# KEA: Keeping Exploration Alive by Proactively Coordinating Exploration Strategies

#### **Authors:**

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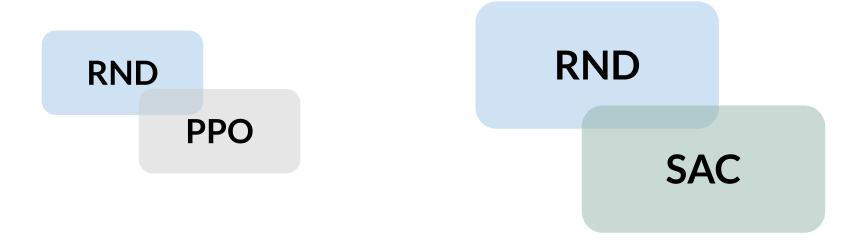




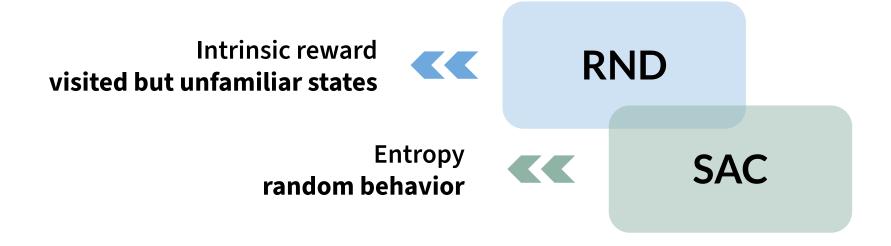




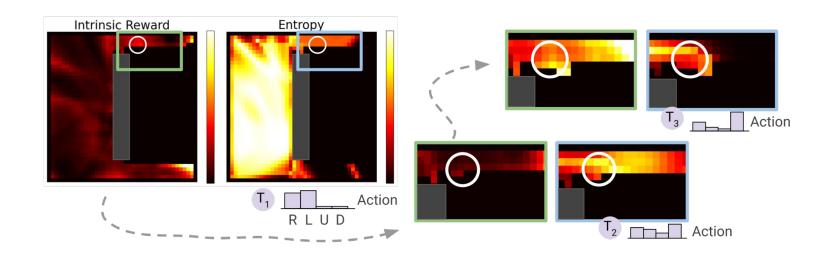
#### **SAC + Novelty-based Exploration**



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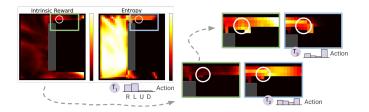
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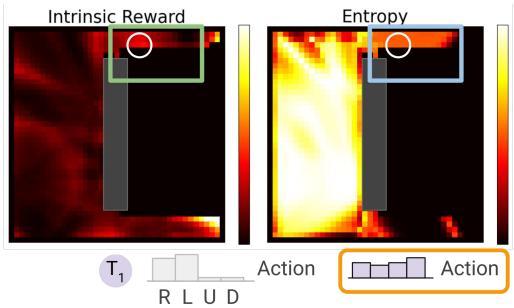


#### **KEA**

Familiar regions: Revisit and refine promising actions.

Unfamiliar regions: Make bold, random moves.

