# REDUCING POTENTIALLY INAPPROPRIATE PRESCRIBING FOR OLDER PEOPLE IN PRIMARY CARE: COST-EFFECTIVENESS OF THE OPTI-SCRIPT INTERVENTION

## **Paddy Gillespie**

Health Economics and Policy Analysis Centre, National University of Ireland Galway paddy.gillespie@nuigalway.ie

## Barbara Clyne

HRB Centre for Primary Care Research, Royal College of Surgeons Ireland

Adam Raymakers

Centre for Research on Medical Devices (CURAM), National University of Ireland Galway

Tom Fahey HRB Centre for Primary Care Research, Royal College of Surgeons Ireland

Carmel M. Hughes School of Pharmacy, Queens University Belfast Susan M. Smith HRB Centre for Primary Care Research, Royal College of Surgeons Ireland

on behalf of the OPTI-SCRIPT Study Team

Objectives: This study examines the cost-effectiveness of the OPTI-SCRIPT intervention on potentially inappropriate prescribing in primary care.

Methods: Economic evaluation, using incremental cost-effectiveness and cost utility analyses, conducted alongside a cluster randomized controlled trial of twenty-one general practices and 196 patients, to compare a multifaceted intervention with usual practice in primary care in Ireland. Potentially inappropriate prescriptions (PIPs) were determined by a pharmacist. Incremental costs, PIPs, and quality-adjusted life-years (QALYs) at 12-month follow-up were estimated using multilevel regression. Uncertainty was explored using cost-effectiveness acceptability curves.

**Results:** The intervention was associated with a nonsignificant mean cost increase of  $\in$ 407 (95 percent Cls, -357-1170), a significant mean reduction in PIPs of 0.379 (95 percent Cl, 0.092–0.666), and a nonsignificant mean increase in QALYs of 0.013 (95 percent Cls, -0.016-0.042). The incremental cost per PIP avoided was  $\in$ 1,269 (95 percent Cl, -1400-6302) and the incremental cost per QALY gained was  $\in$ 30,535 (95 percent Cl, -334,846-289,498). The probability of the intervention being cost-effective was 0.602 at a threshold value of  $\in$ 45,000 per QALY gained and was at least 0.845 at threshold values of  $\in$ 2,500 per PIP avoided and higher. **Conclusions:** While the OPTI-SCRIPT intervention was effective in reducing potentially inappropriate prescribing in primary care in Ireland, our findings highlight the uncertainty with respect to its cost-effectiveness. Further studies are required to explore the health and economic implications of interventions targeting potentially inappropriate prescribing.

Keywords: Cost-effectiveness, Randomized controlled trial, Potentially inappropriate prescribing, Primary care

Potentially inappropriate prescribing describes suboptimal prescribing practices that increase the risk of adverse drug events for patients in circumstances where safer, more effective treatment alternatives are available for the condition of interest (1). Within the overall patient population, older people, with their relatively high prevalence of multimorbidity and consequent polypharmacy, are particularly vulnerable to potentially inappropriate prescribing and pose particularly challenging prescribing decisions for healthcare providers (2). Several published tools to assess potentially inappropriate prescribing in older people exist, the majority of which are explicit: for example, by listing drugs that should to be avoided (1). Applying these tools, potentially inappropriate prescribing in older people has been found to be common across healthcare settings and can result in increased morbidity, adverse drug events (ADEs), hospitalizations (2;3), and healthcare costs (4).

In the Irish healthcare setting, potentially inappropriate prescribing in community-dwelling older Irish people has been shown to be associated with increased ADEs, accident and emergency department (A&E) visits, and poorer health-related quality of life (5). Moreover, a recent study estimated that 36 percent of those aged 70 years and over had at least one potentially inappropriate prescription (PIP), resulting in additional healthcare expenditures of €45 million, or 9 percent of overall pharmaceutical expenditures for those aged 70 years and over in Ireland (4).

Within this context, the development of healthcare interventions that target reductions in potentially inappropriate prescribing represent an important public health measure, both in terms of their ability to improve patient health outcomes and to reduce the economic burden on healthcare systems. Such interventions are particularly relevant in primary care where the majority of prescribing of medications takes place. There

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is currently no single interventional strategy that has proved to be most effective, but there is an argument that a multifaceted approach, which combines several techniques within a single intervention, may be likely to be more effective (6;7). To date, a limited number of multifaceted interventions targeting inappropriate prescribing reductions have been evaluated in primary care and report positive findings (8–10). Nonetheless, further evidence on clinical and cost-effectiveness is required before widespread adoption in primary care can be recommended.

