# Knowledge Base Repair: From Active Integrity Constraints to Active TBoxes

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DL&NMR workshops, Rhodes & AoE

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## Outline

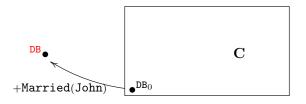
- Introduction
- 2 Active Integrity Constraints: revisiting the basics
- 3 Active Integrity Constraints: existing semantics
- 4 A Dynamic Logic account of AICs
- 5 Extending the dynamic logic account to ECA rules
- 6 From databases to description logic KBs

## Databases and integrity constraints

## Integrity constraints (IC): fundamental part of a database schema

- ullet ideally: DB  $\models \mathbf{C}$
- ullet in practice: DB  $\not\models {f C}$  often happens

$$\mathbf{C} = (\forall x)[\mathtt{Bachelor}(x) \land \mathtt{Married}(x) \rightarrow \bot]$$
 
$$\mathtt{DB}_0 = \{\mathtt{Bachelor}(\mathtt{John})\}$$
 
$$\Downarrow \ +\mathtt{Married}(\mathtt{John})$$
 
$$\mathtt{DB} = \{\mathtt{Bachelor}(\mathtt{John}), \mathtt{Married}(\mathtt{John})\}$$



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## Repairs

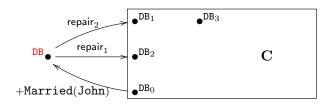
#### Two solutions

- make DB consistent again
  - repair ('data cleaning')
- 2 live with inconsistent DB
  - hypothetical repair: 'consistent query answering'
  - consistent answer holds in all possible repairs

```
\begin{split} \text{possible repairs of DB} &= \{ \texttt{Bachelor}(\texttt{John}), \texttt{Married}(\texttt{John}) \} : \\ &\quad \texttt{DB}_1 = \{ \texttt{Bachelor}(\texttt{John}) \} \\ &\quad \texttt{DB}_2 = \{ \texttt{Married}(\texttt{John}) \} \\ &\quad \texttt{DB}_3 = \{ \texttt{Bachelor}(\texttt{John}), \texttt{Bachelor}(\underbrace{Jim}) \} \end{split}
```

- all do the job:  $DB_i \models C$
- ... but there are too many
- ...and some are not intended

## Repairs: minimal change



## Minimal repair = a DB' closest to DB such that DB' $\models$ ${f C}$

- intuitively DB<sub>3</sub> = {Bachelor(John), Bachelor(Jim)}
   less close to DB than DB<sub>1</sub> and DB<sub>2</sub>
- which definition of closeness?
  - symmetric difference
  - cf. Possible Models Approach PMA [Winslett, AAAI 1988]
  - PMA repairs; bring about PMA updates

## Repairs: minimal change is not enough

- number of PMA repairs can still be huge
- typically some of them are unintended
- PMA repairs of DB = {Bachelor(John), Married(John)}:

```
	extstyle{DB}_1 = \{ 	extstyle{Bachelor(John)} \} 	extstyle{DB}_2 = \{ 	extstyle{Married(John)} \}
```

- both are set inclusion minimal
- DB<sub>1</sub> unintended
- can we do better by making C more informative?

## More informed integrity constraints

## Active Integrity Constraints (AIC) [Flesca et al., PPDP 2004]

active 
$$IC = static IC + update actions$$

```
\mathbf{Static}: (\forall x)[\mathtt{Bachelor}(x) \land \mathtt{Married}(x) \to \bot]
```

 $\textbf{Active}: (\forall x)[\texttt{Bachelor}(x) \land \texttt{Married}(x) \rightarrow \bot, \{-\texttt{Bachelor}(x)\}]$ 

#### Intuitions

- "an extension of integrity constraints that allows to specify for each constraint the actions to be performed to satisfy it" [Flesca et al., PPDP 2004]
- "an AIC encodes explicitly both an integrity constraint and preferred basic actions to repair it, if it is violated"
   [Caroprese&Truszczynski, TPLP 2011]

