## 1 Exploring Different $\gamma$ Values

The  $\gamma$  parameter sets the desired recall level, and is supposed to be set in practice by practitioners according to task requirement. In our main experiments, which are presented at the body of this work, we targeted at a 0.9 recall level, which is associated with  $\gamma=0.1$ . In this subsection we present results also for targeted recall levels of 0.8 and 0.95.

## 1.1 0.8 Recall

Table 1: Summary of OOD Results for recall level of 0.8 (  $\gamma=0.2)$ 

Model	Camelyon			$\mathbf{FMoW}$		
	Median	Median	$\text{Recall} \geq 90\%$	Median	Median	$\mathrm{Recall} \geq 90\%$
	Min Recall $\uparrow$	Avg Size $\downarrow$	$\operatorname{Pctg}\uparrow$	Min Recall ↑	Avg Size $\downarrow$	$\operatorname{Pctg}\uparrow$
ERM	0.91	1.0	0.75	0.75	1.0	0.42
CDF Pooling- (TrainC)	0.74	0.81	0.38	0.67	0.84	0.05
CDF Pooling- (CVC)	0.67	1.09	0.45	0.72	0.94	0.16
Robust Conformal	0.95	1.77	0.90	0.79	1.00	0.50
SET-COVER	0.91	1.00	0.71	0.89	1.01	0.94

Model	iWildCam					
Model	Median	Median	$\mathrm{Recall} \geq 90\%$			
	Min Recall $\uparrow$	Avg Size $\downarrow$	Pctg↑			
$\mathbf{ERM}$	0.99	1.0	0.71			
CDF Pooling- (TrainC)	0.91	0.91	0.60			
CDF Pooling- (CVC)	0.95	1.01	0.70			
Robust Conformal	0.98	1.31	0.76			
SET-COVER	0.99	1.00	0.71			

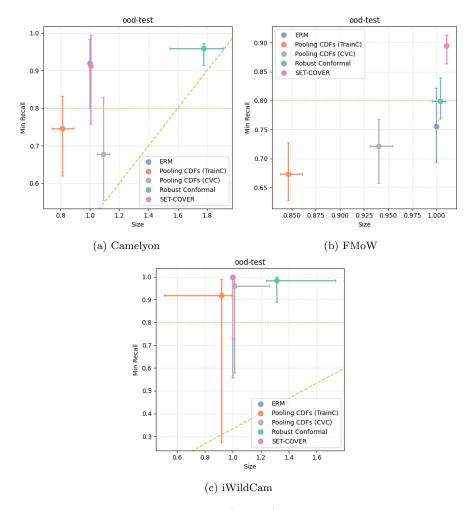


Figure 1: Results for recall target of 0.8 ( $\gamma=0.2$ ). Each figure represents Min-Recall over Avg Set Size cross. y-axis represents min-recall, and x-axis represents average set size. Each cross shows the median and the 25th and 75th percentiles for both metrics across domain. Blue represents ERM predictor, Orange represents Pooling CDFs (TrainC), Grey represents Pooling CDFs (CVC), Green represents robust conformal predictor, and Pink represents SET-COVER. The horizontal solid line represents the 90% recall target value, and dashed yellow diagonal line represents performance of a random predictor.

## $1.2\quad 0.95 \ Recall$

Table 2: Summary of OOD Results for recall level of 0.95 (  $\gamma=0.2)$ 

Model	Camelyon			$\mathbf{F}\mathbf{MoW}$		
	Median	Median	$\mathrm{Recall} \geq 90\%$	Median	Median	$\mathrm{Recall} \geq 90\%$
	Min Recall $\uparrow$	Avg Size $\downarrow$	$\operatorname{Pctg}\uparrow$	Min Recall ↑	Avg Size $\downarrow$	Pctg ↑
$\mathbf{ERM}$	0.91	1.0	0.48	0.75	1.0	0.03
CDF Pooling- (TrainC)	0.95	1.53	0.5	0.90	1.21	0.07
CDF Pooling- (CVC)	0.88	1.39	0.26	0.89	1.29	0.14
Robust Conformal	0.99	1.94	0.93	0.96	2.13	0.64
SET-COVER	0.95	1.15	0.65	0.94	1.22	0.53

Model	$ \begin{aligned}  & \mathbf{iWildCam} \\  & \text{Median} & \text{Median} & \text{Recall} \geq 90\% \end{aligned} $				
	$\operatorname{Min}\operatorname{Recall}\uparrow$	Avg Size $\downarrow$	Pctg↑		
$\mathbf{ERM}$	0.99	1.0	0.70		
CDF Pooling- (TrainC)	0.93	0.94	0.45		
CDF Pooling- (CVC)	0.99	1.14	0.72		
Robust Conformal	0.99	2.34	0.85		
SET-COVER	0.99	1.07	0.77		

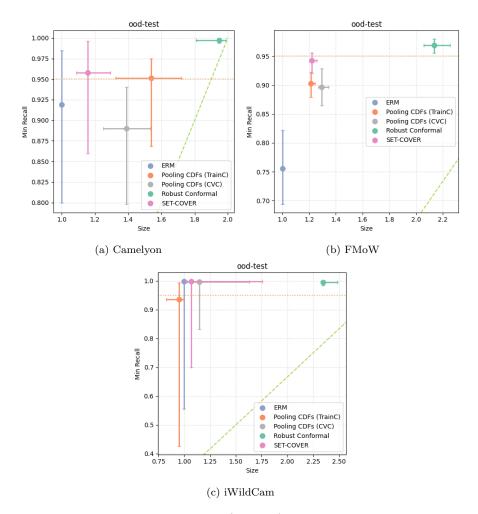


Figure 2: Results for recall target of 0.95 ( $\gamma=0.05$ ). Each figure represents Min-Recall over Avg Set Size cross. y-axis represents min-recall, and x-axis represents average set size. Each cross shows the median and the 25th and 75th percentiles for both metrics across domain. Blue represents ERM predictor, Orange represents Pooling CDFs (TrainC), Grey represents Pooling CDFs (CVC), Green represents robust conformal predictor, and Pink represents SET-COVER. The horizontal solid line represents the 90% recall target value, and dashed yellow diagonal line represents performance of a random predictor.