The OPTI-SCRIPT (Optimizing Prescribing for Older People in Primary Care: A Cluster Randomised Controlled Trial) study sought to explore these questions for the primary care setting in Ireland (10-13). To this end, a cluster randomized controlled trial (RCT) was conducted to evaluate a multifaceted intervention, incorporating academic detailing with a pharmacist and medicines' review with Web-based pharmaceutical treatment algorithms, to reduce potentially inappropriate prescribing among older people (10-13). In the clinical effectiveness analysis, the results indicated that, relative to usual care, the intervention was associated with a significant reduction in PIPs overall, largely driven by modifications to the prescribing of proton pump inhibitors (10;13). In addition to clinical effectiveness, any decision regarding the adoption of healthcare interventions in clinical practice should depend upon their expected cost-effectiveness (14). The techniques of economic evaluation are concerned with the estimation of such evidence, and in this study, we report the results of the economic evaluation conducted to examine the cost-effectiveness of the OPTI-SCRIPT intervention.

# **METHODS**

#### The OPTI-SCRIPT Cluster RCT

Full details of the study methods, consisting of a cluster RCT with twenty-one general practices and 196 patients, are published elsewhere (11;12). The Research Ethics Committee of the Irish College of General Practitioners approved the study. General practices from the Health Research Board Centre for Primary Care Research Network were invited to participate by email with a follow-up phone call. Practices were eligible if they had at least 80 patients aged  $\geq$ 70 years and were based in Dublin. Consenting practices were instructed to randomly select 50 patients aged  $\geq$ 70 years with capacity to provide informed consent.

Prescriptions of these patients were assigned a study ID and sent to the research team where a research pharmacist determined if they had selected PIPs as per the study inclusion criteria. For the purposes of the trial, PIPs were defined according to the criteria in Supplementary Table 1 (11;12). Eligible patients were sent study information packs by the general practice and those wishing to participate returned signed consent forms to the research team. Baseline data were collected before random allocation, which was conducted by an independent researcher using minimization. It was not possible to blind patients or general practitioners (GPs) to allocations; however, the outcome assessor was blinded. Full details on the characteristics of the study participants are presented in Supplementary Table 2.

The intervention and control treatment alternatives are outlined in Supplementary Table 3. In brief, practices (n = 10)and patients (n = 97) randomized to the control group received usual care in primary care in addition to a one-off simple patient-level PIPs feedback. Practices (n = 11) and patients (n = 99) randomized to the intervention group received a multifaceted intervention, involving academic detailing with a pharmacist on how to conduct a GP-led medicines review with participating patients; medicines reviews supported by Web-based pharmaceutical treatment algorithms for GPs, which provided evidence-based alternative treatment options to PIP drugs; and tailored patient information leaflets. The RCT was conducted between October 2012 and September 2013. All general practices and 190 (97 percent) patients were followed up on intervention completion at approximately 4 to 6 months and at 12 months at the end of the trial follow-up. Six patients (three intervention and three control) were lost to follow-up, while thirty-five patients (seventeen intervention and eighteenb control) did not return the follow-up questionnaire.

#### **Economic Evaluation**

The economic evaluation was conducted following the guidelines for health technology assessment for Ireland (15). It consisted of a trial-based analysis with a time horizon of 12 months; that is, the trial follow-up period. The perspective of the healthcare provider was adopted with respect to costing and health outcomes were expressed in terms of PIPs and qualityadjusted life-years (QALYs). Data on resource use, PIPs, and health status, specifically the Euroqol EQ5D-3L instrument (16) were collected by means of practice note searches of patient charts and patient questionnaires at baseline and at 12month follow-up. Given the length of follow-up, neither costs nor outcomes were discounted.

The statistical analysis was conducted on an intention to treat basis, and in accordance with current guidelines for cluster RCTs (17;18). That is, we adopted multilevel statistical techniques that recognize both the clustering and correlation in the cost and effectiveness data. Descriptive statistics were estimated to summarize the variables of interest. The incremental analysis was undertaken using generalized estimating equations (GEE), a flexible multivariate regression framework that explicitly allows for the modelling of normal and nonnormal distributional forms of clustered data (14). Uncertainty in the analysis was addressed by estimating 95 percent confidence intervals and cost-effectiveness acceptability curves (CEACs), which link the probability of cost-effectiveness to a range of

