

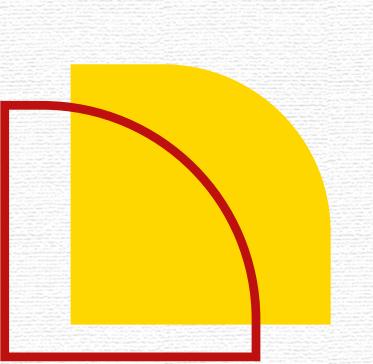




Integrantes:

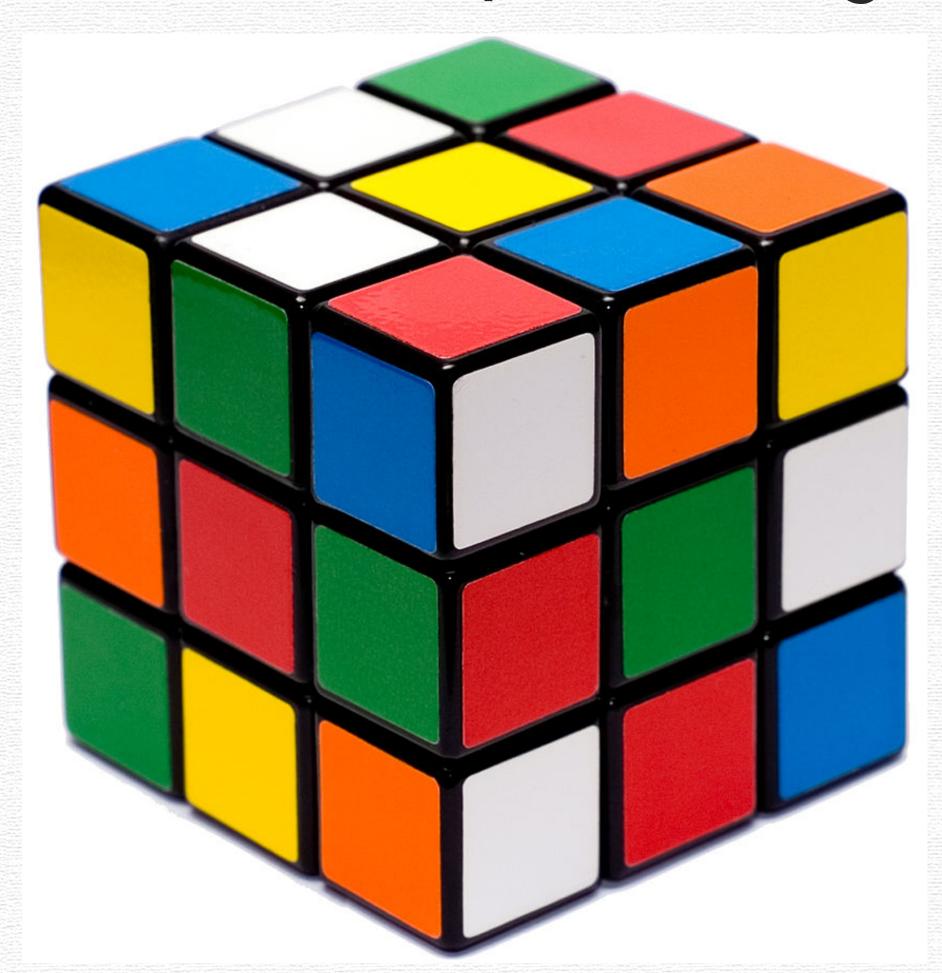
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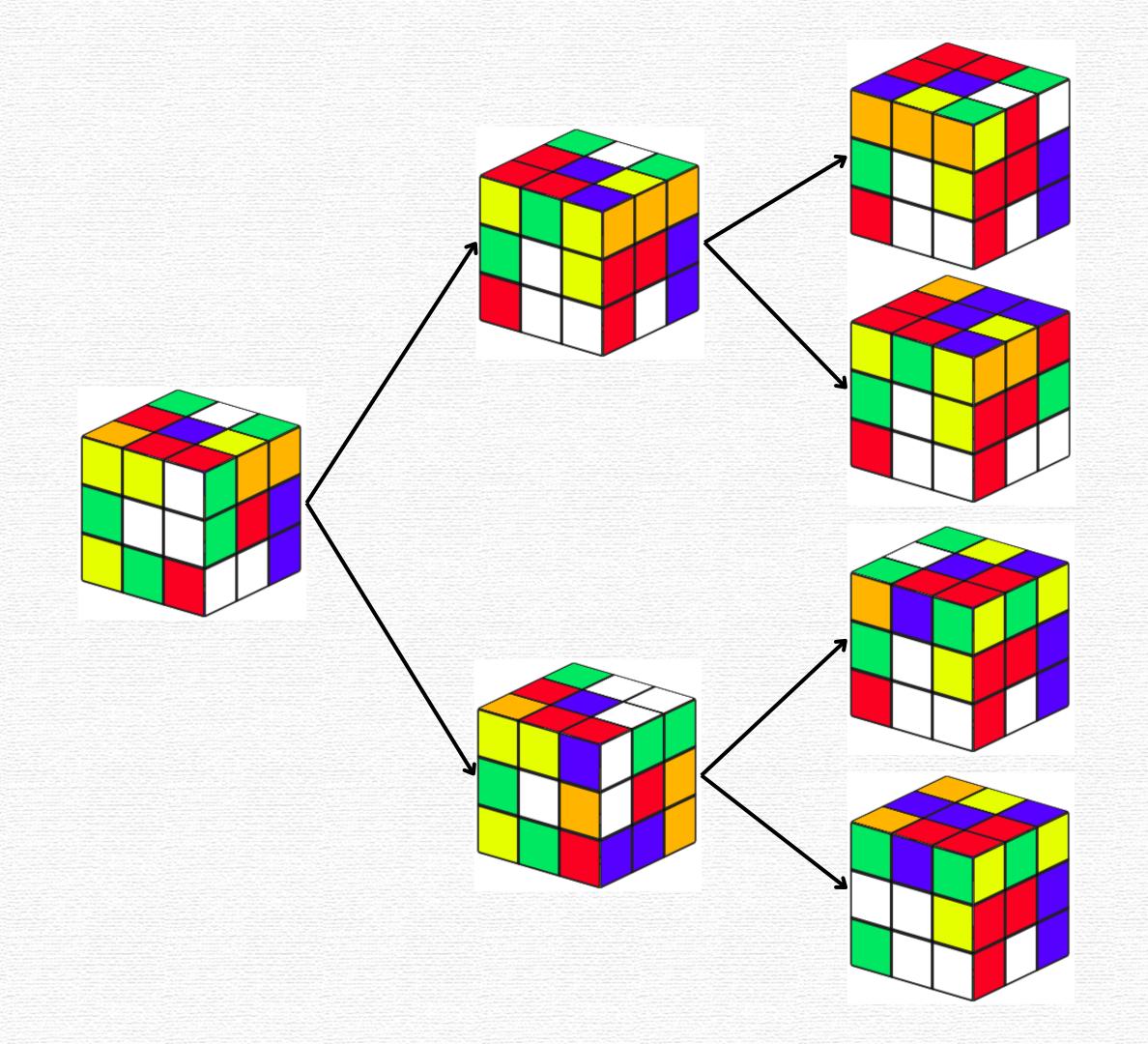






Cubo de Rubik (Cubo Mágico)





Solving the Rubik's Cube with a PDDL Planner

Bharath Muppasani, Vishal Pallagani, Kausik Lakkaraju, Biplav Srivastava, Forest Agostinelli

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On Solving the Rubik's Cube with Domain-Independent Planners Using Standard Representations

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Abstract

Rubik's Cube (RC) is a well-known and computationally challenging puzzle that has motivated AI researchers to explore efficient alternative representations and problem-solving methods. The ideal situation for planning here is that a problem be solved optimally and efficiently represented in a standard notation using a general-purpose solver and heuristics. The fastest solver today for RC is DeepCubeA with a custom representation, and another approach is with Scorpion planner with State-Action-Space+ (SAS+) representation. In this paper, we present the first RC representation in the popular PDDL language so that the domain becomes more accessible to PDDL planners, competitions, and knowledge engineering tools, and is more humanreadable. We then bridge across existing approaches and compare performance. We find that in one comparable experiment, DeepCubeA1 solves all problems with varying complexities, albeit only 18% are optimal plans. For the same problem set, Scorpion with SAS+ representation and pattern database heuristics solves 61.50% problems, while FastDownward with PDDL representation and FF heuristic solves 56.50% problems, out of which all the plans generated were optimal. Our study provides valuable insights into the tradeoffs between representational choice and plan optimality that can help researchers design future strategies for challenging domains combining general-purpose solving methods (planning, reinforcement learning), heuristics, and representations (standard or custom).

