array}{l}
 \text{functor variable} \\
 \downarrow \\
 F ::= X \mid \mathcal{P}_f F \mid \mathcal{B}_f F \mid \mathcal{D} F \mid M^{(F)} \mid \overbrace{C \mid F + F \mid F \times F \mid F^A}^{\text{polynomial constructs}} \\
 C ::= \mathbb{N} \mid A \quad A ::= \{s_1, \dots, s_n\}
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 \end{array}$$

- Users can easily implement new refinement interfaces.
- Available at <https://gitlab.cs.fau.de/i8/copar>

The Tool CoPaR

Refinement Interface Type

Math:

$$\text{init}: F1 \times \mathcal{B}_f A \rightarrow W$$
$$\text{update}: \mathcal{B}_f A \times W \rightarrow W \times F3 \times W$$

Haskell:

```
class (Ord (F1 f), Ord (F3 f))  $\Rightarrow$  RefinementInterface f where  
  init  :: F1 f  $\rightarrow$  [Label f]  $\rightarrow$  Weight f  
  update :: [Label f]  $\rightarrow$  Weight f  $\rightarrow$  (Weight f, F3 f, Weight f)
```

The Tool CoPaR

Example: Refinement Interface Implementation for $G^{(-)}$

Math:

$$\text{init}(f_1, e) = (0, \sum e)$$

$$\text{update}(e, (r, c)) = ((r + c - \sum e, \sum e), (r, c - \sum e, \sum e), (\sum e + r, c - \sum e))$$

Haskell:

```
instance RefinementInterface R where
  init f1 e = (0, sum e)
  update e (r,c) = ((r + c - sum e, sum e),
                  (r, c - sum e, sum e),
                  (sum e + r, c - sum e))
```

The Tool CoPaR

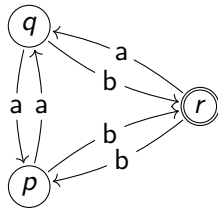
Example: Input coalgebra for $\{f, n\} \times \mathcal{P}_f(\{a, b\} \times X)$

$\{f, n\} \times \mathcal{P}(\{a, b\} \times X)$

$p: (n, \{(a, p), (b, r)\})$

$q: (n, \{(a, q), (b, r)\})$

$r: (f, \{(a, q), (b, p)\})$



The Tool CoPaR

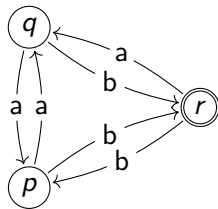
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$r: (f, \{(a, q), (b, p)\})$



Output

Block 0: r

Block 2: q,p

Processing Times (in seconds) for weighted tree automata

n = maximal states (+ $50 \cdot n$ transitions) fitting 16 GB of RAM

$\rightsquigarrow m = 11\text{--}17$ million

t_p = parsing

t_a = partition refinement

$\Sigma X =$	$4 \times X$			$4 \times X^2$			$4 \times X^3$			$4 \times X^4$			$4 \times X^5$		
	n	t_p	t_a	n	t_p	t_a	n	t_p	t_a	n	t_p	t_a	n	t_p	t_a
2	132177	53	188	98670	46	243	85016	47	187	59596	41	146	49375	38	114
\mathbb{N}	113957	61	141	92434	55	175	69623	49	152	57319	47	140	48962	45	112
2^{64}	114888	58	100	95287	54	138	70660	49	107	62665	48	92	49926	44	72

PRISM Benchmarks

PRISM Model	Input		Time (s) to			Time (s) of	
	States	Edges	Parse	Init	Refine	Valmari	mCRL2
fms (n=4)	35910	237120	0.48	0.12	0.16	0.21	–
fms (n=5)	152712	1111482	2.46	0.68	1.10	1.21	–
fms (n=6)	537768	4205670	9.94	2.91	5.56	5.84	–
wlan2_collide (COL=2,TRANS_TIME_MAX=10)	65718	94452	0.51	0.29	0.59	0.14	0.42
wlan0_time_bounded (TRANS_TIME_MAX=10,DEADLINE=100)	582327	771088	5.26	3.07	5.52	0.92	3.18
wlan1_time_bounded (TRANS_TIME_MAX=10,DEADLINE=100)	1408676	1963522	13.42	6.17	16.13	2.52	8.58