## Active Integrity Constraints: predecessors

### History

- active databases [Ceri&Widow, 1994]
  - More general ECA (event-condition-action) rules:
     "if event occurs and condition holds then do action"
  - procedural
  - repair may not terminate
- 2 database repair constraints [Greco et al., TKDE 2003]
  - subsumed [Caroprese et al., 2006]
- o revision programs [Marek&Truszczyński, TCS 1998]
  - logic programs
  - semantics differ, but are close [Caroprese&Truszczyński, TPLP 2011]

### Aims of talk

- Revisit intuitions and semantics
- Oynamic Logic analysis of AICs
  - similar in spirit: Kiringa's logical account of ECA rules in the Sitcalc [Kiringa, LICS 2001; Kiringa&Reiter 2003]
- Transfer to description logics
  - define active TBoxes
  - extend ALC by dynamic operators

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### Basic notations

- propositional logic
  - hypothesis: everything is grounded
  - propositional variables  $\mathbb{P} = \{p, q \dots\}$
- ullet databases are sets of propositional variables  $\mathtt{DB} \subseteq \mathbb{P}$
- static integrity constraints are sets of literals (clauses) C
- update actions are assignments  $\alpha = +p$  and  $\alpha = -p$ 
  - consistent set of update actions U: not  $(+p \in U \text{ and } -p \in U)$
- update of DB by U:

$$\mathtt{DB} \circ \mathtt{U} = \big(\mathtt{DB} \setminus \{p : -p \in \mathtt{U}\}\big) \cup \{p : +p \in \mathtt{U}\}$$

• if U is consistent: order of application irrelevant

## Active Integrity Constraints: syntax

$$r = \langle \mathbf{C}(r), \mathbf{R}(r) \rangle$$

- $\bullet$   $\mathbf{C}(r)$  is a clause (a set of literals)
- ${f R}(r)$  is a set of update actions making some literals of  ${f C}(r)$  true:

$$\mathbf{R}(r) \subseteq \{+p \,:\, p \in \mathbf{C}(r)\} \cup \{-p \,:\, \neg p \in \mathbf{C}(r)\}$$
 
$$\langle \neg \texttt{Bachelor} \lor \neg \texttt{Married}, \{-\texttt{Bachelor}\} \rangle$$

• database DB + finite sets of AICs  $\eta = \{r_1, \dots, r_n\}$ 

## Active Integrity Constraints: which semantics?

#### Various semantics

- repairs tout court, alias PMA repairs (v.s.)
- founded repairs [Caroprese et al., ICLP 2006]
- justified repairs [Caroprese&Truszczynski, TPLP 2011]
- well-founded repairs [Cruz Felipe et al., TASE 2013]
- dynamic repairs [Feuillade&Herzig, JELIA 2013]
- grounded repairs [Bogaerts&Cruz Felipe, AIJ 2018]

#### .. and each in several versions

- drop minimality requirement ⇒ weak versions
  - for PMA repairs: makes updates drastic
- minimise exceptions
  - preferred update actions are soft constraints, can be violated
  - ullet if static part of  $\eta$  consistent then repair exists

## Active Integrity Constraints: different intuitions

#### Permission vs. obligation

when  $\mathbf{C}(r)$  is violated:

