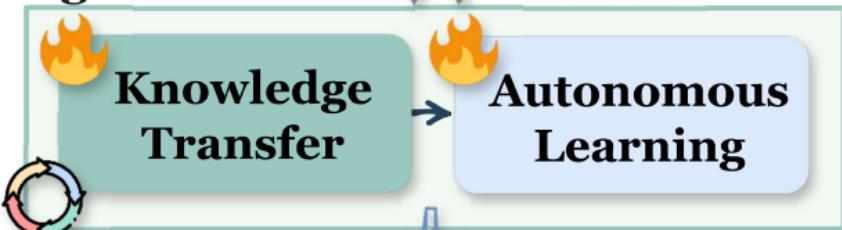


MAS

## Failure Logs

To make pizza, together with other ingredients, Kimber needs 10 cups of water, 16 cups of flour, and 1/2 times as many teaspoons of salt as the number of cups of flour. Calculate the combined total number of cups of water, flour, and teaspoons of salt that she needs to make the pizza.

AgentAsk



## a. Knowledge Transfer via Supervised Fine-tuning

Failure Logs

$$\begin{array}{rcl} - \times & \langle / \rangle & A \\ + = & & B \\ & & C \end{array}$$



Check

Failure Logs with Asking



SFT

Lightweight



AgentAsk\*

## b. Autonomous Learning via Reinforcement Optimization

Query: To make pizza ... Calculate the combined total number of ...

Mathematician

$$\begin{aligned} \text{Salt} &= \frac{1}{2} \times 16 = 8\text{tsp}; \text{convert using } 1 \text{ cup} = 48\text{tsp} \\ &\Rightarrow 8/48 = \frac{1}{6} \text{ cup}; \text{sum} 10 + 16 + \frac{1}{6} = 26 + \frac{1}{6}. \end{aligned}$$

Type



Cycle

Does the unit teaspoon need to be converted to cup?  
 AgentAsk To\_agent

Output

Report the combined requirement by unit:  
 $10+16=26$  cups and 8 teaspoons of salt.  
 Let T be the combined total:  $T=10+16+8=34$   
 The answear is 34.

State Update

System Reward

Edge Reward

### Learning of E-GRPO

$$\begin{aligned} \mathcal{J}_{E\text{-GRPO}}(\theta) &= \mathbb{E}_t[\min(\rho_t A_t^{\text{loc}}, \text{clip}(\rho_t, 1 \pm \epsilon) A_t^{\text{loc}}) \\ &+ \lambda_R \min(\rho_t A_t^{\text{glob}}, \text{clip}(\rho_t, 1 \pm \epsilon) A_t^{\text{glob}})] \\ &- \beta \mathbb{E}_t KL(\pi_\theta(\cdot | h_t) \| \pi_{\text{ref}}(\cdot | h_t)) \end{aligned}$$