

# Action Theories over Generalized Databases with Equality Constraints

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# Situation Calculus

[McCarthy63, McCarthyHayes69, Reiter01]

First-order multi-sorted language for reasoning about actions

## Sorts

- **Objects**  $\Delta$  : (possibly infinite) domain of discourse  $-block_1, block_2, \dots$
- **Actions**  $Act$  (defined using finite set  $\mathcal{A}$  of action function symbols):
  - ▶ finitely many action types  $-pick(x), stack(x, y)$
  - ▶ possibly infinitely many actions  $-pick(block_1), pick(block_2), \dots$
- **Situations**  $\mathcal{S}$ : world histories (defined inductively)
  - ▶  $S_0$ : constant denoting initial situation
  - ▶  $do(s, \alpha)$  situation resulting from executing (ground) action  $\alpha$  at  $s$

## Fluents

- predicates asserting properties of objects in situations  $-On(x, y, s)$
- NO functional fluents (here)

# Basic Action Theories (BATs)

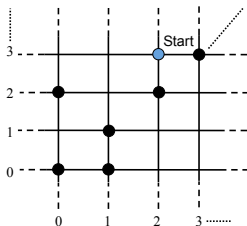
$$\mathcal{D} = \mathcal{D}_0 \cup \mathcal{D}_{ap} \cup \mathcal{D}_{ss} \cup \mathcal{D}_{una} \cup \Sigma$$

- Initial situation description  $\mathcal{D}_0$ :  
FO axioms (*uniform* in  $S_0$ ) defining initial configuration
- Precondition axioms  $\mathcal{D}_{ap}$  –when actions are executable:  
 $Poss(A(\vec{x}), s) \equiv \Phi_A(\vec{x}, s)$  (FO)
- Successor state axioms  $\mathcal{D}_{ss}$  –action effects:  
 $F(\vec{x}, do(a, s)) \equiv \Phi_F(\vec{x}, a, s)$  (FO)
- Uniqueness of action names  $\mathcal{D}_{una}$ :  
 $A(\vec{x}) \neq A'(\vec{y}), A(\vec{x}) = A(\vec{y}) \supset \vec{x} = \vec{y}$  (FO)
- Foundational axioms  $\Sigma$ :  
(domain-independent) formal definitions of
  - ▶ *situation tree* (SO, due to induction)
  - ▶ ordering  $\sqsubseteq$  among situations

We restrict to *standard interpretations* [Levesque98]: named objects;  
u.n.a. axioms for constants; axioms for equality ( $\mathcal{E}$ )

# Basic Action Theories

## Example



- Infinite grid
- Start in  $(2, 3)$
- Can move only along lines
- Can change direction only by stopping on marked crossings

# Basic Action Theories

## Example

- Action types:  $\mathcal{A} = \{moveTo(x, y)\}$
- Fluents:  $\mathcal{F} = \{At(x, y, s), Dest(x, y, s), Cross(x, y, s)\}$
- $\mathcal{D}_0$ :
  - ▶  $At(x, y, S_0) \equiv x = 2 \wedge y = 3$
  - ▶  $Dest(x, y, S_0) \equiv x = 2$
  - ▶  $Cross(x, y, S_0) \equiv (x = y) \vee (x = 0 \wedge y = 2) \vee (x = 1 \wedge y = 0)$
- $\mathcal{D}_{ap}$ :
  - ▶  $Poss(moveTo(x, y), s) \equiv Dest(x, y, s)$
- $\mathcal{D}_{ss}$ :
  - ▶  $Cross(x, y, do(moveTo(x', y'), s)) \equiv Cross(x, y, s)$
  - ▶  $At(x, y, do(moveTo(x', y'), s)) \equiv (x = x' \wedge y = y')$
  - ▶  $Dest(x, y, do(moveTo(x', y'), s)) \equiv (Cross(x', y', s) \wedge (x = x' \vee y = y')) \vee \exists x'', y''. At(x'', y'', s) \wedge [(x' = x'' \wedge y' \neq y'' \wedge x = x') \vee (y' = y'' \wedge x' \neq x'' \wedge y = y') \vee (y' = y'' \wedge x' = x'' \wedge Dest(x, y, s))]$