## Table 1. Categories of Resource Use and Unit Cost Estimates in 2013 (€) Prices

Resource item	Unit cost Activity € Source			
	<i>i</i> civity	C		
OPTI-SCRIPT intervention				
GP review consultation	Per patient	50	Study accounts	
Pharmacist academic detailing	Per patient	4	Study accounts	
Travel expenses	Per patient	1.50	Study accounts	
Materials and consumables	Per patient	2.50	Study accounts	
Healthcare resources				
GP visits	Per consultation	50	ORC	
Practice Nurse visits	Per consultation	12	ORC	
Outpatient clinic visits	Per consultation	142	DOHC	
Day-case admission	Per day	671	DOHC	
Inpatient admission	Per night	777	DOHC	
A&E visits	Per consultation	270	DOHC	
PIPs				
Proton pump inhibitor	Per pack	6.90-13.72	PCRS	
Nonsteroidal anti-inflammatory drug	Per pack	5.04-89.39	PCRS	
Long-term benzodiazepines	Per pack	1.10-8.07	PCRS	
Short-acting benzodiazepines	Per pack	2.12-19.15	PCRS	
Tricyclic anti-depressant	Per pack	3.70-14.80	PCRS	
Aspirin	Per pack	1.03-36.5	PCRS	
Theophylline	Per pack	2.30-8.35	PCRS	
Antihistamine	Per pack	1.91	PCRS	
Bladder antimuscarinic drugs	Per pack	20.69-34.26	PCRS	
Digoxin	Per pack	8.48-9.04	PCRS	
Thiazide diuretic	Per pack	2.34-33.59	PCRS	
Glibenclamide	Per pack	6.20	PCRS	
Prochlorperazine or metoclopramide	Per pack	4.35-11.98	PCRS	
Calcium channel blockers	Per pack	5.85-9.46	PCRS	
Long-term corticosteroids	Per pack	6.21-19.09	PCRS	
Chronic obstructive pulmonary disease steroid	Per pack	6.40-21.60	PCRS	
Osteoarthritis steroid	Per pack	6.40-21.60	PCRS	

PIP, potentially inappropriate prescriptions; GP, general practitioner; A&E, accident and emergency department; ORC, Office of the Revenue Commissioner, Dublin, Ireland; DOHC, Casemix Unit, Department of Health and Children, Dublin, Ireland; PCRS, Primary Care Reimbursement Service, Health Service Executive, Dublin, Ireland.

potential threshold values ( $\lambda$ ) that health policy makers may be willing to pay per additional unit of health gain (19;20). In addition, a series of sensitivity analyses were conducted. All analysis was undertaken in the Stata 13 statistical software package (StataCorp College Station, TX).

#### Cost Analysis

Three cost components were included in the analysis, all of which were expressed in Euros ( $\in$ ) in 2013 prices. Resource use was captured by means of a combination of practice note searches and patient questionnaires, and a vector of unit costs

(see Table 1) was applied to calculate the costs associated at baseline and follow-up. Unit cost estimates for each activity were based on national data sources (listed in Table 1) and, where necessary, were transformed to Euros ( $\in$ ) in 2013 prices using appropriate indices (15).

The first component related to the cost of implementing the intervention in clinical practice. This included a range of resources including the pharmacist and GP time input relating to the review and identification of PIPs, educational materials and consumables, and travel expenses. Data were recoded prospectively by the study research team and the estimated cost was allocated to all patients in the intervention arm (see Table 1

for further details). In sensitivity analysis, we explored the implications of increasing the intervention cost per patient by 100 percent.

Second, the costs relating to PIPs were estimated for the intervention and control groups at baseline and at 12-month follow-up. Prescriptions for all patients at each time point were sent to the research team where a research pharmacist identified PIPs based on the predefined criteria specified by the clinical research team. Data on the unit cost per prescription were obtained from the primary care reimbursement service for Ireland and applied to estimate the cost of PIPs per patient in both treatment arms at baseline and follow-up. Notably, as data on PIPs referred to the specific data collection point at baseline and follow-up, several assumptions were made to allow for the calculation of the total costs of PIPs over the time horizon of the trial of 12-month follow-up.

For the base-case analysis, it was assumed that the PIPs observed at 12-month follow-up were applicable to the entire 12-month follow-up period. In sensitivity analysis, several alternative scenarios were explored. First, it was assumed that the PIPs observed at baseline were applicable to the first 6 months and that the PIPs observed at follow-up were applicable to the final 6 months of follow-up. Second, it was assumed that the PIPs observed at baseline were applicable to the first 9 months and that the PIPs observed at follow-up were applicable to the final 3 months of follow-up. In addition, to reflect a change in pricing policy that came into effect after the trial was completed, we conducted a sensitivity analysis to explore the impact of reducing the costs of medications by 50 percent. Finally, to address a concern that including the cost of PIPs in the numerator and the number of PIPs in the denominator may represent double counting in the incremental cost per PIP avoided analysis, we present an analysis with the cost of PIPs excluded.

Third, the costs relating to the use of primary and secondary healthcare services for the 12 months before baseline and for the 12-month follow-up period were estimated for patients in both treatment arms. This included the costs of GP and practice nurse consultations, outpatient clinic visits, A&E clinic visits, and hospital day-case and inpatient admissions.