AII

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arXiv:2307.

Introduction

The Rubik's Cube is a 3D puzzle game that has been widely popular since its invention in 1974. It has been a subject of interest for researchers in Artificial Intelligence (AI) due to its computational complexity and potential for developing efficient problem-solving algorithms. RC has motivated researchers to explore alternative representations that simplify the problem while preserving its complexity. Efficient algorithms have been developed to solve RC in the least number of moves, and they have been used in various applications, including robot manipulation, game theory, and ma-

chine learning. Therefore, in this paper, we aim to explore the different representations and algorithms to solve RC and evaluate their performance and effectiveness in solving this challenging puzzle.

Various solution approaches have been proposed RC including Reinforcement Learning (RL) and search. For instance, DeepCubeA (Agostinelli et al. 2019a) uses RL to learn policies for solving RC, where the cube state is represented by an array of numerical features. Although Deep-CubeA is a domain-independent puzzle solver, it employs a custom representation for RC. On the other hand, Büchner et al. (2022) utilized SAS+ representation to model the RC problem in a finite domain representation, which enables standard general-purpose solvers like Scorpion to be used on the RC problem. Despite the success of these approaches, no prior work has explored the use of Planning Domain Definition Language (PDDL) to encode a 3x3x3 RC problem. While a previous study² has encoded a 2x2x2 RC problem using PDDL and solved it with a Fast-Forward planner, there exists no PDDL encoding for a 3x3x3 RC problem.

In this paper, we introduce a novel approach for representing RC in PDDL. We encode the initial state and goal state using a set of predicates, each of which specifies the color of a sticker on a particular cube piece or edge piece. We then define the actions that can be taken to manipulate the cube pieces and edges. Our PDDL representation enables us to model RC as a classical planning problem, which can be solved using off-the-shelf planning tools. To the best of our knowledge, this is the first attempt to represent RC formally using PDDL. We also evaluate the effectiveness of our approach by comparing it with other state-of-the-art representations in terms of the efficiency and effectiveness of problem-solving. Our major contributions are:

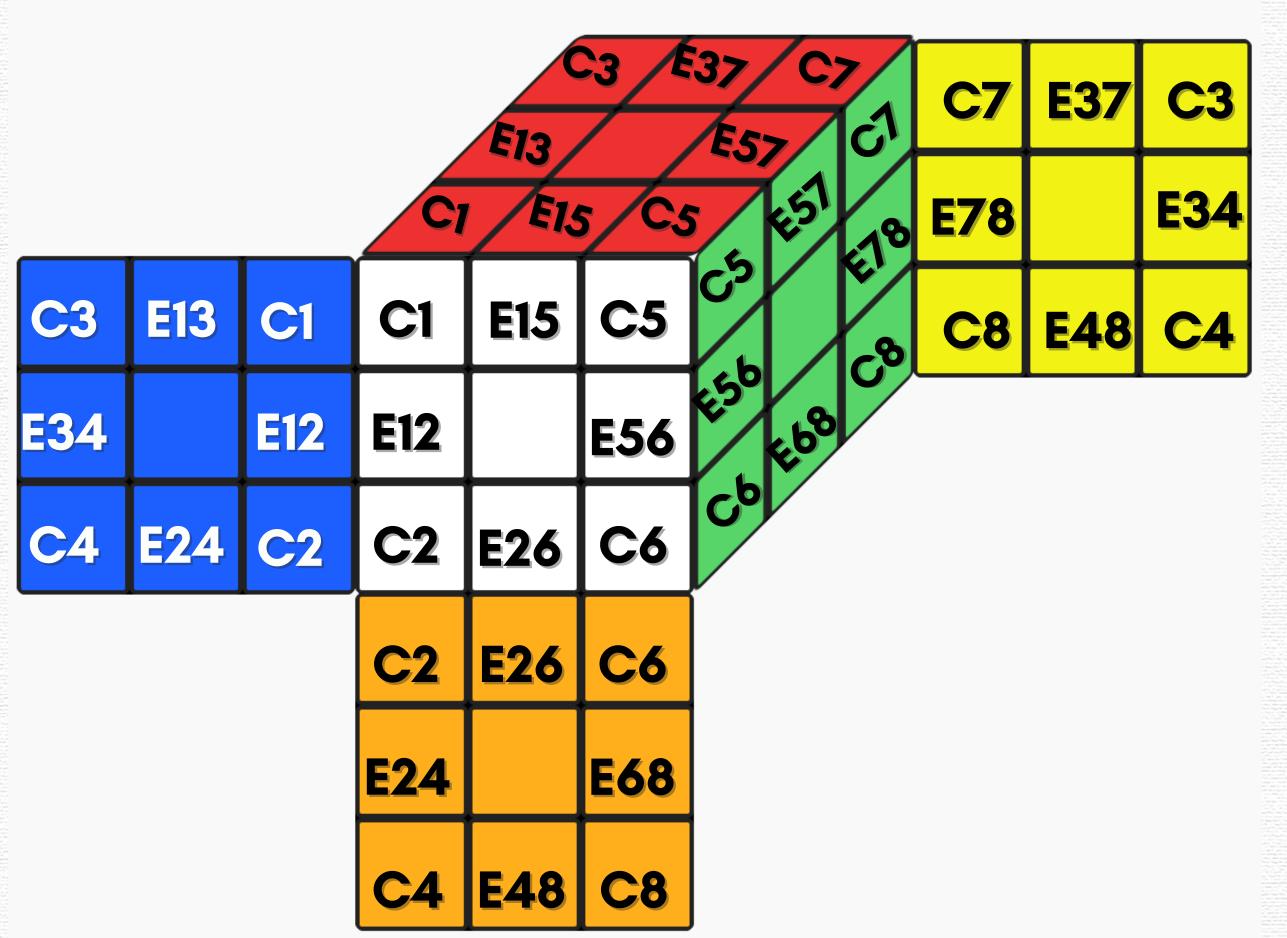
- We develop the first PDDL formulation for the 3x3x3 Rubik's Cube, which is a novel and significant contribution to the existing literature. This PDDL formulation will enable the use of standard PDDL planners for solving Rubik's Cube problems, which was not previously possible.
- We bridge across hither-to incomparable RC solving approaches, compare their performance and draw insights from results to facilitate new research.