- permission that the repair contains some  $\alpha \in \mathbf{R}(r)$  ... but  $\mathbf{C}(r)$  might as well be repaired by other AlCs "If  $\mathrm{DB} \not\models \mathbf{C}(r)$ , then  $\mathrm{DB}$  is inconsistent. It is <u>allowed</u> to repair this inconsistency by executing one or more of the  $\alpha_i \in \mathbf{R}(r)$ ." [Bogaerts&Cruz Felipe, AlJ 2018; notation adapted]
- obligation that the repair contains some  $\alpha \in \mathbf{R}(r)$  "If  $r \in \eta$  and, for every non-updatable literal in  $\ell \in \mathbf{C}(\eta)$  there is an update action  $-\ell \in \mathbf{U}$  then  $[\ldots]$  the result of the update  $\mathrm{DB} \circ \mathbf{U}$  satisfies all nonupdatable literals in  $\mathbf{C}(r)$ . To guarantee that  $\mathrm{DB} \circ \mathbf{U}$  satisfies r,  $\mathrm{DB} \circ \mathbf{U}$  must satisfy at least one literal in  $\mathbf{C}(r)$ . To this end  $\mathbf{U}$  must contain at least one update action from  $\mathbf{R}(r)$ ." [Caroprese&Truszczynski, TPLP 2011; notation adapted]

## Active Integrity Constraints: different intuitions, ctd.

#### Permission vs. obligation: consequences

when  $\mathbf{C}(r)$  is violated . . .

• 'permission' reading:

$$\langle p \vee q, \{+p, +q\} \rangle \text{ equivalent to } \begin{cases} \langle p \vee q, \{+p\} \rangle \\ \langle p \vee q, \{+q\} \rangle \end{cases}$$

 $\implies$  all  $\mathbf{R}(r)$  singletons (" $\eta$  normalised")

- obligation' reading:
  - $\bullet$   $\eta$  cannot be normalised
  - computation is a priori more local than 'permission' reading: ' if  ${f C}(r)$  violated then repair via  ${f R}(r)$  regardless of other AICs'

... but what does " $\mathbf{C}(r)$  is violated" mean? Just "DB  $\not\models \mathbf{C}(r)$ "?

## Active Integrity Constraints: sharpening intuitions by means of abstract examples (1)

#### Example: one violation, no interaction

$$\begin{aligned} \text{DB} = \emptyset \text{ and } \eta = \big\{ \langle p \vee q, \{+p, +q\} \rangle, \\ \langle q \vee \neg r, \{+q\} \rangle \big\} \end{aligned}$$

- repairs are  $U_1 = \{+p\}$  and  $U_2 = \{+q\}$
- if DB  $\not\models \mathbf{C}(r)$  and for all other r', DB  $\models \mathbf{C}(r')$  and  $\mathbf{C}(r')$  does not *interact* with  $\mathbf{C}(r)$ , (resolution rule doesn't apply) then the repairs are just the update actions in  $\mathbf{R}(r)$ :

$$U_i = \{\alpha_i\} \text{ for } \alpha_i \in \mathbf{R}(r)$$

## Active Integrity Constraints: sharpening intuitions by means of abstract examples (2)

#### Example: one violation, with interaction

$$\begin{aligned} \text{DB} = \emptyset \text{ and } \eta = \left\{ \langle p, \{+p\} \rangle, \\ \langle \neg p \lor q \lor r, \{+q\} \rangle \right\} \end{aligned}$$

- $\bullet \ \mbox{repair is U} = \{+p, +q\} \qquad \qquad (\mbox{and not: } \{+p, +r\}$
- $\neg p \lor q \lor r$  is not violated by DB, but after update by +p!
- hence  $DB \not\models \mathbf{C}(r)$  not enough a criterion
- in general: membership in U may have to be hypothesised
  - problem: circularity of support (v.i.)

up to now: no difference between permitted and obligatory reading

## Active Integrity Constraints: sharpening intuitions by means of abstract examples (3)

#### Example: two violations, no interaction

$$DB = \emptyset \text{ and } \eta = \{ \langle p \lor q, \{+p\} \rangle, \\ \langle p \lor q, \{+q\} \rangle \}$$

- different readings lead to different intuitions!
  - 'permission': repairs are  $U_1 = \{+p\}$  and  $U_2 = \{+q\}$
  - 'obligation': repair is  $U = \{+p, +q\}$ 
    - U is not minimal ⇒ not a PMA repair!
    - ullet active part of  $\eta$  badly designed?