For the incremental cost analysis, a healthcare provider perspective was adopted and the three cost components were combined to generate a total cost variable per patient. Estimation of incremental costs at follow-up was undertaken using a GEE regression model controlling for the treatment arm, baseline cost, age, gender, baseline number of PIPs, number of GPs per practice, and practice location. To account for the non-normal nature of the cost data, a gamma variance function was adopted, and to account for the hierarchical nature of data, an exchangeable correlation structure was used (14). In sensitivity analysis, a GEE regression model controlling only for the treatment arm was estimated.

#### **Effectiveness Analysis**

Health outcomes were expressed in terms of PIPs and QALYs. Complete data were available with respect to the number of PIPs in both treatment arms at baseline and follow-up. Estimation of incremental number of PIPs at follow-up was undertaken using a GEE regression model, assuming a Gaussian variance function, an identity link function, and an exchangeable correlation structure, and controlling for the treatment arm, age, gender, baseline number of PIPs, number of GPs per practice, practice location, and clustering. In sensitivity analysis, a GEE regression model controlling only for the treatment arm was estimated.

Health outcomes were also expressed in terms of QALYs gained, which were calculated based on patient responses at baseline and follow-up to the EuroQol EQ5D-3L instrument (16). The EQ5D responses were transformed using an algorithm into a single health state index score, based on values elicited by means of the time trade-off approach for the U.K. population (16). EQ5D scores at baseline and 12-month followup were used to calculate patient-specific QALYs gained over 12 months using the area under the curve method (14). Estimation of incremental QALYs was undertaken using a GEE regression model, assuming a Gaussian variance function, an identity link function and an exchangeable correlation structure, and controlling for treatment arm, baseline EQ5D score, age, gender, baseline number of PIPs, number of GPs per practice, practice location, and clustering. In sensitivity analysis, a GEE regression model controlling for the treatment arm only was estimated.

Notably, missing data proved to be an issue with respect to the EQ5D data and the resultant QALY estimates. At baseline, data availability was 46 percent for the intervention and 65 percent for the control. At follow-up, these values were 41 percent and 65 percent, respectively. As there was no clear evidence of systematic bias with respect to the missing data, in sensitivity analysis, multiple imputation was undertaken to estimate missing values for EQ5D data to explore the implications for the incremental QALYs results. The imputation models for EQ5D data included age, gender, practice, and treatment arm (at follow-up only) and were estimated using predictive mean matching, based on M = 5 imputed data sets. The analysis was undertaken using the MI estimate mixed and MI predict commands in Stata 13, which estimate the regression model on each of the imputed data sets and apply Rubin's rules to generate the coefficients of interest (21).

## **Cost-Effectiveness Analysis**

To undertake economic evaluation alongside cluster RCTs, techniques which recognize the clustering and correlation in the cost and effectiveness data must be adopted (18;20). Separate multilevel regression models, controlling for treatment arm, clustering, and a range of other covariates, were used to

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estimate the incremental costs, PIPs and QALYs for the intervention relative to the control. The uncertainty surrounding these point estimates was examined using CEACs, which report the probability of an intervention being cost-effective, relative to a comparator, for a range of potential threshold values per unit of health gain (19). In the Irish context, it is recommended that results be presented for cost-effectiveness thresholds of up to €45,000 per QALY gained (15). As no such recommendation exist for potentially inappropriate prescribing related outcomes, results are presented for a range of values up to €4,500 per PIP avoided. Notably, we explicitly assume that the threshold values adopted, which are typically assumed to apply over a lifetime time horizon, are applicable to the 12-month time horizon of our evaluation.

# RESULTS

Descriptive statistics for resource use, costs and health outcomes at baseline and follow-up are presented in Table 2. The total cost of implementing the intervention was  $\notin$ 5,824 giving a mean cost per patient estimate of  $\notin$ 58. Summary data for the proportion of patients with each category of PIP at baseline and follow-up are reported in Table 3. Notably, prescriptions of proton pump inhibitors constituted the largest single class of PIP identified in the intervention and control arms at baseline and follow-up.

The results from the incremental analyses are presented in Table 4. In terms of total costs at 12-month follow-up, the estimated mean cost per patient was  $\notin 3,075$  (95 percent confidence interval [CI], 2,704–3,446) for the intervention group and  $\notin 2,668$  (95 percent CI, 2,297–3,040) for the control group. The intervention was associated, on average, with an increase in cost of  $\notin 407$  (95 percent CI, -357-1,170) per patient compared with the control.

With respect to health outcomes, the mean number of PIPs at 12-month follow-up was estimated at 0.627 (95 percent CI, 0.588–0.666) for the intervention group and 1.006 (95 percent CI, 0.967–1.045) for the control group. The intervention was associated with a mean reduction of 0.379 (95 percent CI, -0.666 to -0.092) PIPs relative to the control. Mean QALYs gained per patient at 12 months was estimated to be 0.671 (95 percent CI, 0.625–0.716) in the intervention group and 0.657 (95 percent CI, 0.612–0.703) in the control group. The intervention was associated, on average, with an increase of 0.013 (95 percent CIs: -0.016, 0.042) in QALYs gained.