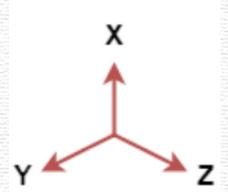
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DeepCubeA trained with 12 RC actions

²https://wu-kan.cn/2019/11/21/Planning-and-Uncertainty/

Predicados

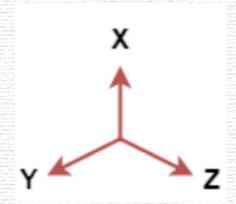




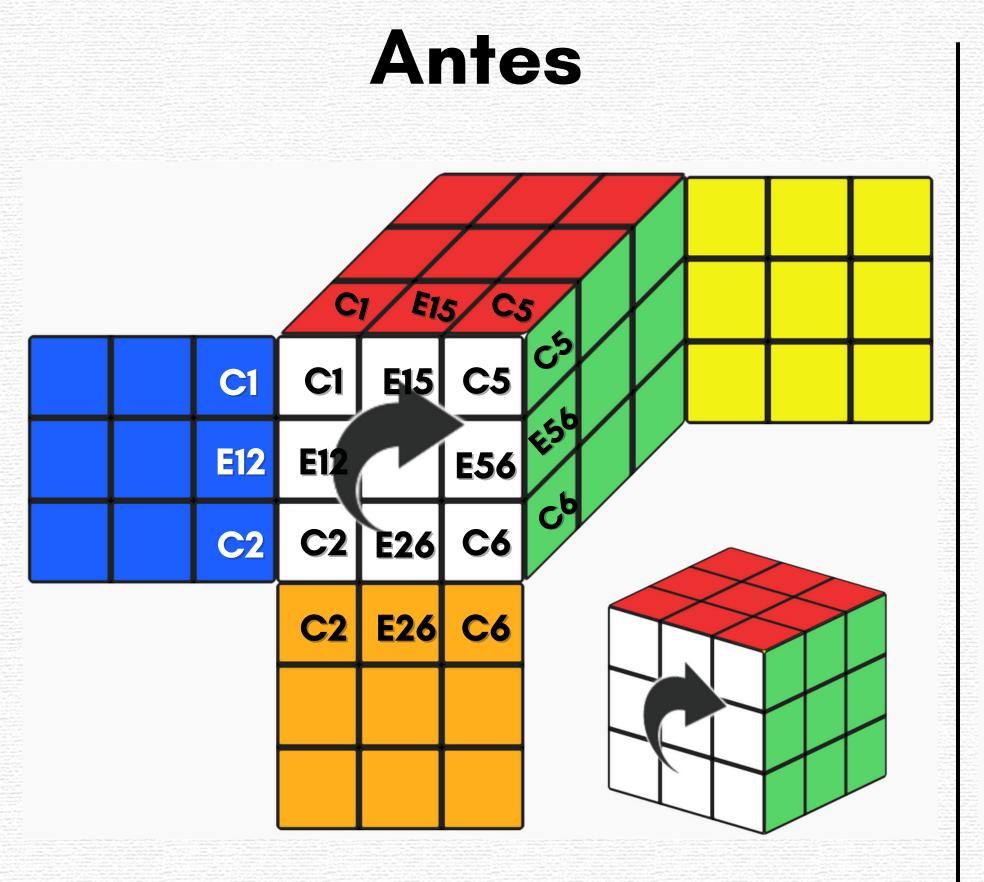
Predicados

```
;; 12-action variant
 1
       (define
 2
            (domain rubiks-cube)
 3
            (:requirements :adl)
 4
            (:predicates
 5
                (cube1 ?x ?y ?z)
 6
                (cube2 ?x ?y ?z)
 7
                (cube3 ?x ?y ?z)
 8
                (cube4 ?x ?y ?z)
 9
                (cube5 ?x ?y ?z)
10
                (cube6 ?x ?y ?z)
11
                (cube7 ?x ?y ?z)
12
                (cube8 ?x ?y ?z)
13
14
                (edge12 ?y ?z)
                (edge13 ?x ?z)
15
                (edge15 ?x ?y)
16
                (edge26 ?x ?y)
17
                (edge24 ?x ?z)
18
                (edge48 ?x ?y)
19
                (edge34 ?y ?z)
20
                (edge37 ?x ?y)
21
                (edge56 ?y ?z)
22
                (edge57 ?x ?z)
23
                (edge68 ?x ?z)
24
                (edge78 ?y ?z)
25
```