OBS:  $Dest$  extension can be infinite

# Situation Calculus

## Reasoning Tasks

Regression[PirriReiter99] (not this work) Reduce reasoning about a future situation to reasoning about initial situation (weakest precondition)

Progression[LinReiter97] (this work) Provide a “complete” description  $\mathcal{D}_\alpha$  of the new configuration obtained by executing  $\alpha$  in  $S_0$

Projection[Reiter01] (this work) Predict whether a condition  $\phi(s)$  holds after a sequence  $\alpha_0, \dots, \alpha_n$  of actions is executed (we consider a more general form)

# Progression

*Progression*: Set of sentences  $\mathcal{D}_\alpha$  such that  $\mathcal{D}$  and  $(\mathcal{D} - \mathcal{D}_0) \cup \mathcal{D}_\alpha$  “coincide” from  $do(\alpha, S_0)$  on

Important questions:

- Is progression, i.e.  $\mathcal{D}_\alpha$ , FO-definable?
- (When) Can we come up with a FO  $\mathcal{D}_\alpha$ ?

Some answers:

- Second-Order  $\mathcal{D}_\alpha$  required [LinReiter97, VassosLevesque13]
- Practically-relevant cases exist of FO-progressable theories [LinReiter97]:
  - ▶ Initial KB is *definitional* (in our case a possibly infinite database):

$$\mathcal{D}_0 = \left\{ \bigwedge_{F \in \mathcal{F}} \forall \vec{x}. F(\vec{x}, S_0) \equiv \phi_F(\vec{x}) \right\}, \phi_F \text{ mentions no situation}$$

- ▶ Context-free SSAs:  $F$  depends only on  $F$  at previous situation

# Projection

(Simple) Projection: given a sequence of actions  $\alpha_1 \cdots \alpha_n$  check whether  $\mathcal{D} \models \phi(s)$ , for  $s = do(\alpha_n, \dots, do(\alpha_1, S_0))$

Through regression, projection can be reduced to a query over the initial KB (to answer which, theorem proving is needed in general)

Decidable (and practical) in few cases:

- initial KB is a regular database [Reiter92]
- incomplete knowledge as proper KB + local effects [LiuLevesque05] (sometimes complete)
- two-variable fragment of FO [GuSoutchanski07]
- bounded action theories [DeGiacomo-etal12] (beyond projection)



# Progression and Projection

Action sequence:  $\alpha_1 \cdots \alpha_n$ , Property:  $\phi$

Progression can be used as a basic step for projection:

- 1 Start with  $\mathcal{D}_0$  and  $\alpha = \alpha_1$
- 2 Progress current  $\mathcal{D}_0$  w.r.t. current action  $\alpha$ , getting  $\mathcal{D}_\alpha$
- 3 Update  $\mathcal{D}_0$  with obtained progression, i.e., let  $\mathcal{D}_0 = \mathcal{D}_\alpha$
- 4 Iterate 2 with  $\alpha = \alpha_{i+1}$  until  $i = n$
- 5 Check whether obtained  $\mathcal{D}_\alpha$  satisfies  $\phi(s)$

$$\mathcal{D}_0 \xrightarrow{\alpha_1} \mathcal{D}_{\alpha_1} \xrightarrow{\alpha_2} \cdots \xrightarrow{\alpha_{n-1}} \mathcal{D}_{\alpha_{n-1}} \xrightarrow{\alpha_n} \mathcal{D}_{\alpha_n}$$

$$\mathcal{D}_{\alpha_n} \models \phi?$$

Decidable and practical when progression and  $\models$  are so

# BATs with Definitional Initial KB: Progression

[LinReiter97]

Progression obtained by syntactically replacing fluent atoms with their definition in  $\mathcal{D}_0$