These estimates translated into incremental costeffectiveness ratios (ICERs) of  $\in 30,535$  (95 percent CI, -334,846-289,498) per QALY gained and  $\in 1,269$  (95 percent CI, -1,400-6,302) per PIP avoided. The probabilistic results are summarized in Table 4 and Supplementary Figures 1 and 2 and indicate that the probability of the intervention being cost-effective was at least 0.845 at threshold values of  $\in 2,500$ per PIP avoided and higher. Notably, the probability of the intervention being cost-effective was only 0.602 at a threshold value of €45,000 per QALY gained.

The results from the sensitivity analyses are presented in Supplementary Tables 4–10. These broadly reflect the results from the base-case analysis, with the intervention consistently estimated to be more costly and more effective than the control. Notably, the imputed cost utility analysis reported higher estimates for the probability of the intervention being costeffective relative to the control. Additional results from univariate analysis of resource costs are presented in Supplementary Table 11 and indicate that only the costs of PIPs differed significantly across treatment arms at follow-up.

#### DISCUSSION

This study examined the cost-effectiveness of the OPTI-SCRIPT intervention, which has been shown to be effective in reducing potentially inappropriate prescribing relative to usual primary care in Ireland (10-13). The results indicate that, on average, the intervention was more costly and more effective, in terms of PIPs avoided and QALYs gained, compared with the control. Notably however, while there was evidence of a statistically significant reduction in PIPs, there was no such evidence for the difference in mean costs or the difference in mean QALYs. That is, the observed reduction in PIPs did not translate into statistically significant improvements in QALYs or statistically significant reductions in healthcare costs. Indeed, this finding reflects the ambiguity that exists in the literature with respect to the longer term implications of PIPs. For example, recent prospective cohort studies have reported that PIPs were associated with increased healthcare usage, increased ADEs, and diminished quality of life (22;23); whereas other studies have reported the magnitude of these effects to be modest (2-4).

This raises the question of whether the lack of evidence with respect to QALYs reflects an absence of a clinically significant treatment effect or whether it reflects a lack of sensitivity in the EQ5D instrument, or indeed how we have used it in our analysis, to detect a clinically meaningful improvement in health status for the older patient population under consideration. It may also be the case that our analysis, which was limited to a time horizon of the 12 months, was too short to capture the longer terms implications of reducing PIPs. Indeed, a common criticism of the evaluation literature for prescribing interventions is that sample sizes may be too small and followup periods too short to detect differences in patient reported outcomes (24). Finally, a further explanation may be that our findings related mainly to proton pump inhibitor prescriptions and reductions in such prescriptions may not significantly impact upon self-rated health status.

Our results also indicated that the reduction in PIPs did not lead to a statistically significant difference in mean healthcare costs between the intervention and the control. Indeed, and

	Intervention (N = 99) Mean (SD)		Control (N = 97) Mean ( <i>SD</i> )	
Resource item	Use	Cost (€)	Usage	Cost (€)
Baseline PIPs <sup>a</sup>		000 (170)	1.00 (0.1)	
No. of PIP at baseline	1.31 (0.6)	230 (172)	1.39 (0.6)	302 (186)
Baseline healthcare resource use				
GP visits	8.7 (4.1)	434 (203)	8.7 (5.2)	432 (260)
GP visits: script only <sup>b</sup>	2.9 (3.6)	143 (180)	2.5 (3.0)	123 (151)
Practice nurse visits	1.8 (2.7)	21 (32)	1.5 (1.8)	19 (22)
Out of hours GP visits	0.2 (0.7)	10 (36)	0.2 (0.7)	10 (34)
Outpatient visits	2.5 (2.5)	355 (351)	2.3 (2.3)	327 (327)
Day case admission	0.1 (0.3)	49 (175)	0.1 (0.4)	79 (239)
Inpatient admission	0.9 (3.5)	688 (2705)	0.9 (3.2)	660 (2489)
A&E visits	0.1 (0.4)	34 (113)	0.1 (0.3)	26 (80)
Follow-up PIPs ª				
No. of PIP at follow-up	0.61 (0.7)	93 (131)	1.03 (0.8)	200 (217)
Follow-un healthcare resource use				
GP visits	80(45)	398 (225)	81(48)	405 (242)
GP visits: script only <sup>b</sup>	2 2 (2 6)	112 (131)	2 2 (2 6)	110 (128)
Practice nurse visits	2.0 (2.6)	24 (31)	1.6 (2.4)	19 (29)
Out of hours GP visits	0.2(0.5)	7 (24)	01(04)	7 (19)
Outpatient visits	2.4 (2.0)	343 (277)	2.4 (2.2)	342 (314)
Dav-case admission	0.2 (0.5)	119 (364)	0.2 (0.5)	101 (312)
Inpatient admission	1.9 (5.7)	1497 (4430)	1.6 (5.2)	1270 (4001)
A&E visits	0.2 (0.4)	39 (117)	0.1 (0.4)	38 (117)
OPTI-SCRIPT intervention	99 (100%)	58 (NA)	0(0%)	0 (NA)
Health outcome	Intervention $(N = 99)$		$\frac{1}{(0.000)} (N = 97)$	
	Megn (SD)		Me	in ( <i>SD</i> )
EQ5D score at baseline	0.628	(0.302)	0.689	0 (0.236)
EQ5D score at follow-up	0.665 (0.268)		0.652 (0.248)	