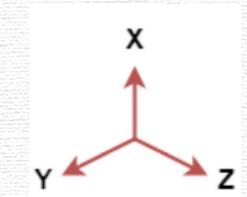
26

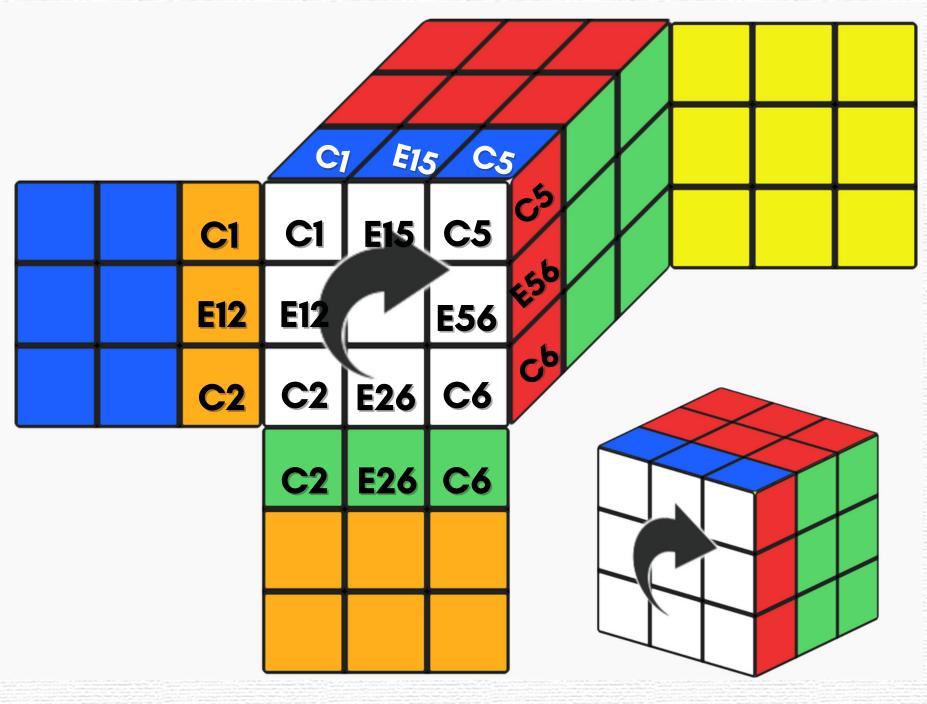


Ação Front



Depois





Ação Front

```
x
Y Z
```

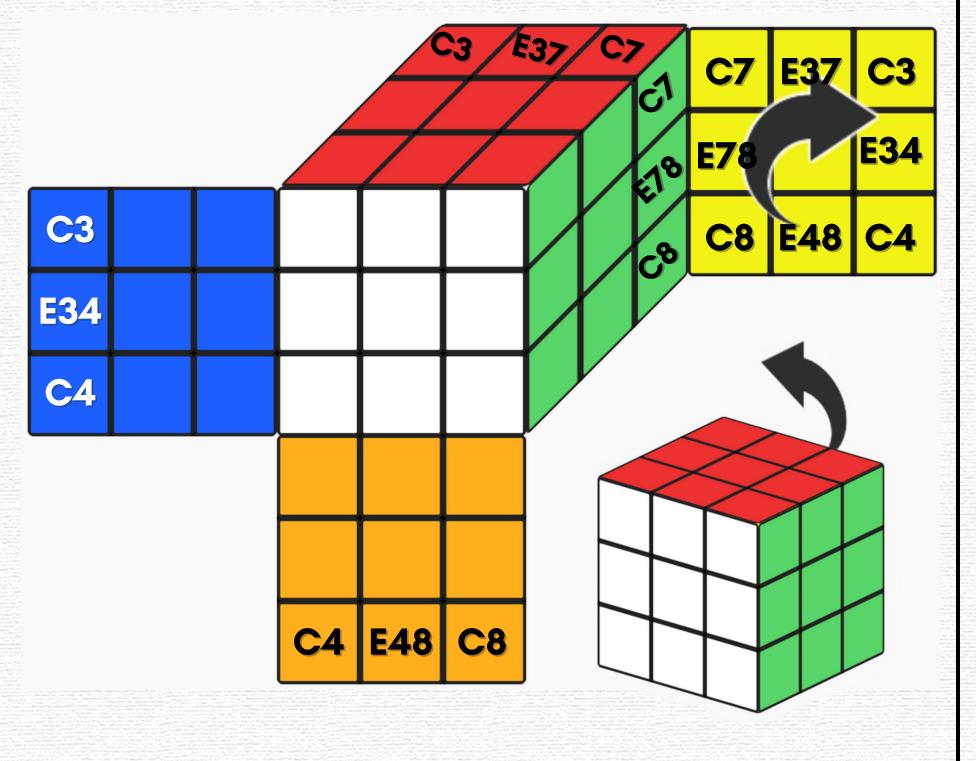
```
(:action F
175
176
             :parameters ()
             :precondition (and)
177
             :effect
178
                (and
179
                    (forall (?x ?y ?z) (when (cube1 ?x ?y ?z) (and (not (cube1 ?x ?y ?z)) (cube5 ?z ?y ?x) )))
180
181
                    (forall (?x ?y ?z) (when (cube5 ?x ?y ?z) (and (not (cube5 ?x ?y ?z)) (cube6 ?z ?y ?x) )))
182
                    (forall (?x ?y ?z) (when (cube6 ?x ?y ?z) (and (not (cube6 ?x ?y ?z)) (cube2 ?z ?y ?x) )))
183
                    (forall (?x ?y ?z) (when (cube2 ?x ?y ?z) (and (not (cube2 ?x ?y ?z)) (cube1 ?z ?y ?x) )))
184
                    (forall (?x ?y) (when (edge15 ?x ?y) (and (not (edge15 ?x ?y)) (edge56 ?y ?x))))
185
186
                    (forall (?y ?z) (when (edge56 ?y ?z) (and (not (edge56 ?y ?z)) (edge26 ?z ?y))))
                    (forall (?x ?y) (when (edge26 ?x ?y) (and (not (edge26 ?x ?y)) (edge12 ?y ?x))))
187
188
                    (forall (?y ?z) (when (edge12 ?y ?z) (and (not (edge12 ?y ?z)) (edge15 ?z ?y))))
189
190
```

Ação Front Reverse

```
(:action Frev
192
             :parameters ()
193
             :precondition (and)
194
             :effect
195
                (and
196
                    (forall (?x ?y ?z) (when (cube1 ?x ?y ?z) (and (not (cube1 ?x ?y ?z)) (cube2 ?z ?y ?x) ))
197
                    (forall (?x ?y ?z) (when (cube2 ?x ?y ?z) (and (not (cube2 ?x ?y ?z)) (cube6 ?z ?y ?x) ))
198
                    (forall (?x ?y ?z) (when (cube6 ?x ?y ?z) (and (not (cube6 ?x ?y ?z)) (cube5 ?z ?y ?x) ))
199
200
                    (forall (?x ?y ?z) (when (cube5 ?x ?y ?z) (and (not (cube5 ?x ?y ?z)) (cube1 ?z ?y ?x) ))
201
202
                    (forall (?x ?y) (when (edge15 ?x ?y) (and (not (edge15 ?x ?y)) (edge12 ?y ?x))))
203
                    (forall (?y ?z) (when (edge56 ?y ?z) (and (not (edge56 ?y ?z)) (edge15 ?z ?y))))
204
                    (forall (?x ?y) (when (edge26 ?x ?y) (and (not (edge26 ?x ?y)) (edge56 ?y ?x))))
                    (forall (?y ?z) (when (edge12 ?y ?z) (and (not (edge12 ?y ?z)) (edge26 ?z ?y))))
205
206
207
```

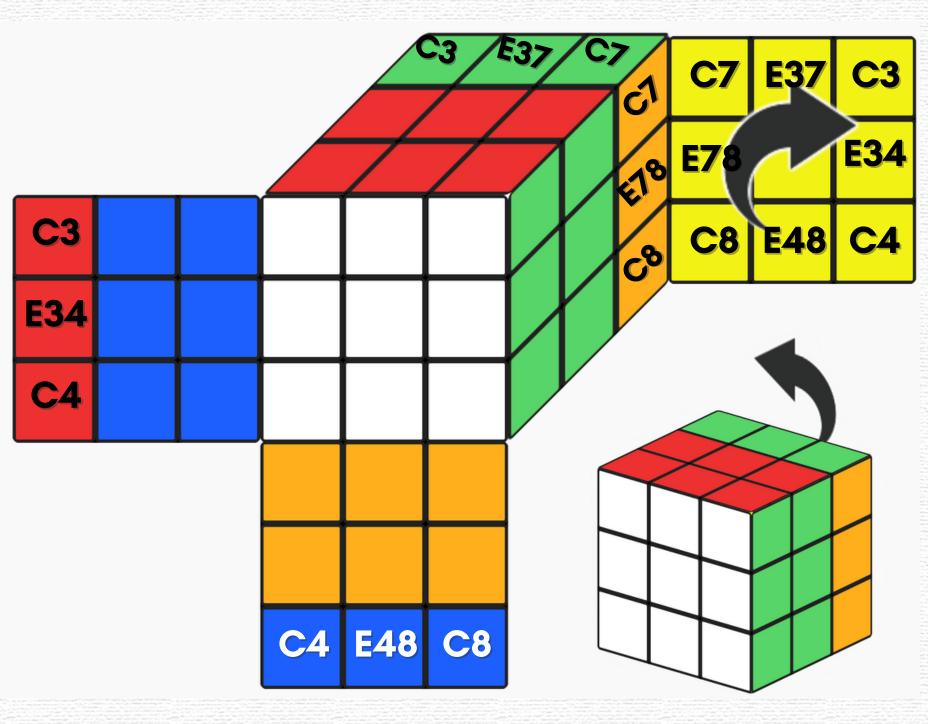
Ação Bottom

Antes



Depois





Ação Bottom

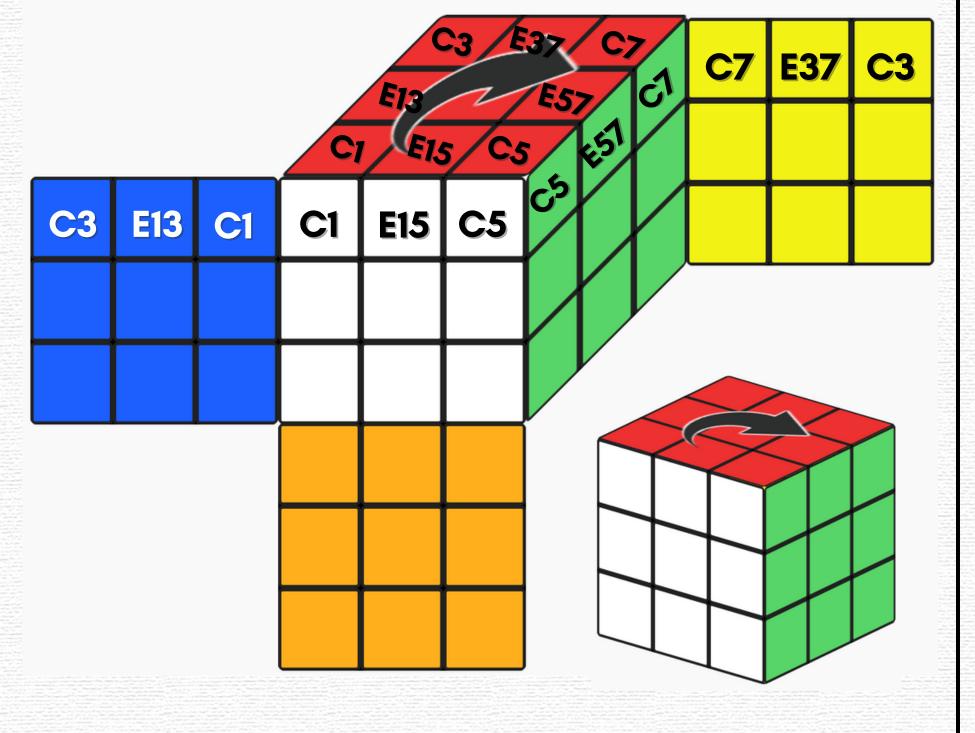
```
(:action B
209
             :parameters ()
210
             :precondition (and)
211
212
             :effect
                (and
213
214
                    (forall (?x ?y ?z) (when (cube3 ?x ?y ?z) (and (not (cube3 ?x ?y ?z)) (cube4 ?z ?y ?x) )))
215
                    (forall (?x ?y ?z) (when (cube7 ?x ?y ?z) (and (not (cube7 ?x ?y ?z)) (cube3 ?z ?y ?x) )))
216
                    (forall (?x ?y ?z) (when (cube8 ?x ?y ?z) (and (not (cube8 ?x ?y ?z)) (cube7 ?z ?y ?x) )))
217
                    (forall (?x ?y ?z) (when (cube4 ?x ?y ?z) (and (not (cube4 ?x ?y ?z)) (cube8 ?z ?y ?x) )))
218
219
                    (forall (?x ?y) (when (edge37 ?x ?y) (and (not (edge37 ?x ?y)) (edge34 ?y ?x))))
220
                    (forall (?y ?z) (when (edge78 ?y ?z) (and (not (edge78 ?y ?z)) (edge37 ?z ?y))))
221
                    (forall (?x ?y) (when (edge48 ?x ?y) (and (not (edge48 ?x ?y)) (edge78 ?y ?x))))
222
                    (forall (?y ?z) (when (edge34 ?y ?z) (and (not (edge34 ?y ?z)) (edge48 ?z ?y))))
223
224
```