For each SSA  $F(\vec{x}, do(a, s)) \equiv \Phi(\vec{x}, a, s)$ :

- Replace every atom  $F_j(\vec{o}, s)$  in  $\Phi(\vec{x}, a, s)$  with the definition  $\phi_j$  of  $F_j$  in  $\mathcal{D}_0$

The obtained set  $\mathcal{D}_\alpha$  is a progression

NOTE: at every progression step, size of axioms in  $\mathcal{D}_\alpha$  grows

$\mathcal{D}_\alpha$ : set of (FO) axioms  $\rightarrow$  query answering needs theorem proving

We look for a more practical, *ready-to-use* form of progression

# BATs with Definitional KB: Progression

## Example

- $s = do(moveTo(2, 4), S_0)$
- $\mathcal{D}_0 = \{At(x, y, S_0) \equiv x = 2 \wedge y = 3, Dest(x, y, S_0) \equiv x = 2,$   
 $Cross(x, y, S_0) \equiv (x = y) \vee (x = 0 \wedge y = 2) \vee (x = 1 \wedge y = 0)\}$
- $\mathcal{D}_{ss} = \{Cross(x, y, do(moveTo(x', y'), s)) \equiv Cross(x, y, s),$   
 $At(x, y, do(moveTo(x', y'), s)) \equiv (x = x' \wedge y = y'),$   
 $Dest(x, y, do(moveTo(x', y'), s)) \equiv (Cross(x', y', s) \wedge (x = x' \vee y = y')) \vee$   
 $\exists x'', y''. At(x'', y'', s) \wedge [(x' = x'' \wedge y' \neq y'' \wedge x = x') \vee$   
 $(y' = y'' \wedge x' \neq x'' \wedge y = y') \vee (y' = y'' \wedge x' = x'' \wedge Dest(x, y, s))]\}$
- $\mathcal{D}_\alpha = \{Dest(x, y, do(moveTo(2, 4), S_0)) \equiv$   
 $((2 = 4) \vee (2 = 0 \wedge 4 = 2) \vee (2 = 1 \wedge 4 = 0)) \wedge (x = 2 \vee y = 4)) \vee$   
 $\exists x'', y''. x'' = 2 \wedge y'' = 3 \wedge [(2 = x'' \wedge 4 \neq y'' \wedge x = 2) \vee$   
 $(4 = y'' \wedge 2 \neq x'' \wedge y = 4) \vee (4 = y'' \wedge 2 = x'' \wedge x = 2)], \dots\}$

# Generalized Databases (with Equality Constraints)

[Kanellakis-etal95]

**Generalized  $k$ -tuple** : (models of) conjunction of equality constraints involving  $k$  variables  $x_1, \dots, x_k$

**Generalized relation (of arity  $k$ )** : (model of) disjunction of  $k$ -tuples over  $x_1, \dots, x_k$

**Generalized Database**: set of (models of) generalized relations

## Example (Generalized relation)

$$\text{Cross}(x, y, S_0) \equiv (x = y) \vee (x = 0 \wedge y = 2) \vee (x = 1 \wedge y = 0)$$

# Answering Queries over Generalized DBs

Generalized relations can be infinite: not representable extensionally

What if we need to answer queries on a generalized DB?

## Theorem (Kanellakis-etal95)

*Query answers on Generalized DBs are computable and representable as generalized relations:*

- 1 *Replace each relation atom  $R_i$  in the query  $\phi$  by its formula  $\phi_R$*
- 2 *Build all the (finitely many, up to isomorphism) generalized tuples of appropriate arity*
- 3 *Keep only the tuples consistent with the new query  $\phi'$  obtained in 1*

*Corollary: logical equivalence (under  $\mathcal{E}$ ) is decidable*

Thus:

- Effective procedure to answer queries on a class of infinite DBs
- A closed representation system

