

participants from Facebook users in Singapore, the majority of participants eventually enrolled were female working adults which may potentially bias the generalizability of the findings. Lastly, future studies should further examine the effects of unpredictability (i.e., the Random Rewards design) on gain-framed and loss-framed incentives in the same settings.

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