## Active Integrity Constraints: sharpening intuitions by means of abstract examples (4)

#### Example: two violations, no interaction

$$DB = \emptyset \text{ and } \eta = \{ \langle p, \{+p\} \rangle, \\ \langle p \vee q, \{+q\} \rangle \}$$

- different readings lead to different intuitions!
  - 'permission': repair is  $U = \{+p\}$

 $(\{+p,+q\} \text{ not minimal})$ 

- ② 'obligation": repair is  $U' = \{+p, +q\}$ 
  - not a PMA repair!
  - active part of  $\eta$  badly designed?

## Active Integrity Constraints: sharpening intuitions by means of abstract examples (5)

#### Example: one violation, with interaction

$$\begin{split} \mathrm{DB} = \emptyset \text{ and } \eta &= \big\{ \langle p \vee q, \{+p\} \rangle, \\ \langle p \vee \neg q, \{+p\} \rangle, \\ \langle \neg p \vee q, \{+q\} \rangle \big\} \end{split}$$

- intuitions differ
  - "circularity of support" ⇒ should have no repair
     [Caroprese&Truszczynski, TPLP 2011]
  - we: repair should be  $U = \{+p, +q\}$  reason: extensionality principle applies to first two AICs
    - ullet static part equivalent to p
    - dynamic parts identical
    - $\Longrightarrow$  first two AICs equivalent to  $\langle p, \{+p\} \rangle$
    - ⇒ cf. previous example

## Active Integrity Constraints: summary of intuitions

- permission reading and obligation reading come with different intuitions
  - ullet obligations more local  $\Longrightarrow$  should lead to a simpler account
- Obligation reading often leads to non-minimal repairs
  - may indicate flawed choices of update actions for some AICs
- 3 a new principle: extensionality
  - more general identity criteria for sets of AICs?
  - other postulates? cf. belief revision&update literature

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## Well-founded Repairs [Bogaerts&Cruz Felipe, AIJ 2018]

#### Idea

- choose violated AIC  $r \in \eta$  (i.e.,  $\mathbf{C}(r)$  not satisfied)
- ullet update by one of the actions in the active part  ${f R}(r)$
- iterate until no more violation

#### Definition

PMA repair U for DB w.r.t.  $\eta$  is well-founded if

 $\mathtt{U} = \{\alpha_1, \dots, \alpha_n\}$  (for some ordering) such that

for every  $\alpha_i$  there is an AIC  $r_i \in \eta$  with

• DB  $\circ \{\alpha_1, \ldots, \alpha_{i-1}\} \not\models \mathbf{C}(r_i)$ 

 $(r_i \text{ is violated})$ 

•  $\alpha_i \in \mathbf{R}(r_i)$ 

compatible with permission reading and with obligation reading

## Founded Repairs [Caroprese et al., ICLP 2006]

#### Idea

- update actions  $\alpha \in \mathtt{U}$  should be supported by some active constraint r
  - ullet r would be violated without  $\alpha$

#### Definition

PMA repair U for DB w.r.t.  $\eta$  is founded if for every  $\alpha \in$  U there is an AIC  $r \in \eta$  such that

- $oldsymbol{\circ}$   $\alpha \in \mathbf{R}(r)$  and
- DB  $\circ$  (U \ { $\alpha$ })  $\not\models$   $\mathbf{C}(r)$

permission reading (definition checks that every  $\alpha \in \mathbf{U}$  is permitted)

## Founded Repairs: examples (ctd.)

## Example [Cruz Felipe et al., 2013]

$$\begin{split} \mathrm{DB} = \emptyset \text{ and } \eta = \big\{ \, \langle \neg p \vee q, \{+p\} \rangle, \\ \langle p \vee \neg q, \{+q\} \rangle, \\ \langle \neg p \vee r, \{+r\} \rangle, \\ \langle \neg q \vee r, \{+r\} \rangle \, \big\} \end{split}$$