Table 2. Resource Use, Costs, and Health Outcomes at Baseline and 12-Month Follow-up

*Note.* Completeness of data at baseline: *Intervention*: 96/99 (97%) for primary and secondary care utilization, 99/99 (100%) for PIPs, 45/99 (46%) for EQ5D. *Control*: 93/97 (96%) for primary and secondary care utilization, 97/97 (100%) for PIPs, 63/97 (65%) for EQ5D. Completeness of data at follow up: *Intervention*: 96/99 (97%) for primary and secondary care utilization, 97/97 (100%) for PIPs, 63/97 (100%) for PIPs, 41/99 (41%) for EQ5D. *Control*: 93/97 (96%) for primary and secondary care utilization, 97/97 (100%) for PIPs, 63/97 (65%) for EQ5D.

<sup>a</sup>PIPs are medicines whose potential harms may outweigh their benefits. The PIPs inclusion criteria are described in Supplementary Table 1. Patient repeat medications were reviewed by a research pharmacist to confirm if patients had a PIP as per this list. <sup>b</sup>For repeat prescriptions, GPs may pre-authorise for patients to have a script issued, without having a GP consultation.

PIP, potentially inappropriate prescriptions; GP, general practitioner; A&E, accident and emergency department; NA, not applicable.

although not statistically significant, when intervention costs, PIP costs, and other healthcare service costs over the 12-month follow-up period were combined, the intervention was, on average, more costly than the control. That said, there was no evidence of statistically significant differences in the costs of individual primary or secondary care services between the intervention and control over the course of the trial. These issues notwithstanding, in circumstances where an intervention is, on average, more costly and more effective than a control comparator, it will only be judged cost-effective if its ICER falls below the threshold value that policy makers would be willing to pay for an additional unit of health gain (14). The ICER from the cost utility analysis of €30,535 per QALY gained is likely to be viewed favorably in the Irish context, and

	Intervention $(N = 99)\%$		Control ( <i>N</i> = 97)%	
Potentially inappropriate prescriptions*	Baseline	Follow-up	Baseline	Follow-up
Proton pump inhibitor	53%	26%	68%	43%
Nonsteroidal anti-inflammatory drug	21%	3%	17%	8%
Long-term benzodiazepines (long-acting benzo)	14%	8%	8%	<b>9</b> %
Short-acting benzodiazepines	0%	0%	0%	0%
Tricyclic anti-depressant	1%	1%	5%	3%
Aspirin	3%	5%	1%	2%
Theophylline	0%	0%	0%	0%
Antihistamine	4%	1%	2%	2%
Bladder antimuscarinic drugs	1%	2%	<b>9</b> %	6%
Digoxin	1%	0%	3%	3%
Thiazide diuretic	3%	1%	2%	2%
Glibenclamide	0%	0%	0%	0%
Prochlorperazine or metoclopramide	0%	0%	0%	0%
Calcium channel blockers	0%	2%	3%	2%
Long-term corticosteroids	0%	0%	0%	1%
Chronic obstructive pulmonary disease steroid	0%	0%	0%	0%
Osteoarthritis steroid	<b>9</b> %	3%	4%	2%
Therapeutic duplication	1 <b>9</b> %	3%	14%	<b>9</b> %

 Table 3. Potentially Inappropriate Prescriptions at Baseline and 12-Month Follow-up

\*Potentially inappropriate prescriptions are medicines whose potential harms may outweigh their benefits. The PIPs inclusion criteria are described in Supplementary Table 1. Patient repeat medications were reviewed by a research pharmacist to confirm if patients had PIP as per this list.

in other similar jurisdictions, where a threshold value in the region of  $\notin$ 45,000 per QALY has been proposed (15).

