

Supplementary File

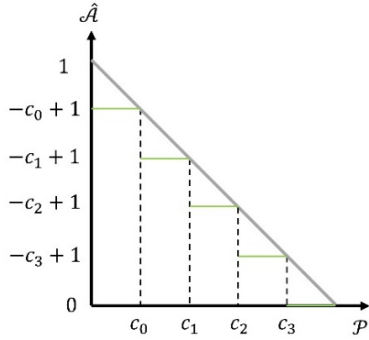


Fig. S1. Relationship between $\hat{\mathcal{A}}$ and \mathcal{P} in Eq. 8.

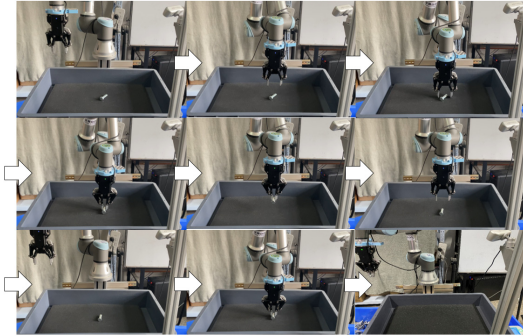


Fig. S2 A snapshot of restorative sampling of UR3's



Fig. S3 Six kinds of unseen objects.

Algorithm A1 Restorative Sampling

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1: Capture  $I_i$  and obtain  $\mathcal{O}_i$ .
2: Obtain  $\mathcal{G}_i$  given  $\mathcal{O}_i$ .
3: // Perform restorative manipulation  $M_i$  next.
4: Gripper moves first to  $T_i^l$  and rotates  $\phi_i$  around Z-axis.
5: Gripper moves to  $T_i$  along  $\mathcal{T}_i$ .
6: Close Gripper.
7: if the grasp is successful then
8:   Gripper moves backward to  $T_i^l$  along  $\mathcal{T}_i^-$ .
9:   if the object is held during the return then
10:    Places the object back to  $T_i$  along  $\mathcal{T}_i$ .
11:    Set  $g_i = 1$ , capture  $\mathcal{O}_i^+$ , and calculate  $\mathcal{S}_i$ .
12:    Perform  $\mathcal{G}_i$  again to take the object to its goal place.
13:   else
14:    Set  $g_i = 0$  and  $\mathcal{S}_i = 0$ .
15:   end if
16: else
17:   Set  $g_i = 0$  and  $\mathcal{S}_i = 0$ .
18: end if
19: Robot goes backs to its home.
20: Store  $(\mathcal{O}_i, \mathcal{G}_i, \mathcal{S}_i)$  into  $D$ .

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Algorithm A2 Training of FAGL

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1: Initialize RA-Net  $Q_\theta$  and Target RA-Net  $Q_{\theta^-}$ .
2: Set hyperparameters  $\alpha = 10^{-3}$ ,  $B=16$ ,  $step_{max} = 2500$ ,  $\epsilon = 0.5$ ,  $\tau = 3$ ,  $step = 0$ , and  $D = \emptyset$ .
3: while  $step < step_{max}$  do
4:   Obtain  $\mathcal{O}_i$ .
5:    $\epsilon = \text{explore\_schedule}()$ ,  $p = \text{rand}()$ .
6:    $\mathcal{G}_i = \begin{cases} \text{argmax}_{\mathcal{G}} Q_\theta(\mathcal{O}, \mathcal{G}) & \text{if } p \leq 1 - \epsilon \\ \mathcal{G} & \text{if } p > 1 - \epsilon \end{cases}$ 
7:   Obtain  $\mathcal{A}_i$ ,  $g_i$ , and  $\mathcal{S}_i(\mathcal{A}_i, g_i)$ .
8:    $D = D \cup \{(\mathcal{O}_i, \mathcal{G}_i, \mathcal{S}_i)\}$ .
9:    $step = step + 1$ .
10:  if  $|D| > B$  then
11:    Random sample  $\{(\mathcal{O}_i, \mathcal{G}_i, \mathcal{S}_i)\}_{i \in [0, B]}$  in  $D$ .
12:    Update  $Q_\theta(\mathcal{O}, \mathcal{G})$  on  $\{(\mathcal{O}_i, \mathcal{G}_i, \mathcal{S}_i)\}_{i \in [0, B]}$ .
13:  end if
14:  if  $step \% \tau == 0$  then
15:     $\theta^- = \theta$ .
16:  end if
17: end while
18:  $Q_\theta^*(\mathcal{O}, \mathcal{G}) = Q_\theta(\mathcal{O}, \mathcal{G})$ .
19: Output: optimal action-value function  $Q_\theta^*(\mathcal{O}, \mathcal{G})$ .

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TABLE S-I
A TABLE OF ABBREVIATIONS

\mathcal{P}	Disturbance by a grasp (DG) to the environment
\mathcal{G}	A grasp
$T = (x, y, z)$	The position of a grasp
ϕ	rotation around Z-axis
ω	Initial distance between the two fingers of a gripper
I_{hc}^-	Color heightmap of the scene before restorative manipulation
I_{hc}^+	Color heightmap of the scene after restorative manipulation
\mathcal{M}	A restorative manipulation
\mathcal{B}	An OTSU operation
\mathcal{A}	An antipodal degree of a grasp (ADG)
\mathcal{O}	Observation space
\mathcal{G}	Robotic grasp space
\mathcal{R}	Feedback (rewards)
ρ	A transition probability
\mathcal{H}	The maximum step till termination
$\hat{\mathcal{A}}$	A discrete version of ADG
\mathcal{T}	Trajectory \mathcal{T}
\mathcal{T}^-	The inverse trajectory of \mathcal{T}
H	Weight of I_{hc}^- And I_{hc}^+
W	Height of I_{hc}^- and I_{hc}^+
I	An RGB-D image
I_c	An RGB image
I_d	A depth map
g	Grasp flag
\mathcal{C}	Destruction tolerance
r	A primary basic reward
e	A secondary basic reward
Q	A multi-channel grasp affordance
q	Affordance planes
I_{hci}	Color heightmap images
I_{hdi}	Depth heightmap images
\mathcal{V}_{sd}	A shallow depth feature
\mathcal{V}_{sc}	A shallow color feature
\mathcal{V}_m	A latent feature

TABLE S-II
ABLATION EXPERIMENT ON FAGL

Scenarios				Single object			Scattered objects			Cluttered objects		
Method	Fusion module	Decoder module	Augmented feedback	GSR	$AADG$	F	GSR	$AADG$	F	GSR	$AADG$	F
FAGL(a)	×	×	×	0.55	0.31	0.43	0.54	0.18	0.36	0.39	0.11	0.25
FAGL(b)	√	×	×	0.84	0.32	0.58	0.76	0.24	0.50	0.69	0.15	0.42
FAGL(c)	√	√	×	0.92	0.29	0.61	0.87	0.23	0.55	0.80	0.13	0.47
FAGL	√	√	√	0.93	0.89	0.91	0.87	0.66	0.77	0.82	0.56	0.69