- two founded repairs:
  - $U_1 = \{+r\}$
  - $U_2 = \{+p, +q\}$

("circularity of support")

• reason: there could be  $U' \subset U \setminus \{\alpha\}$  with  $DB \circ U' \models \mathbf{C}(r)!$ 

## Grounded Repairs [Bogaert&Cruz Felipe, AIJ 2018]

#### Idea

generalises negative condition of foundedness

$$\mathtt{DB} \circ (\mathtt{U} \setminus \{\alpha\}) \not\models \mathbf{C}(r)$$

ullet hypothesis: all  ${f R}(r)$  are singletons ('all AICs are normal')

#### Definition

PMA repair U of DB w.r.t.  $\eta$  is grounded if

for every  $\mathtt{U}'\subset \mathtt{U}$  there is a  $r\in \eta$  such that

- $\bullet$   $\mathbf{R}(r) \cap (\mathtt{U} \setminus \mathtt{U}') \neq \emptyset$  and
- DB  $\circ$  U'  $\not\models$   $\mathbf{C}(r)$

#### **Properties**

• all grounded repairs are well-founded, founded, minimal

## Justified repairs [Caroprese&Truszczynski, TPLP 2011]

#### **Definitions**

• non-effect actions w.r.t. DB and U:

$$\mathtt{neff}_{\mathtt{DB}}(\mathtt{U}) = \{\alpha \, : \, \mathtt{DB} \circ \alpha = \mathtt{DB} \, \, \mathtt{and} \, \, (\mathtt{DB} \circ \mathtt{U}) \circ \alpha = \mathtt{DB} \circ \mathtt{U} \}$$

• non-updatable literals of r:

$$\operatorname{nup}(r) = \{ p \in \mathbf{C}(r) : +p \notin \mathbf{R}(r) \} \cup \{ \neg p \in \mathbf{C}(r) : -p \notin \mathbf{R}(r) \}$$

- U is closed under  $\eta$  if for each  $r \in \eta$ ,
  - if  $-p \in U$  for every  $p \in \text{nup}(r)$  and  $+p \in U$  for every  $\neg p \in \text{nup}(r)$  (r must be triggered)
  - then  $\mathbf{R}(r) \cap \mathtt{U} \neq \emptyset$
- U is a justified action set if it is a minimal superset of neff<sub>DB</sub>(U) closed under η
- PMA repair U of DB w.r.t. η is justified if U ∪ neff<sub>DB</sub>(U) is a justified action set

## Justified repairs

## **Properties**

no normalisation of active part
 ⇒ indicates obligation reading

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## Background: DL-PA

## Dynamic Logic of Propositional Assignments [Balbiani et al., 2013]

- PDL atomic programs  $\implies$  atomic assignments +p, -p
- formulas:
  - $\langle \pi \rangle \varphi$ : "there is an execution of  $\pi$  after which  $\varphi$ "
- programs:
  - +p, -p: assignments
  - $\pi_1; \pi_2$ : sequential composition
  - $\pi_1 \cup \pi_2$ : nondeterministic composition
  - $\pi^*$ : finite iteration ('Kleene star')
  - $\pi^{C}$ : converse
  - $\varphi$ ?: test
- captures standard programming constructions:

while 
$$\varphi$$
 do  $\pi \stackrel{\mathsf{def}}{=} (\varphi?; \pi)^*; \neg \varphi?$ 

## Background: semantics and properties of DL-PA

#### **Semantics**

- based on classical valuations DB
  - no Kripke models needed
- Kleene star can be eliminated (not possible in PDL)

$$\langle \pi^* \rangle \varphi \leftrightarrow \langle \pi^{\leq 2^{\operatorname{card}(\mathbb{P}_{\pi})}} \rangle \varphi$$