Nonetheless, the uncertainty surrounding this ICER point estimate must be also taken into account. In this case, the probabilistic results indicate the likelihood of the intervention being cost-effective to be 0.602 at a threshold value of  $\notin$ 45,000 per QALY. Such a level of uncertainty is unlikely to be deemed sufficient to justify adoption in clinical practice. Notably, the response rate to the EQ5D questionnaire had a direct impact of this finding as this probability estimate increased to 0.764 when the missing EQ5D score data were imputed and the cost utility analysis was re-estimated.

The results from the cost-effectiveness analysis provide additional evidence. Importantly, while there is no formal threshold value per PIP avoided for Ireland or elsewhere, we present results for a set of potential threshold values for illustrative purposes. The robust findings for the statistically significant reduction in PIPs associated with the intervention are reflected in the cost-effectiveness probability estimates, which increase as the threshold value per PIP avoided increases. For example, if decision makers were willing to pay at least  $\in 2,500$  to avoid a PIP, there is a probability of 0.845 or higher of the intervention being cost-effective. That said, whether or not this proves to be an appropriate range of threshold values in this context is open to debate. Taken together, the ultimate determination of the cost-effectiveness of the OPTI-SCRIPT intervention will depend on the relevant policy-maker's threshold value per PIP avoided and QALY gained, as well as their attitude toward uncertainty.

This study adds to the limited literature of interventions targeting reductions in potentially inappropriate prescribing in primary care. Of those interventions that have been evaluated, single interventions such as computerized decision support systems (CDSSs), educational interventions, and multidisciplinary teams have produced inconsistent effects (2;24;25). More recently, two separate RCTs have found that multifaceted interventions are effective (8,9). Rognstad et al. (9) found that peer academic detailing, delivered at continuing medical education meetings, with mailed prescriber feedback, produced a 10 percent (95 percent CI, 5.9–15.0) reduction in PIP. Similarly, Bregnhoj et al. (8) found that interactive educational meetings and feedback resulted in a 5-point (95 percent CI, 2.6–7.3) improvement in the Medication Appropriateness Index score. Differences in effect sizes reported between these studies and

Table 4. Incremental Cost-Effectiveness Analysis and Cost Utility Analysis Results

	Incremental analysis (Intervention versus control)				
Cost analysis	Intervention		Control		
Healthcare costs	3075		2668		
(95% Cls)	(2704–3446	)	(2297–3040	)	
Difference in healthcare cost (95% CI)		4 (—357	07 7—1170)		
		Incremental analysis			
		(Intervention	versus control)		
Effectiveness analysis	Intervention		Control		
No. of PIPs (95% CI)	0.627 (0.588–0.66)	6)	1.006 (0.967—1.045	5)	
Difference in no. of PIPs (95% CI)		—0 (—0.666	).379 to —0.092)		
		Incremental analysis			
	(Intervention versus control)				
Effectiveness analysis	Intervention		Control		
QALYs	0.671		0.657		
(95% CI)	(0.625-0.71)	6)	(0.612-0.703	3)	
Difference in QALYs (95% CI)		0. (—0.01	013 6—0.042)		
	Incremental analysis				
		(Intervention	versus control)		
ICER per PIP avoided (€)		12	269		
(95% CI)	(-1400-6302)				
ICER per QALYs gained (€)	30535				
(95% CI)	(-334846-289498)				
Probability that the intervention is cost-effective	PIP avoided		QALY gained		
	Threshold Value ( $\lambda$ )	p [CE]	Threshold value $(\lambda)$	p [CE]	
	$\lambda = \in 0$	.143	$\lambda = \in 0$	.138	
	$\lambda = \in 500$	.278	λ =€5,000	.184	
	$\lambda = \in 1,500$	.654	λ =€15,000	.315	
	$\lambda = \in 2,500$	.845	λ =€25,000	.454	
	λ =€3,500	.926	λ =€35,000	.534	
	$\lambda = \in 4,500$	.951	λ =€45,000	.602	

*Note.* Completeness of data: *Intervention* –99/99 (100%) for PIPs, 37/99 (37%) for QALY, and 95/99 (96%) for total cost; *Control:* 97/97 (100%) for PIPs, 54/97 (56%) for QALY, and 93/97 (96%) for total cost. Incremental cost analysis: Estimated by a generalized estimating equation regression model, assuming a gamma variance function, an identity link function, and an exchangeable correlation structure, controlling for treatment arm, age, gender, baseline number of PIP drugs, baseline cost, number of GPs, and practice location. Incremental PIP analysis: Estimated by a generalized estimating equation regression model, assuming a function, an identity link function, and an exchangeable correlation structure, controlling for treatment arm, age, gender, baseline number of GPs, and practice location. Incremental QALY analysis: Estimated by a generalized estimating equation regression model, assuming a Gaussian variance function, an identity link function, an identity link function, and an exchangeable correlation structure, controlling for treatment arm, age, gender, baseline number of GPs, and practice location. Incremental QALY analysis: Estimated by a generalized estimating equation regression model, assuming a Gaussian variance function, an identity link function, and an exchangeable correlation structure, controlling for treatment arm, age, gender, baseline number of PIP drugs, baseline number of PIP drugs, baseline EQ5D score, number of GPs, and practice location.

