



Figure 3: Effect of (a) generalization depth, (b) number of iterations, and (c) expansion rate on the F-score of  $\mathcal{M}_{exp}$

TASK	DATE <sub>MID EAST</sub>	DATE <sub>WEB KB</sub>	DATE <sub>ENRON</sub>
$r_{seed}$	<u><b>\d{2}/\d{2}/\d{2}</b></u>	<u><b>\d{2}/\d{2}/\d{2}</b></u>	<u><b>\d{2}/\d{2}/\d{2}</b></u>
$R$	<u><b>\d{1,2}/\d{1,2}/\d{1,2}</b></u>	<u><b>\d{1,2}/\d{1,2}/\d{1,2}</b></u>	<u><b>\d{1,2}/\d{1,2}/\d{1,2}</b></u>
	<u><b>\d{1,2}/\d{1,2}/\d{1,2}</b></u>	<u><b>\d{1,2}/\d{1,2}/\d{1,2}</b></u>	<u><b>\d{1,2}/\d{1,2}/\d{1,2}</b></u>
	<u><b>\d{1,2}/\d{1,2}/\d{1,2}</b></u>	<u><b>\d{1,2}/\d{1,2}/\d{1,2}</b></u>	<u><b>\d{1,2}/\d{1,2}/\d{1,2}</b></u>
	<u><b>\d{1,2}/\d{1,2}/\d{1,2}</b></u>	<u><b>\d{1,2}/\d{1,2}/\d{1,2}</b></u>	<u><b>\d{1,2}/\d{1,2}/\d{1,2}</b></u>
TASK	PHONE <sub>FOR SALE</sub>	COURSE <sub>WEB KB</sub>	PHONE <sub>ENRON</sub>
$r_{seed}$	<u><b>\d{3}/\d{3}/\d{3}</b></u>	<u><b>\d{3}/\d{3}/\d{3}</b></u>	<u><b>\d{3}/\d{3}/\d{3}</b></u>
$R$	<u><b>\d{3}/\d{3}/\d{3}</b></u>	<u><b>\d{3}/\d{3}/\d{3}</b></u>	<u><b>\d{3}/\d{3}/\d{3}</b></u>
	<u><b>\d{3}/\d{3}/\d{3}</b></u>	<u><b>\d{3}/\d{3}/\d{3}</b></u>	<u><b>\d{3}/\d{3}/\d{3}</b></u>
	<u><b>\d{3}/\d{3}/\d{3}</b></u>	<u><b>\d{3}/\d{3}/\d{3}</b></u>	<u><b>\d{3}/\d{3}/\d{3}</b></u>
	<u><b>\d{3}/\d{3}/\d{3}</b></u>	<u><b>\d{3}/\d{3}/\d{3}</b></u>	<u><b>\d{3}/\d{3}/\d{3}</b></u>

Table 4: Top-3 recommended regexes. The generalized units are boldfaced and underlined.

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