System	Functor FX	Run-Time ($m \geq n$)		Specific algorithm
Transition Systems	$\mathcal{P}_f X$	$m \cdot \log n$	$=$	$m \cdot \log n$ Paige, Tarjan 1987
LTS	$\mathcal{P}_f(\mathbb{N} \times X)$	$m \cdot \log m$	$=$	$m \cdot \log m$ Dovier, Piazza, Policriti 2004
			$>$	$m \cdot \log n$ Valmari 2009
Markov Chains	$\mathbb{R}^{(X)}$	$m \cdot \log n$	$=$	$m \cdot \log n$ Valmari, Franceschinis 2010
DFA	$2 \times X^A$ (A fixed)	$n \cdot \log n$	$=$	$n \cdot \log n$ Hopcroft 1971
	$2 \times \mathcal{P}_f(A \times X)$	$\frac{ A \cdot n \cdot \log(n + A)}{\log(n + A)}$	\approx	$ A \cdot n \cdot \log n$ Gries 1973/Knuutila 2001
Segala Systems	$\mathcal{P}_f(A \times DX)$	$m_{\mathcal{D}} \cdot \log m_{\mathcal{P}_f}$	$<$	$m \cdot \log n$ Baier, Engelen, Majster-Cederbaum 2000
			$=$	$m_{\mathcal{D}} \cdot \log m_{\mathcal{P}_f}$ Groote, Verduzco, de Vink 2018
Color Refinement	\mathcal{B}_f	$m \cdot \log n$	$=$	$m \cdot \log n$ Berkholz, Bonsma, Grohe 2017
Weighted Tree Automata	$M \times M^{(\Sigma X)}$ M non-cancellative	$m \cdot \log^2 m$	\ll	$m \cdot n$ Högberg, Maletti, May 2007
	$M \times M^{(\Sigma X)}$ M cancellative	$m \cdot \log m$	$=$ poly. bound	$m \cdot \log n$ Högberg, Maletti, May 2007

System	Functor FX	Run-Time ($m \geq n$)	Specific algorithm
Transition Systems	$\mathcal{P}_f X$	$m \cdot \log n = m \cdot \log n$	Paige, Tarjan 1987
LTS	$\mathcal{P}_f(\mathbb{N} \times X)$	$m \cdot \log m = m \cdot \log m$ $> m \cdot \log n$	Dovier, Piazza, Policriti 2004 Valmari 2009
Markov Chains	\mathbb{R}^X	$m \cdot \log n = m \cdot \log n$	Valmari, Franceschinis 2010
DFA	$2 \times X^A$ (A fixed)	$n \cdot \log n = n \cdot \log n$	McMillan, Sipcroft 1971
	$2 \times \mathcal{P}_f(A \times X)$	$\frac{ A \cdot n \cdot \log(n + A)}{\log(n + A)} \approx A \cdot n \cdot \log n$	Gries 1973/Knuutila 2001
Segala Systems	$\mathcal{P}_f(A \times DX)$	$D \cdot \log m \cdot \log n < m \cdot \log n$	Baier, Engelen, Majster-Cederbaum 2000
		$m_{\mathcal{D}} \cdot \log m_{\mathcal{P}_f}$	Groote, Verduzco, de Vink 2018
Color Refinement	\mathcal{B}_f	$m \cdot \log n = m \cdot \log n$	Berkholz, Bonsma, Grohe 2017
Weighted Tree Automata	$M \times M^{(\Sigma X)}$ M non-cancellative	$m \cdot \log^2 m \ll m \cdot n$	Högberg, Maletti, May 2007
	$M \times M^{(\Sigma X)}$ M cancellative	$m \cdot \log m = m \cdot \log n$ poly. bound	Högberg, Maletti, May 2007