• consequence: all dynamic operators can be eliminated

## PDL vs. DL-PA: complexity of decision problems

	PDL	DL-PA
Model checking	PTIME-complete	PSPACE-complete
Satisfiability	EXPTIME-complete	PSPACE-complete

## Repairs in DL-PA

#### AICs as programs

for active constraint  $r = \langle \mathbf{C}(r), \mathbf{R}(r) \rangle$ :

$$\pi_r = \neg \mathbf{C}(r) ? ; \bigcup_{\alpha \in \mathbf{R}(r)} \alpha$$

#### Founded and justified repairs

- encoded as DL-PA programs [Feuillade et al., FI 2019]
  - copy propositional variables when checking minimality

## Definition [Feuillade et al., FI 2019]

PMA repair U of DB w.r.t.  $\eta$  is a dynamic repair if:

$$\langle \mathtt{DB}, \mathtt{DB} \circ \mathtt{U} \rangle \in \left| \left| \mathbf{while} \ \neg \left( \bigwedge_{r \in \eta} \mathbf{C}(r) \right) \right| \ \mathbf{do} \ \left( \bigcup_{r \in \eta} \pi_r \right) \right| \right|$$

## Dynamic repairs

### **Properties**

- obligation reading
- generalises well-founded repairs
  - repairs more [Feuillade et al., FI 2019]
- deciding the existence of a dynamic repair is PSPACE-complete

#### Example

$$\mathtt{DB} = \emptyset \text{ and } \eta = \big\{ \langle p \vee q, \{+p\} \rangle, \langle \neg p \vee q, \{+q\} \rangle \big\}$$

- $\{+p, +q\}$  is dynamic weak repair (also well-founded)
- no dynamic repair: minimal repair is  $\{+q\}$
- bad design? (v.s.)

## Reasoning about repairs in DL-PA

#### Reasoning tasks

prove properties *in* the logic (instead of in the metalanguage) Let 'repair' denote any of the repair programs

- set of candidate repaired databases?
  - $\Longrightarrow$  interpretation of the formula  $\langle \mathtt{repair}^\mathtt{c} \rangle arphi_\mathtt{DB}$
- is it possible at all to repair DB?
  - $\implies$  model check: DB  $\models \langle \text{repair} \rangle \top ?$
- is there a unique repair of DB?
  - $\implies$  model check:  $\{DB': \langle DB, DB' \rangle \in ||repair||\}$  singleton?
- can  $\eta$  repair any database?
  - $\implies$  validity check:  $\models \langle \mathtt{repair} \rangle \top ?$
- ...

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# Event-Condition-Action (ECA) rules

#### Event-condition-action (ECA) rules

- when an event occurs
- and the condition is satisfied
- then some action is triggered

#### ECA rules too expressive for a logical analysis?

- much studied in databases [Ceri et al., ACM TDS 1994;
   Widom&Ceri, 1996; Chomicki&Marcinkowski, IC 2005,...]
- termination problems
- procedural semantics only; no declarative semantics
  - "their lack of declarative semantics makes it difficult to understand the behavior of multiple ECAs acting together and to evaluate rule-processing algorithms in a principled way" [Cruz Filipe, 2016]
- AIC = ECA minus events

## Adding event conditions to AICs: syntax

#### Event-condition-action rules

$$r = \langle \mathbf{E}(r), \mathbf{C}(r), \mathbf{R}(r) \rangle$$

- $\bullet \ \langle \mathbf{C}(r), \mathbf{R}(r) \rangle$  is an AIC
- ullet  ${f E}(r)$  is a boolean formula built from assignments
  - partial description of last update actions

### Example: functionality constraint & priority to the input

$$\begin{split} \eta_{\text{emp}} &= \left\{\, \langle +\text{emp}_{e,d_1}, \neg \text{emp}_{e,d_1} \lor \neg \text{emp}_{e,d_2}, \{-\text{emp}_{e,d_2}\} \rangle, \\ &\quad \langle +\text{emp}_{e,d_2}, \neg \text{emp}_{e,d_1} \lor \neg \text{emp}_{e,d_2}, \{-\text{emp}_{e,d_1}\} \rangle \,\right\} \end{split}$$