We exploit these features to address progression and projection

# BATs with Generalized Fluent DBs

## Definition

Generalized fluent DB (GFDB)  $\mathcal{D}_0$ :

$$\left\{ \bigwedge_{F_i \in \mathcal{F}} \forall \vec{x}_i. F(\vec{x}_i, S_0) \equiv \phi_i(\vec{x}_i) \right\}$$

with  $\phi_i(\vec{x}_i)$  a generalized relation formula (with equality constraints)

Intuition: extension of each fluent as a generalized relation

## Definition

A BAT-GFDB  $\mathcal{D}$  is a BAT s.t.  $\mathcal{D}_0$  is a GFDB

# BAT-GFDBs and BATs with Definitional KB

## Theorem

*For any definitional KB there exists an equivalent generalized fluent database, and viceversa.*

*From definitional KB to GFDB (viceversa obvious):*

- *Eliminate quantifiers (FO theories of equality admit quantifier elimination)*
- *Rewrite as DNF*

Constructive: actual procedure to transform a definitional KB into a GFDB

# Progression of BAT-GFDBs

Progression as query answering on (generalized) DBs

## Example

- $Dest(x, y, do(moveTo(x', y'), s)) \equiv (Cross(x', y', s) \wedge (x = x' \vee y = y')) \vee \exists x'', y''. At(x'', y'', s) \wedge [(x' = x'' \wedge y' \neq y'' \wedge x = x') \vee (y' = y'' \wedge x' \neq x'' \wedge y = y') \vee (y' = y'' \wedge x' = x'' \wedge Dest(x, y, s))]$

$Dest(x, y, do(moveTo(2, 4), S_0))$  can be obtained by answering the RHS above on  $\mathcal{D}_0$

- $\mathcal{D}_\alpha = \{Dest(x, y, do(moveTo(2, 4), S_0)) \equiv (x = 2), \dots\}$

$\mathcal{D}_\alpha$  is now more of a *materialized update* than a logical specification!

## Theorem

*There always exists a progression  $\mathcal{D}_\alpha$  that is a GFDB*



## Simple Projection Over BAT-GFDBs

We can iteratively progress a theory w.r.t. a sequence of actions  $\alpha_1, \dots, \alpha_n$ , obtaining a GFDB at every step:

$$\mathcal{D}_0 \xrightarrow{\alpha_1} \mathcal{D}_{\alpha_1} \xrightarrow{\alpha_2} \dots \xrightarrow{\alpha_n} \mathcal{D}_{\alpha_n}$$

So, we can check whether  $\mathcal{D} \models \phi(\text{do}(\alpha_n, \dots, \text{do}(\alpha_1, S_0)))$  by simply checking whether  $\mathcal{D}_{\alpha_n} \models \phi(\text{do}(\alpha_n, \dots, \text{do}(\alpha_1, S_0)))$  (recall  $\phi$  is local)

NOTE: Decidability of projection for definitional KBs was known and based on regression. When a method is preferable needs further investigation.

# Generalized Projection Over BAT-GFDBs

Generalization:  $\phi$  may refer to any number of future situations

$$\phi = \forall s. do(moveTo(2, 4), S_0) \sqsubseteq s \supset \exists x, y. Dest(x, y, s)$$

(After executing  $moveTo(2, 4)$ , any future situation allows for at least one destination)

Language  $\mathcal{L}_p$  of **generalized projection queries**:

$$\phi := x = c \mid x = y \mid F(\vec{x}, s) \mid F(\vec{x}, \sigma) \mid \neg\phi \mid \phi \wedge \phi \mid \exists x. \phi$$

$$\varphi := \phi \mid \neg\varphi \mid \varphi \wedge \varphi \mid \exists s. \sigma \sqsubseteq s \wedge \varphi$$

where  $\phi$  is uniform in  $s$  or in  $\sigma$ , with free variables only of sort situation

We consider only sentences in  $\mathcal{L}_p$

# Generalized Projection Over BAT-GFDBs

BAT-GFDBs in general infinite-state  $\rightarrow$  cannot simply “visit” the model of  $\mathcal{D}$  to check whether  $\mathcal{D} \models \phi$

However: for a special class of BAT-GFDBs we can reduce the check to one over a finite structure

# Constant-bounded BAT-GFDBs

## Definition

A BAT-GFDB  $\mathcal{D}$  is  $C$ -bounded by  $B$  if the state of every executable situation can be represented as a GFDB mentioning at most  $B$  distinct constants.