Generic & Efficient

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Transition Systems	$\mathcal{P}_f X$	$m \cdot \log n = m \cdot \log n$	Paige, Tarjan 1987
LTS	$\mathcal{P}_f(\mathbb{N} \times X)$	$m \cdot \log n = m \cdot \log m$	Dovier, Piazza, Policriti 2004
		$m \cdot \log n = m \cdot \log n$	Valmari 2009
Markov Chains	$\mathbb{R}(X)$	$m \cdot \log n$	Valmari, Franceschinis 2010
DFA	$2 \times X^A$ (A fixed)	$n \cdot \log n = n \cdot \log n$	McMillan, Sipcroft 1971
	$2 \times \mathcal{P}_f(A \times X)$	$\frac{ A \cdot n \cdot \log(n + A)}{\log(n + A)} \approx A \cdot n \cdot \log n$	Gries 1973/Knuutila 2001
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Color Refinement	\mathcal{B}_f	$m \cdot \log n = m \cdot \log n$	Berkholz, Bonsma, Grohe 2017
Weighted Tree Automata	$M \times M(\Sigma X)$ M non-cancellative	$m \cdot \log^2 m \ll m \cdot n$	Högberg, Maletti, May 2007
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More instances:
further system types
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Generic & Efficient

System	Functor FX	Run-Time ($m \geq n$)	Specific algorithm
Transition Systems	$\mathcal{P}_f X$	$m \cdot \log n = m \cdot \log n$	Paige, Tarjan 1987
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Markov Chains	$\mathbb{R}(X)$	$m \cdot \log n = m \cdot \log n$	Valmari, Franceschinis 2010
DFA		$n \cdot \log n = n \cdot \log n$	McMillan, Sipcroft 1971
		$ A \cdot n \cdot \log(n + A) \approx A \cdot n \cdot \log n$	Gries 1973/Knuutila 2001
Segala Systems	$\mathcal{P}_{f, \text{fin}}(DX)$	$D \cdot \log m = D \cdot \log n$	Baier, Engelen, Majster-Cederbaum 2000
		$m_D \cdot \log m_{\mathcal{P}_f} = m_D \cdot \log m_{\mathcal{P}_f}$	Groote, Verduzco, de Vink 2018
Color Refinement	\mathcal{B}_f	$m \cdot \log n = m \cdot \log n$	Berkholz, Bonsma, Grohe 2017
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Markov Chains	$\mathbb{R}(X)$	$m \cdot \log n$	Valmari, Franceschinis 2010
DFA		$n \cdot \log n = n \cdot \log n$ $ A \cdot n \cdot \log(n + A) \approx A \cdot n \cdot \log n$	McMillan 1971 Gries 1973/Knuutila 2001
Segala Systems	$\mathcal{P}_{f, \text{fin}}(DX)$	$D \cdot \log m$	Baier, Engelen, Majster-Cederbaum 2000
Color Refinement	\mathcal{B}_f	$m \cdot \log n$	Alami, Verduzco, de Vink 2018
Weighted Tree Automata	$M \times M^{(\Sigma X)}$ M non-cancellative $M \times M^{(\Sigma X)}$ M cancellative	$m \cdot \log^2 m \ll m \cdot \log m$ $m \cdot \log m = m \cdot \log n$ poly. bound	Högberg, Maletti, May 2007 Högberg, Maletti, May 2007

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Generic & Efficient

Other types of
system equivalences

System	Functor FX	Run-Time ($m \geq n$)	Specific algorithm
Transition Systems	$\mathcal{P}_f X$	$m \cdot \log n = m \cdot \log n$	Paige, Tarjan 1987
LTS	$\mathcal{P}_f(\mathbb{N} \times X)$	$m \cdot \log m = m \cdot \log m$	Dovier, Piazza, Policriti 2004
Markov Chains	$\mathbb{R}(X)$	$m \cdot \log n$	Valmari, Franceschinis 2010
DFA		$n \cdot \log n = n \cdot \log n$ $ A \cdot n \cdot \log(n + A) \approx A \cdot n \cdot \log n$	McMillan 1971 Gries 1973/Knuutila 2001
Segala Systems	$\mathcal{P}_{fin}(DX)$	$D \cdot \log m$	Baier, Engelen, Majster-Cederbaum 2000
Color Refinement		$m \cdot \log n$	Alami, Verduzco, de Vink 2018
Symbolic states & parallelization		$m \cdot \log^2 m \ll m \cdot \log m$	Alami, Grohe 2017
Automata		$m \cdot \log m = m \cdot \log n$ poly. bound	Högberg, Maletti, May 2007