# Adding event conditions to AICs: syntax (ctd.)

#### Example, ctd.

- every manager of a project carried out by a department must be an employee of that department
- if e just became manager of project p or if p was just assigned to  $d_1$  then e should become a member of  $d_1$
- if e has just been removed from  $d_1$  then the project should either be removed from  $d_1$ , too, or should get a new manager

```
\begin{split} \eta &= \eta_{\texttt{emp}} \ \cup \\ & \left\{ \ \langle + \texttt{mgr}_{e,p} \lor + \texttt{prj}_{p,d_1}, \neg \texttt{mgr}_{e,p} \lor \neg \texttt{prj}_{p,d_1} \lor \texttt{emp}_{e,d_1}, \{+ \texttt{emp}_{e,d_1} \} \rangle, \right. \\ & \left. \langle - \texttt{emp}_{e,d_1}, \neg \texttt{mgr}_{e,p} \lor \neg \texttt{prj}_{p,d_1} \lor \texttt{emp}_{e,d_1}, \{- \texttt{mgr}_{e,p}, - \texttt{prj}_{p,d_1} \} \rangle \ \right\} \end{split}
```

 $\bullet$  when last update  $+\mathtt{mgr}_{e,p}$  then repair by  $\{+\mathtt{emp}_{e,d_1}, -\mathtt{emp}_{e,d_1}\}$ 

## Adding event conditions to AICs: models

#### Adding immediate past events

$$\mathsf{model}\ M = \langle \mathtt{DB}, \mathbf{E} \rangle$$

- ullet DB  $\subseteq \mathbb{P}$  database
- $\mathbf{E} \subseteq \{+p : p \in \mathbb{P}\} \cup \{-p : p \in \mathbb{P}\}$  set of update actions consistent with DB:
  - ullet if  $+p\in {f E}$  then  $p\in {f DB}$
  - if  $-p \in \mathbf{E}$  then  $p \notin \mathtt{DB}$
- semantics
  - $\bullet \ \langle \mathtt{DB}, \mathbf{E} \rangle \models p \ \mathsf{if} \ p \in \mathtt{DB}$
  - $\langle \mathrm{DB}, \mathbf{E} \rangle \models +p \text{ if } +p \in \mathbf{E}$
  - $\langle {\tt DB}, {\bf E} \rangle \models -p \text{ if } -p \in {\bf E}$

## Well-founded repairs with immediate past

#### Definition

PMA repair U for  $\langle DB, \mathbf{E} \rangle$  w.r.t.  $\eta$  is well-founded if

 $\mathtt{U} = \{ lpha_1, \dots, lpha_n \}$  (for some ordering) such that

for every  $\alpha_i$  there is an ECA rule  $r_i \in \eta$  with

- $\langle \mathtt{DB} \circ \{\alpha_1, \ldots, \alpha_{i-1}\}, \mathbf{E} \cup \{\alpha_1, \ldots, \alpha_{i-1}\} \rangle \models \mathbf{E}(r_i)$
- $\langle \mathtt{DB} \circ \{\alpha_1, \ldots, \alpha_{i-1}\}, \mathbf{E} \cup \{\alpha_1, \ldots, \alpha_{i-1}\} \rangle \not\models \mathbf{C}(r_i)$
- $\alpha_i \in \mathbf{R}(r_i)$

#### Example, ctd.

• well-founded repair of  $\langle \{ prj_{p,d_1}, emp_{e,d_2} \}, \{ +mgr_{e,p} \} \rangle$ :

$$\mathtt{U} = \{ + \mathtt{emp}_{e,d_2}, -\mathtt{emp}_{e,d_1} \}$$

can be captured in DL-PA

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# From DBs to description logic KBs