CI, confidence interval; PIP, potentially inappropriate prescriptions; QALY, quality-adjusted life-year; ICER, incremental cost-effectiveness ratio; CE, cost-effectiveness.

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the OPTI-SCRIPT findings may arise from several factors, including differences in the criteria used to assess PIPs, the duration of follow-up and the patients included and the context of care (10;13).

The study was subject to several limitations. First, the limitations associated with the RCT (11;12) on which the analysis was based are also applicable to the economic evaluation. There were several issues with respect to the cost analysis. In the case of costing PIPs, given data issues, we made the explicit assumption that all PIPs represented inappropriate cases and there were no cases in which a PIP would have been substituted for an alternative medication. In addition, we made a series of assumptions to cost PIPs over the 12-month trial follow-up period. Furthermore, while the cost analysis was conducted from the healthcare service perspective and included a broad range of resource use activities, certain resource items were not captured. For example, the costs of community care services, private patient costs such as private health insurance premiums, and broader costs to society such as productivity losses were not captured. Nonetheless, there is little evidence to suggest that the inclusion of such resource categories would have significantly changed the results.

Finally, the process of conducting cost analysis in Ireland is compromised by the lack of nationally available unit cost data. In estimating unit costs for individual resource activities, we endeavored at all times to be conservative in any assumptions adopted. It should also be noted that we adopt 2013 prices for the analysis and medical inflation has fallen in the period since the trial was conducted. To examine the uncertainty surrounding the cost analysis, a series of sensitivity analyses were conducted, the results from which did not differ fundamentally from those of the base-case analysis.

There were also several limitations in relation to the health outcome analysis. In particular, the available PIP data only reflected medications that were prescribed and did not capture whether or not the medication was subsequently dispensed and taken by the patient. With respect to the estimation of QALYs, given the lack of Irish utility data for the EQ5D-3L instrument, the equivalent U.K. algorithm was adopted and assumed to be generalizable to the older Irish population. Furthermore, the patient response rate for the EQ5D-3L questionnaire was disappointing and was reflected in the cost utility analysis results.

In sensitivity analysis, after careful consideration of missing data patterns, we proceeded with the assumption that the data were missing at random and multiple imputation was undertaken to impute missing values. The imputation process adopted is subject to criticism, as the variables included in the imputation models were pragmatically chosen by the study team and the values for costs and EQ5D scores were imputed independently (18). Nonetheless, the imputed results provide useful additional information on the potential costeffectiveness of the intervention. Finally, in the case of chronic disease, a lifetime time horizon for analysis is encouraged as interventions may have longterm implications that occur beyond the end of trial follow-up (14). Additional follow-up of the trial sample should be conducted to explore the longer term implications of the results presented here.

## CONCLUSION

This study presents cost-effectiveness evidence for the OPTI-SCRIPT intervention in reducing potentially inappropriate prescribing in primary care in Ireland. While we report that the OPTI-SCRIPT intervention was effective in reducing PIPs, uncertainty exists with respect to its cost-effectiveness. There was strong evidence that the intervention was cost-effective if decision makers were willing to pay at least €1,269 per PIP avoided; however, the evidence was much less compelling when effectiveness was measured in terms of QALYs gained. Further studies are required to explore the longer term health and economic implications of interventions targeting potentially inappropriate prescribing in primary care.

## SUPPLEMENTARY MATERIAL

Supplementary Table 1: https://doi.org/10.1017/S0266462317000782 Supplementary Table 2: https://doi.org/10.1017/S0266462317000782 Supplementary Table 3: https://doi.org/10.1017/S0266462317000782 Supplementary Figure 1: https://doi.org/10.1017/S0266462317000782 Supplementary Figure 2: https://doi.org/10.1017/S0266462317000782 Supplementary Table 4: https://doi.org/10.1017/S0266462317000782 Supplementary Table 5: https://doi.org/10.1017/S0266462317000782 Supplementary Table 6: https://doi.org/10.1017/S0266462317000782 Supplementary Table 7: https://doi.org/10.1017/S0266462317000782 Supplementary Table 8: https://doi.org/10.1017/S0266462317000782 Supplementary Table 9: https://doi.org/10.1017/S0266462317000782 Supplementary Table 10: https://doi.org/10.1017/S0266462317000782 Supplementary Table 11: https://doi.org/10.1017/S0266462317000782

# CONFLICTS OF INTEREST

All authors have no conflict of interest to declare.

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