Ação Bottom Reverse

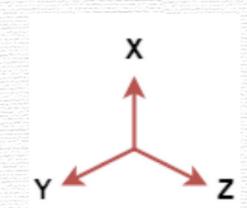
```
(:action Brev
226
             :parameters ()
227
             :precondition (and)
228
             :effect
229
                (and
230
231
                    (forall (?x ?y ?z) (when (cube3 ?x ?y ?z) (and (not (cube3 ?x ?y ?z)) (cube7 ?z ?y ?x) )))
232
                    (forall (?x ?y ?z) (when (cube7 ?x ?y ?z) (and (not (cube7 ?x ?y ?z)) (cube8 ?z ?y ?x) )))
233
                    (forall (?x ?y ?z) (when (cube8 ?x ?y ?z) (and (not (cube8 ?x ?y ?z)) (cube4 ?z ?y ?x) )))
                    (forall (?x ?y ?z) (when (cube4 ?x ?y ?z) (and (not (cube4 ?x ?y ?z)) (cube3 ?z ?y ?x) )))
234
235
236
                    (forall (?x ?y) (when (edge37 ?x ?y) (and (not (edge37 ?x ?y)) (edge78 ?y ?x))))
237
                    (forall (?y ?z) (when (edge78 ?y ?z) (and (not (edge78 ?y ?z)) (edge48 ?z ?y))))
238
                    (forall (?x ?y) (when (edge48 ?x ?y) (and (not (edge48 ?x ?y)) (edge34 ?y ?x))))
239
                    (forall (?y ?z) (when (edge34 ?y ?z) (and (not (edge34 ?y ?z)) (edge37 ?z ?y))))
240
241
```