#### DL knowledge bases

- knowledge base  $KB = TBox \cup ABox$
- TBox: non-contingent ⇒ typically stable in time
- ABox: contingent ⇒ typically changes more frequently
- ideally: TBox  $\cup$  ABox  $\not\models \bot$

(and not:  $ABox \models TBox$  as in databases)

- typically caused by changes to ABox
- active TBoxes should play the role of AICs

# From DBs to description logic KBs

#### Repairs of inconsistent KBs in the DL literature

- remove axioms [Schlobach&Cornet, 2003]
- weaken axioms [Troquard et al., 2018]
- main methods: axiom pinpointing, justifications, hitting set, weakening of axioms
- usually no preference between possible repairs considered

Can we import the idea of active constraints?

## A simple example

#### Example TBox

$$\mathcal{T} = \{ \texttt{Father} \sqsubseteq \texttt{Male} \sqcap \texttt{Parent}, \\ \texttt{OnlyChild} \sqsubseteq \forall \texttt{hasSibling}.\bot \}$$

#### An ABox inconsistent with ${\cal T}$

```
\label{eq:Alpha} \begin{split} \mathcal{A} &= \big\{ \texttt{John:Male} \sqcap \texttt{Father} \sqcap \neg \texttt{Parent}, \\ & \texttt{Mary:OnlyChild}, \\ & \texttt{hasSibling}(\texttt{Mary}, \texttt{John}) \big\} \end{split}
```

## A simple example

#### An enhanced TBox extending $\mathcal{T}$

```
\mathbf{a}\mathcal{T}_1 = \big\{ \langle \mathtt{Father} \sqsubseteq \mathtt{Male} \sqcap \mathtt{Parent}, \{+\mathtt{Male}, +\mathtt{Parent}\} \rangle, \\ \langle \mathtt{OnlyChild} \sqsubseteq \forall \mathtt{hasSibling}.\bot, \{-\mathtt{OnlyChild}\} \rangle \big\}
```

### A repaired ABox consistent with aT

### A simple example

### An enhanced TBox extending $\mathcal{T}$

```
\begin{split} \mathbf{a}\mathcal{T}_2 &= \big\{ \; \langle \mathtt{Father} \sqsubseteq \mathtt{Male} \sqcap \mathtt{Parent}, \{-\mathtt{Father}\} \rangle, \\ &\quad \langle \mathtt{OnlyChild} \sqsubseteq \forall \mathtt{hasSibling}.\bot, \{-\mathtt{hasSibling}.\top\} \rangle \; \big\} \end{split}
```

#### A repaired ABox consistent with aT

```
\mathcal{A}_2 = \{ \mathtt{John:Male} \sqcap \neg \mathtt{Father} \sqcap \neg \mathtt{Parent}, \\ \mathtt{Mary:OnlyChild} \}
```

# Repairs based on dynamic TBoxes

#### Challenges

- ◆ ABoxes have concept constructors & complex concepts
   ⇒ 'atomic' update actions usually insufficient
- ② closed world semantics vs. open world semantics
   ⇒ satisfiability checking instead of model checking
- removing vs. forgetting concepts ⇒ choice

#### **Proposals**

- [Rantsoudis et al., DL 2017]: syntactic approach
- [Feuillade et al., DL 2018]: semantic approach
  - $\bullet$  logic dyn $\mathcal{ALCO}$
- [Rantsoudis, PhD 2018]

#### In summary

- reexamined intuitions behind active integrity constraints
  - permission vs. obligation to choose update action
    - obligation reading deserves more investigation
  - principle of extensionality
- surveyed AICs via dynamic logic
  - introduction of dynamic repairs
  - captured trigger events ⇒ ECA rules
- sketched repairs based on active TBoxes

#### Looking ahead

- good postulates for database repair?
- better complexity results for repairs based on active TBoxes?
- application to defeasible DLs