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Generic & Efficient

Other types of
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System	Functor FX	Run-Time ($m \geq n$)	Specific algorithm
Transition Systems	$\mathcal{P}_f X$	$m \cdot \log n$ =	$m \cdot \log n$ Paige, Tarjan 1987
LTS	$\mathcal{P}_f(\mathbb{N} \times X)$	$m \cdot \log m$ =	$m \cdot \log m$ Dovier, Piazza, Policriti 2004
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Color Refinement	\mathcal{B}_f	$m \cdot \log n$ =	$m \cdot \log n$ Berkholz, Bonsma, Grohe 2017
Weighted Tree Automata	$M \times M^{(\Sigma X)}$ M non-cancellative	$m \cdot \log^2 m$ \ll	$m \cdot n$ Högberg, Maletti, May 2007
	$M \times M^{(\Sigma X)}$ M cancellative	$m \cdot \log m$ = poly. bound	$m \cdot \log n$ Högberg, Maletti, May 2007

Further Work

← Deifel, Milius, Wißmann (FSCD 2021)

1. **Minimization:** given an (encoded) **pointed** coalgebra $1 \rightarrow C \rightarrow FC$, compute the minimized coalgebra:
 - (a) compute the partition of the state set C as above
 - (b) compute the coalgebra structure of the simple quotient $C' \rightarrow FC'$
 - (c) compute the reachable part $1 \rightarrow C'' \rightarrow FC''$ of the simple quotient

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- ↪ new steps (b) and (c) require non-trivial extension of the theory;
 minimization interface merge: $\mathcal{B}_f L \rightarrow \mathcal{B}_f L$

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Birkmann, Deifel,
Milius (TACAS 2022)

2. **Distributed Algorithm** and Implementation:

- memory consumption is the bottleneck in benchmarks
- new distributed **coalgebraic signature refinement** algorithm
(based on Blom and Orzan's signature refinement for LTSs)
- benchmarking on high performance cluster

Further Work

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Deifel, Gebhart (2023)

3. **Symbolic representation** of states:

- represent the state space by **BDDs**
- implement a **sequential version** of **coalgebraic signature refinement** operating on BDDs

Appendix ...

Genericity: Initial partition

Given

$$C \xrightarrow{c} FC$$

Usual partition refinement algorithms

Return coarsest partition compatible with c , refining $C \xrightarrow{\kappa} \mathcal{I}$

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Coalgebraic partition refinement for $\mathcal{I} \times F$

For the coalgebra $C \xrightarrow{\langle \kappa, c \rangle} \mathcal{I} \times FC$

Genericity: Composition

If F finitary,

$$C \xrightarrow{c} FG(C)$$

Genericity: Composition

If F finitary,

$$C \xrightarrow{c} FG(C) \quad \rightsquigarrow \quad D \xrightarrow{d} GC$$

↑
finite subset
s.th. ...

Genericity: Composition

If F finitary,

$$\begin{array}{ccc}
 C & \xrightarrow{c} & FG(C) \\
 & \searrow^{c'} & \uparrow Fd \\
 & & FD
 \end{array}
 \quad \rightsquigarrow \quad
 \begin{array}{ccc}
 D & \xrightarrow{d} & GC \\
 \uparrow & & \\
 \text{finite subset} & & \\
 \text{s.th. ...} & &
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 \end{array}$$

A coalgebra $\text{Factor}(C, c)$ on Set^2 for the functor $(X, Y) \mapsto (FY, GX)$:

$$(C, D) \xrightarrow{(c', d)} (FD, GC)$$

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 \end{array}$$

A coalgebra $\text{Factor}(C, c)$ on Set^2 for the functor $(X, Y) \mapsto (FY, GX)$:

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Examples

$$\begin{array}{ll}
 \mathcal{P}_f \cdot (A \times (-)) & (2 \times \mathcal{P}_f) \cdot (A \times (-)) \\
 \mathcal{P}_f \cdot (A \times (-)) \cdot \mathcal{D} & \mathcal{P}_f \cdot \mathcal{D} \cdot (A \times (-)) \quad \dots
 \end{array}$$

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