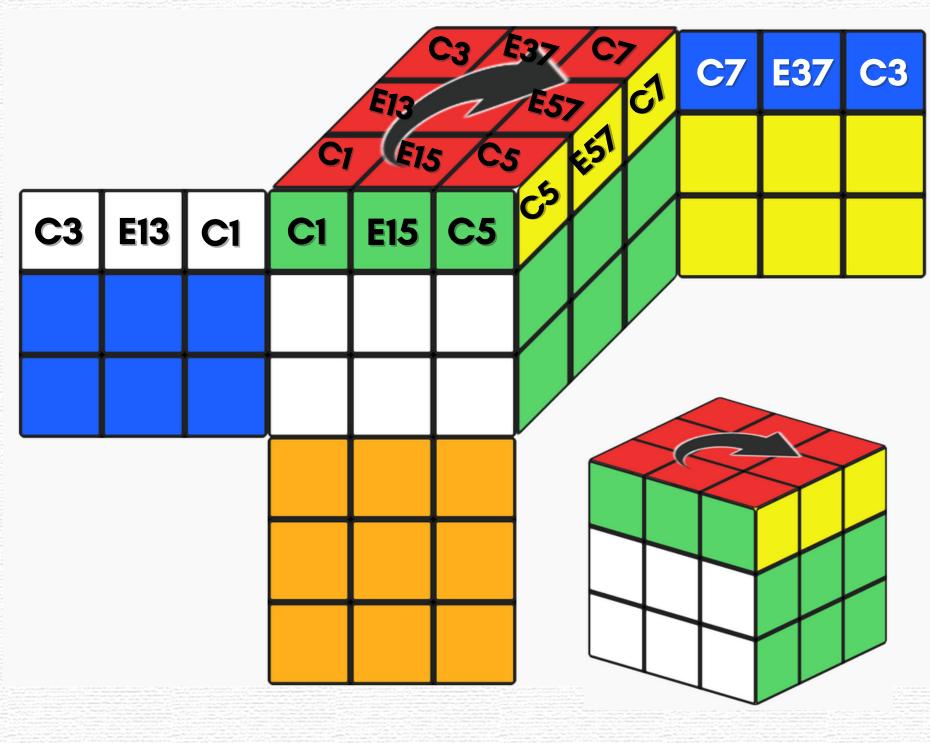
Ação Up

Antes



Depois





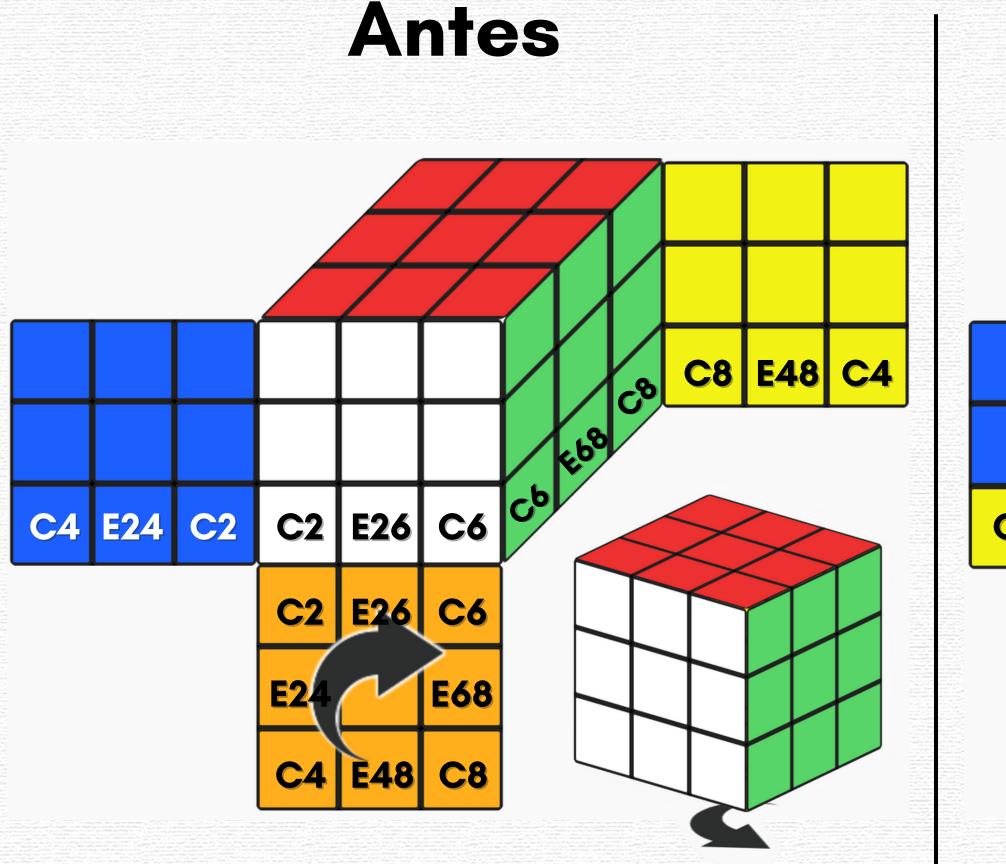
Ação Up

```
141
            (:action U
142
             :parameters ()
143
             :precondition (and)
144
             :effect
145
                (and
146
                    (forall (?x ?y ?z) (when (cube1 ?x ?y ?z) (and (not (cube1 ?x ?y ?z)) (cube3 ?x ?z ?y))))
147
                    (forall (?x ?y ?z) (when (cube5 ?x ?y ?z) (and (not (cube5 ?x ?y ?z)) (cube1 ?x ?z ?y))))
148
                    (forall (?x ?y ?z) (when (cube7 ?x ?y ?z) (and (not (cube7 ?x ?y ?z)) (cube5 ?x ?z ?y))))
149
                    (forall (?x ?y ?z) (when (cube3 ?x ?y ?z) (and (not (cube3 ?x ?y ?z)) (cube7 ?x ?z ?y))))
150
151
                    (forall (?x ?y) (when (edge15 ?x ?y) (and (not (edge15 ?x ?y)) (edge13 ?x ?y))))
152
                    (forall (?x ?z) (when (edge57 ?x ?z) (and (not (edge57 ?x ?z)) (edge15 ?x ?z))))
153
                    (forall (?x ?y) (when (edge37 ?x ?y) (and (not (edge37 ?x ?y)) (edge57 ?x ?y))))
154
                    (forall (?x ?z) (when (edge13 ?x ?z) (and (not (edge13 ?x ?z)) (edge37 ?x ?z))))
155
156
```

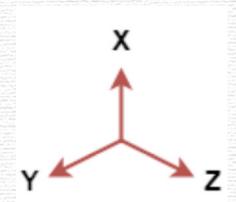
Ação Up Reverse

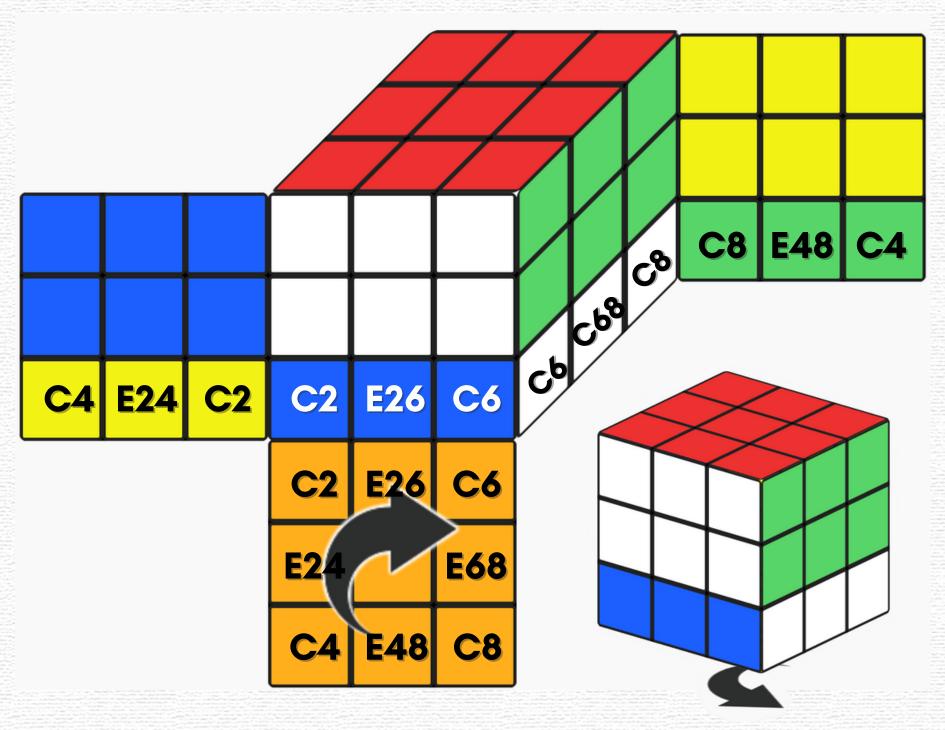
```
(:action Urev
158
             :parameters ()
159
             :precondition (and)
160
             :effect
161
                (and
162
                    (forall (?x ?y ?z) (when (cube1 ?x ?y ?z) (and (not (cube1 ?x ?y ?z)) (cube5 ?x ?z ?y))))
163
164
                    (forall (?x ?y ?z) (when (cube5 ?x ?y ?z) (and (not (cube5 ?x ?y ?z)) (cube7 ?x ?z ?y))))
                    (forall (?x ?y ?z) (when (cube7 ?x ?y ?z) (and (not (cube7 ?x ?y ?z)) (cube3 ?x ?z ?y))))
165
                    (forall (?x ?y ?z) (when (cube3 ?x ?y ?z) (and (not (cube3 ?x ?y ?z)) (cube1 ?x ?z ?y))))
166
167
168
                    (forall (?x ?y) (when (edge15 ?x ?y) (and (not (edge15 ?x ?y)) (edge57 ?x ?y))))
                    (forall (?x ?z) (when (edge57 ?x ?z) (and (not (edge57 ?x ?z)) (edge37 ?x ?z))))
169
170
                    (forall (?x ?y) (when (edge37 ?x ?y) (and (not (edge37 ?x ?y)) (edge13 ?x ?y))))
171
                    (forall (?x ?z) (when (edge13 ?x ?z) (and (not (edge13 ?x ?z)) (edge15 ?x ?z))))
172
173
```

Ação Down









Ação Down

```
(:action D
107
             :parameters ()
108
             :precondition (and)
109
110
              :effect
111
                (and
                    (forall (?x ?y ?z) (when (cube2 ?x ?y ?z) (and (not (cube2 ?x ?y ?z)) (cube6 ?x ?z ?y))))
112
113
                    (forall (?x ?y ?z) (when (cube6 ?x ?y ?z) (and (not (cube6 ?x ?y ?z)) (cube8 ?x ?z ?y))))
114
                    (forall (?x ?y ?z) (when (cube8 ?x ?y ?z) (and (not (cube8 ?x ?y ?z)) (cube4 ?x ?z ?y))))
115
                    (forall (?x ?y ?z) (when (cube4 ?x ?y ?z) (and (not (cube4 ?x ?y ?z)) (cube2 ?x ?z ?y))))
116
117
                    (forall (?x ?y) (when (edge26 ?x ?y) (and (not (edge26 ?x ?y)) (edge68 ?x ?y))))
118
                    (forall (?x ?z) (when (edge68 ?x ?z) (and (not (edge68 ?x ?z)) (edge48 ?x ?z))))
119
                    (forall (?x ?y) (when (edge48 ?x ?y) (and (not (edge48 ?x ?y)) (edge24 ?x ?y))))
                    (forall (?x ?z) (when (edge24 ?x ?z) (and (not (edge24 ?x ?z)) (edge26 ?x ?z))))
120
121
122
```