NOTE: Semantic definition. Syntactic conditions to be investigated.

## Example

The grid theory is  $C$ -bounded. At every situation, we need:

- 2 constants for current position ( $At$ )
- 3 constants for  $Cross$
- At most 2 constants for  $Dest$

(Recall we have named objects)

$C$ -bounded BAT-GFDBs generalize bounded BATs [DeGiacomo-etal12]

# Generalized Projection over C-bounded BAT-GFDBs

## Theorem

Checking whether  $\mathcal{D} \models \varphi$  for a C-bounded BAT-GFDB and a generalized projection query is decidable.

Crux of the proof:

- Base case of projection queries is local (FO) sentence
- For given  $B$ , only finitely many equivalence classes of *logically equivalent (under  $\mathcal{E}$ )* GFDBs exist
- Only equivalence class matters for the base case

Can build a *finite-state* TS  $\hat{T}_{\mathcal{D},\varphi}$  with isomorphism types as states, that preserves transitions between types

# Generalized Projection over C-bounded BAT-GFDBs

## Construction of $\hat{T}_{\mathcal{D},\varphi}$

Given: a BAT-GFDB  $\mathcal{D}$  and a generalized projection query  $\varphi \in \mathcal{L}_p$ :

- 1 Fix a *finite* set of constants  $H$  containing:
  - ▶ all constants mentioned in  $\mathcal{D}$  ( $\mathcal{C}_{\mathcal{D}}$ ) and  $\varphi$  ( $\mathcal{C}_{\varphi}$ )
  - ▶  $B \times |\mathcal{F}|$  fresh constants
  - ▶  $N_{\mathcal{A}}$  fresh constants, with  $N_{\mathcal{A}}$  max num of parameters in action types
- 2 From  $\mathcal{D}_0$ , iteratively progress the current situation
  - ▶ Consider all possible actions for  $\mathcal{A}$  and  $H$
  - ▶ Generate progression in the form of BAT-GFDB
  - ▶ Record progression steps as action-labelled transitions
  - ▶ If a logically equivalent progression has been generated, reuse it (i.e., *connect back*)

Stop when all progressions (up to logical equivalence) are expanded

OBS: by finiteness of  $H$ ,  $\hat{T}_{\mathcal{D},\varphi}$  is finite-state

# Generalized Projection over C-bounded BAT-GFDBs

## Property Check

### Theorem

$$\mathcal{D} \models \varphi \text{ iff } \hat{T}_{\mathcal{D},\varphi} \models \varphi$$

We can check  $\varphi$  against the finite  $\hat{T}_{\mathcal{D},\varphi}$  instead of the infinite model of  $\mathcal{D}$

Can be easily done using a MC-like procedure

# Conclusions

- 1 Generalized DBs characterize definitional KBs (without non-fluent predicates) and generalize bounded BATs
- 2 Transformation from definitional KB to GFDB provided
- 3 Closed representation system
- 4 Progression of GFDBs closer to an *actual update* than logical specification
- 5 For BAT-GFDBs, standard projection and a generalized form decidable (actual procedure given)
- 6 To date most expressive SitCalc theory with infinite fluent extensions and decidable progression and generalized projection



# Future Work

- 1 Investigate syntactical conditions that guarantee C-boundedness
- 2 Add forms of incomplete knowledge (e.g., bounded unknowns [VassosP13])
- 3 Consider special non-GFDB-expressible fluents such as linear order
- 4 Exploit results for actual implementation on Golog family of high-level agent programming languages