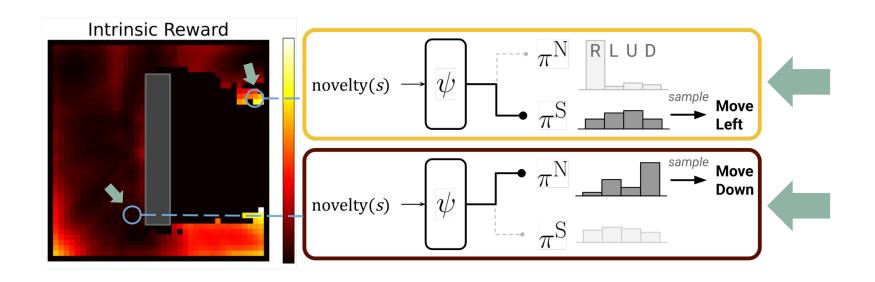




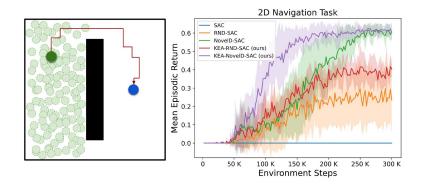
#### **KEA**

 $\pi^{N}$ : Policy from the novelty-augmented agent

 $\pi^{s}$ : Policy from the standard agent



### **Experimental Results**

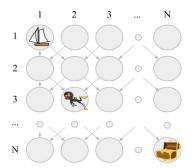


Method	Walker Run Sparse	Cheetah Run Sparse	Reacher Hard Sparse
SAC	$0. \pm 0.$	$0. \pm 0.$	$715.17 \pm 216.57$
RND-SAC	$287.65 \pm 334.12$ <b>629.74</b> $\pm$ <b>196.75</b>	$512.02 \pm 466.26$	$790.32 \pm 143.26$
KEA-RND-SAC (ours)		$773.76 \pm 162.74$	$874.61 \pm 94.58$
NovelD-SAC	$553.26 \pm 191.03$	647.29 ± 382.58	<b>860.40</b> ± <b>76.15</b>
KEA-NovelD-SAC (ours)	<b>706.47</b> $\pm$ <b>389.23</b>	<b>734.67</b> ± <b>316.95</b>	837.12 ± 68.95







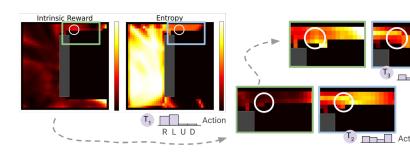


Algorithm	DeepSea 10	DeepSea 14	DeepSea 20	DeepSea 24	DeepSea 30
DeRL-A2C (Schäfer et al., 2021)	$0.98 \pm 0.10$	$0.65 \pm 0.23$	$0.42 \pm 0.16$ $-0.01 \pm 0.01$ $0.40 \pm 0.08$	$0.07 \pm 0.10$	$0.09 \pm 0.08$
DeRL-PPO (Schäfer et al., 2021)	$0.61 \pm 0.20$	$0.92 \pm 0.18$		$0.63 \pm 0.27$	-0.01 \pm 0.01
DeRL-DQN (Schäfer et al., 2021)	$0.98 \pm 0.09$	$0.95 \pm 0.17$		$0.53 \pm 0.27$	$0.10 \pm 0.10$
SOFE-A2C (Castanyer et al., 2024)	$0.94 \pm 0.19$	$0.45 \pm 0.31$	$0.11 \pm 0.25$	$0.08 \pm 0.14$	$0.04 \pm 0.09$
SOFE-PPO (Castanyer et al., 2024)	$0.77 \pm 0.29$	$0.67 \pm 0.33$	$0.13 \pm 0.09$	$0.07 \pm 0.15$	$0.09 \pm 0.23$
SOFE-DQN (Castanyer et al., 2024)	$0.97 \pm 0.29$	$0.78 \pm 0.21$	$0.70 \pm 0.28$	$0.65 \pm 0.26$	$0.42 \pm 0.33$
SAC	$0.98 \pm 0.01$	$0.69 \pm 0.23$	$0.00 \pm 0.00$	$0.00 \pm 0.00$	$0.00 \pm 0.00$
RND-SAC	$0.99 \pm 0.01$	$0.92 \pm 0.13$	$0.89 \pm 0.09$	$0.67 \pm 0.35$	$0.35 \pm 0.44$
KEA-RND-SAC (ours)	$0.99 \pm 0.01$	$0.99 \pm 0.01$	$0.92 \pm 0.05$	$0.81 \pm 0.18$	$0.54 \pm 0.32$

## **KEA: Keeping Exploration Alive by Proactively Coordinating Exploration Strategies**

Analyze a potential issue when combining SAC with novelty-based exploration





KEA proactively coordinates exploration strategies to improve exploration efficiency