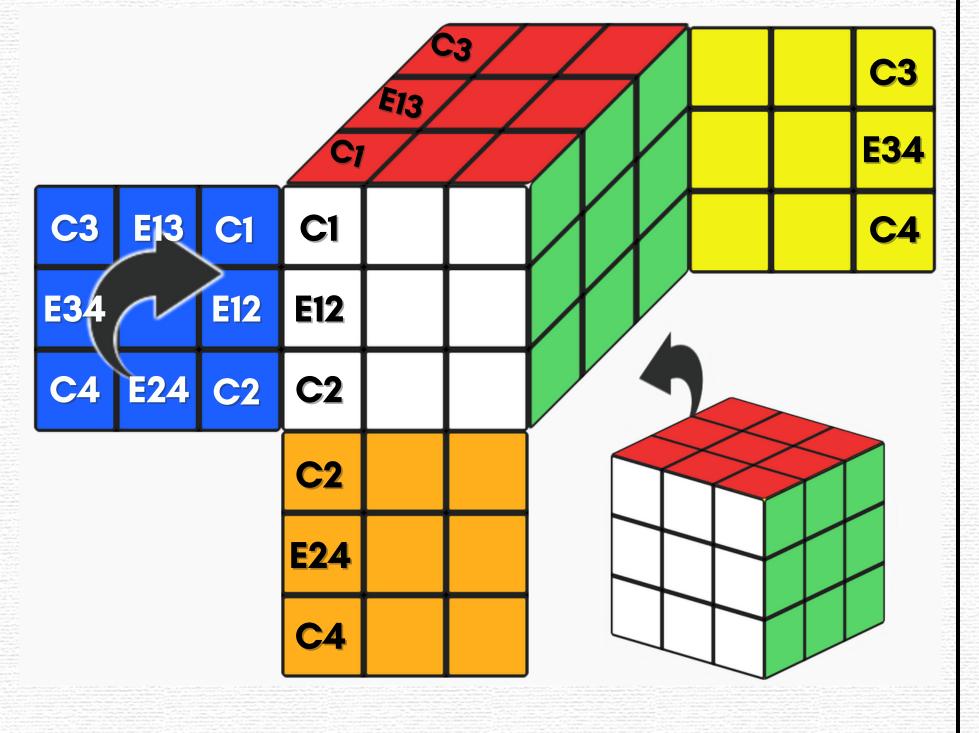
Ação Down Reverse

Χ

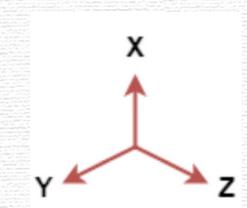
```
124
            (:action Drev
              :parameters ()
125
126
              :precondition (and)
              :effect
127
                (and
128
129
                     (forall (?x ?y ?z) (when (cube2 ?x ?y ?z) (and (not (cube2 ?x ?y ?z)) (cube4 ?x ?z ?y))))
                    (forall (?x ?y ?z) (when (cube4 ?x ?y ?z) (and (not (cube4 ?x ?y ?z)) (cube8 ?x ?z ?y))))
130
131
                    (forall (?x ?y ?z) (when (cube8 ?x ?y ?z) (and (not (cube8 ?x ?y ?z)) (cube6 ?x ?z ?y))))
132
                    (forall (?x ?y ?z) (when (cube6 ?x ?y ?z) (and (not (cube6 ?x ?y ?z)) (cube2 ?x ?z ?y))))
133
134
                    (forall (?x ?y) (when (edge26 ?x ?y) (and (not (edge26 ?x ?y)) (edge24 ?x ?y))))
135
                    (forall (?x ?z) (when (edge68 ?x ?z) (and (not (edge68 ?x ?z)) (edge26 ?x ?z))))
136
                    (forall (?x ?y) (when (edge48 ?x ?y) (and (not (edge48 ?x ?y)) (edge68 ?x ?y))))
                    (forall (?x ?z) (when (edge24 ?x ?z) (and (not (edge24 ?x ?z)) (edge48 ?x ?z))))
137
138
139
```

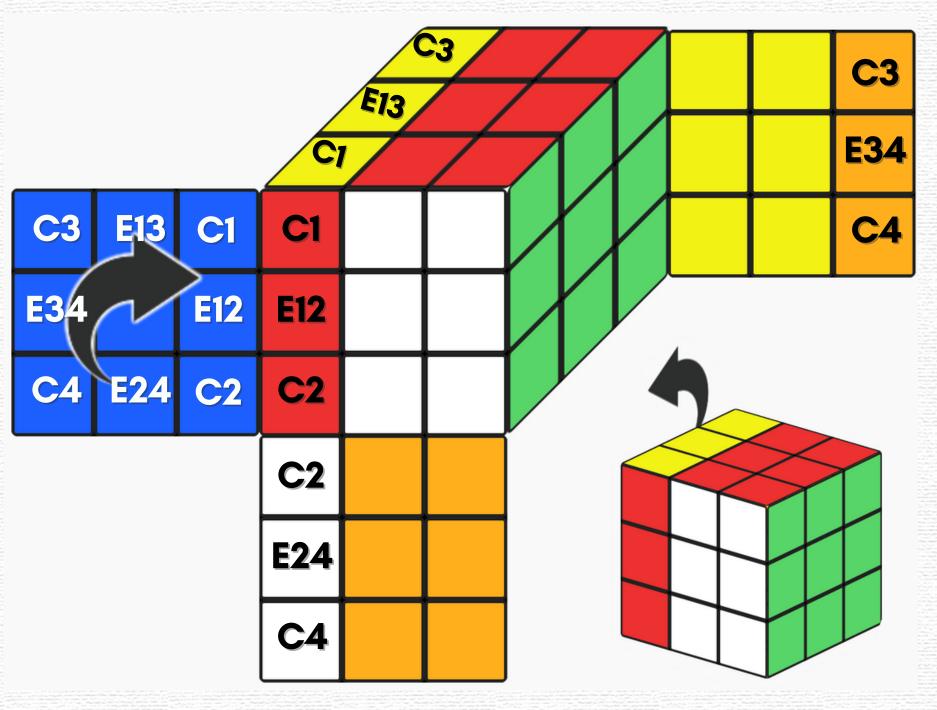
Ação Left

Antes



Depois





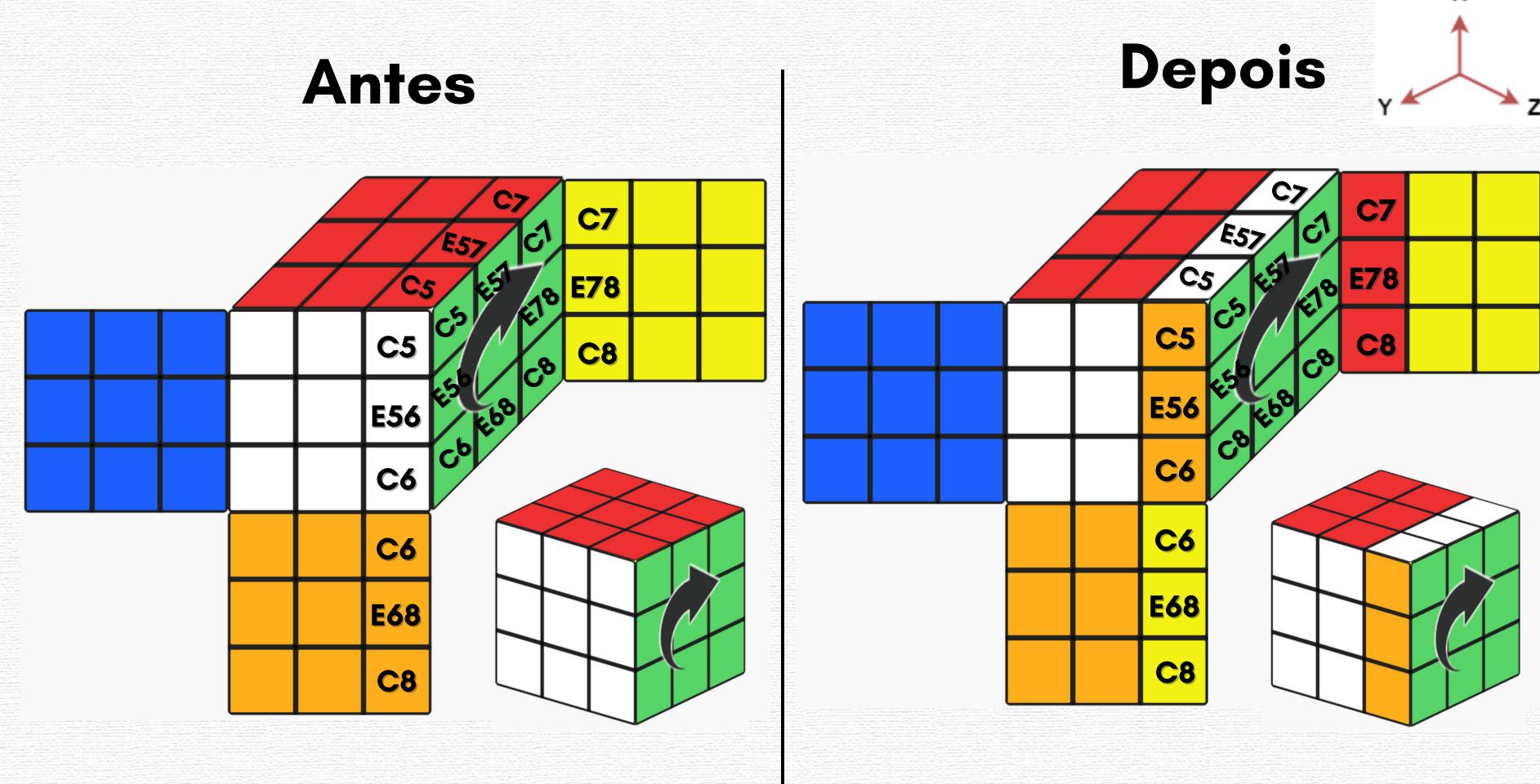
Ação Left

```
64
           (:action L
            :parameters ()
65
            :precondition (and)
66
            :effect
67
               (and
68
                    (forall (?x ?y ?z) (when (cube1 ?x ?y ?z)
69
                        (and (not (cube1 ?x ?y ?z)) (cube2 ?y ?x ?z))))
70
                   (forall (?x ?y ?z) (when (cube3 ?x ?y ?z)
71
                        (and (not (cube3 ?x ?y ?z)) (cube1 ?y ?x ?z))))
72
                    (forall (?x ?y ?z) (when (cube4 ?x ?y ?z)
73
74
                        (and (not (cube4 ?x ?y ?z)) (cube3 ?y ?x ?z))))
                   (forall (?x ?y ?z) (when (cube2 ?x ?y ?z)
75
                        (and (not (cube2 ?x ?y ?z)) (cube4 ?y ?x ?z))))
76
77
                   (forall (?x ?z) (when (edge13 ?x ?z)
78
                        (and (not (edge13 ?x ?z)) (edge12 ?x ?z))))
79
                    (forall (?y ?z) (when (edge34 ?y ?z)
80
                        (and (not (edge34 ?y ?z)) (edge13 ?y ?z))))
81
                   (forall (?x ?z) (when (edge24 ?x ?z)
82
                        (and (not (edge24 ?x ?z)) (edge34 ?x ?z))))
83
                    (forall (?y ?z) (when (edge12 ?y ?z)
84
                       (and (not (edge12 ?y ?z)) (edge24 ?y ?z))))
85
86
87
88
```

Ação Left Reverse

```
(:action Lrev
90
91
             :parameters ()
             :precondition (and)
92
             :effect
93
94
                (and
                    (forall (?x ?y ?z) (when (cube1 ?x ?y ?z) (and (not (cube1 ?x ?y ?z)) (cube3 ?y ?x ?z))))
95
96
                    (forall (?x ?y ?z) (when (cube3 ?x ?y ?z) (and (not (cube3 ?x ?y ?z)) (cube4 ?y ?x ?z))))
                    (forall (?x ?y ?z) (when (cube4 ?x ?y ?z) (and (not (cube4 ?x ?y ?z)) (cube2 ?y ?x ?z))))
97
                    (forall (?x ?y ?z) (when (cube2 ?x ?y ?z) (and (not (cube2 ?x ?y ?z)) (cube1 ?y ?x ?z))))
98
99
                    (forall (?x ?z) (when (edge13 ?x ?z) (and (not (edge13 ?x ?z)) (edge34 ?x ?z))))
100
101
                    (forall (?y ?z) (when (edge34 ?y ?z) (and (not (edge34 ?y ?z)) (edge24 ?y ?z))))
102
                    (forall (?x ?z) (when (edge24 ?x ?z) (and (not (edge24 ?x ?z)) (edge12 ?x ?z))))
                    (forall (?y ?z) (when (edge12 ?y ?z) (and (not (edge12 ?y ?z)) (edge13 ?y ?z))))
103
104
105
```

Ação Right



Ação Right

```
(:action R
28
            :parameters ()
29
            :precondition (and)
30
            :effect
31
               (and
32
33
                   (forall (?x ?y ?z) (when (cube5 ?x ?y ?z) (and (not (cube5 ?x ?y ?z)) (cube7 ?y ?x ?z))))
34
                   (forall (?x ?y ?z) (when (cube7 ?x ?y ?z) (and (not (cube7 ?x ?y ?z)) (cube8 ?y ?x ?z))))
35
                   (forall (?x ?y ?z) (when (cube8 ?x ?y ?z) (and (not (cube8 ?x ?y ?z)) (cube6 ?y ?x ?z))))
36
                   (forall (?x ?y ?z) (when (cube6 ?x ?y ?z) (and (not (cube6 ?x ?y ?z)) (cube5 ?y ?x ?z))))
37
38
                   (forall (?x ?z) (when (edge57 ?x ?z) (and (not (edge57 ?x ?z)) (edge78 ?x ?z))))
39
                   (forall (?y ?z) (when (edge78 ?y ?z) (and (not (edge78 ?y ?z)) (edge68 ?y ?z))))
40
                   (forall (?x ?z) (when (edge68 ?x ?z) (and (not (edge68 ?x ?z)) (edge56 ?x ?z))))
                   (forall (?y ?z) (when (edge56 ?y ?z) (and (not (edge56 ?y ?z)) (edge57 ?y ?z))))
41
42
43
```

Ação Right Reverse

```
(:action Rrev
46
            :parameters ()
47
            :precondition (and)
48
            :effect
49
               (and
50
                   (forall (?x ?y ?z) (when (cube5 ?x ?y ?z) (and (not (cube5 ?x ?y ?z)) (cube6 ?y ?x ?z))))
51
52
                   (forall (?x ?y ?z) (when (cube6 ?x ?y ?z) (and (not (cube6 ?x ?y ?z)) (cube8 ?y ?x ?z))))
                   (forall (?x ?y ?z) (when (cube8 ?x ?y ?z) (and (not (cube8 ?x ?y ?z)) (cube7 ?y ?x ?z))))
53
                   (forall (?x ?y ?z) (when (cube7 ?x ?y ?z) (and (not (cube7 ?x ?y ?z)) (cube5 ?y ?x ?z))))
54
55
                   (forall (?x ?z) (when (edge57 ?x ?z) (and (not (edge57 ?x ?z)) (edge56 ?x ?z))))
56
                   (forall (?y ?z) (when (edge78 ?y ?z) (and (not (edge78 ?y ?z)) (edge57 ?y ?z))))
57
                   (forall (?x ?z) (when (edge68 ?x ?z) (and (not (edge68 ?x ?z)) (edge78 ?x ?z))))
58
59
                   (forall (?y ?z) (when (edge56 ?y ?z) (and (not (edge56 ?y ?z)) (edge68 ?y ?z))))
60
61
```

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