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# Behavioral Approach to Appropriate Antimicrobial Prescribing in Hospitals The Dutch Unique Method for Antimicrobial Stewardship (DUMAS) Participatory Intervention Study

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## ABSTRACT

**Importance** Inappropriate antimicrobial prescribing leads to antimicrobial resistance and suboptimal clinical outcomes. Changing antimicrobial prescribing is a complex behavioral process that is not often taken into account in antimicrobial stewardship programs.

**Objective** To examine whether an antimicrobial stewardship approach grounded in behavioral theory and focusing on preserving prescriber autonomy and participation is effective in improving appropriateness of antimicrobial prescribing in hospitals.

**Design, Setting, and Participants** The Dutch Unique Method for Antimicrobial Stewardship (DUMAS) study was a prospective, stepped-wedge, participatory intervention study performed from October 1, 2011, through December 31, 2015. Outcomes were measured during a baseline period of 16 months and an intervention period of 12 months. The study was performed at 7 clinical

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departments (2 medical, 3 surgical, and 2 pediatric) in a tertiary care medical center and a general teaching hospital in the Netherlands. Physicians prescribing systemic antimicrobial drugs for any indication for patients admitted to the participating departments during the study period were included in the study.

**Interventions** We offered prescribers a free choice of how to improve their antimicrobial prescribing. Prescribers were stimulated to choose interventions with higher potential for success based on a root cause analysis of inappropriate prescribing.

**Main Outcomes and Measures** Appropriateness of antimicrobial prescriptions was determined using a validated approach based on guideline adherence and motivated guideline deviation and measured with repeated point prevalence surveys (6 per year). Appropriateness judgment was masked for the study period. Antimicrobial consumption was extracted from pharmacy records and measured as days of therapy per admission. We used linear and logistic mixed-model regression analysis to model outcomes over time.

**Results** A total of 1121 patient cases with 700 antimicrobial prescriptions were assessed during the baseline period and 882 patient cases with 531 antimicrobial prescriptions during the intervention period. The mean antimicrobial appropriateness increased from 64.1% at intervention start to 77.4% at 12-month follow-up (+13.3%; relative risk, 1.17; 95% CI, 1.04-1.27), without a change in slope. No decrease in antimicrobial consumption was found.

**Conclusions and Relevance** Use of a behavioral approach preserving prescriber autonomy resulted in an increase in antimicrobial appropriateness sustained for at least 12 months. The approach is inexpensive and could be easily transferable to various health care environments.

## INTRODUCTION

Appropriate antimicrobial prescribing has significant clinical benefits (ie, reduced mortality) and reduces development of antimicrobial resistance and health care costs<sup>2,1</sup>. Antimicrobial stewardship programs aim to improve antimicrobial prescribing but sometimes fail to acknowledge that improving antimicrobial prescribing actually means changing human behavior<sup>4,3</sup>. Human behavior is not based on a fully rational process but depends on a complex interplay between several behavioral determinants and social norms<sup>10-5</sup>. Despite its rational theoretical foundation, stewardship programs are known to persistently encounter prescriber resistance. This resistance is generated by the tension between the governance of the stewardship team and the autonomy of individual prescribers<sup>19-11</sup>. Behavioral and social theory seem underused in antimicrobial stewardship intervention programs, contrary to more common use in other scientific fields<sup>21,20,10,8-3</sup>. Previous studies<sup>8,27-22</sup>, using interventions based on behavioral theory have found promising results in improving antibiotic prescribing. Most of these studies focused on antibiotic prescribing for respiratory tract infections in primary care.

We used behavioral theory to design and implement an intervention approach to improve appropriateness of hospital antimicrobial prescribing for all indications. Our approach was inspired by the participatory action research paradigm<sup>28</sup>, which

focuses on collaboration and empowerment of the stakeholders in the change process and is effective in other complex health care situations<sup>28</sup>. In our approach, prescribers were invited to choose and codevelop 1 or more interventions to improve their own prescribing, whereby they were stimulated to base their choice on conclusions of a prior root cause analysis of their prescribing patterns. The approach is therefore designed to benefit from tailoring to local determinants<sup>7,33-29</sup>, and draws on 3 behavioral principles: (1) respect for the prescribers' autonomy to avoid feelings of resistance<sup>11 (2) ;19</sup> -the inclination of people to value a product higher and feel more ownership for it if they made it themselves, which is referred to as the IKEA effect<sup>34 ;36</sup> -and (3) the tendency of people to follow up on an active and public commitment<sup>40 -37,8</sup>. We aimed to test the approach's effectiveness in improving appropriateness of antimicrobial prescribing in hospitals.



## **METHODS**

### **Study Design**

The Dutch Unique Method for Stewardship (DUMAS) study was a prospective, stepped-wedge, participatory intervention study aimed to improve antimicrobial prescribing. The institutional medical ethics review boards of the VU University Medical Center, Amsterdam, the Netherlands, and OLVG, Amsterdam, the Netherlands, approved all study procedures and waived informed consent for patients.

### **Setting**

The study was performed from October 1, 2011, through December 31, 2015. Seven departments from 2 hospitals participated, of which 3 were surgical, 2 were medical, and 2 were pediatric departments. Hospital 1 was a 700-bed tertiary care medical center with salaried specialists, and hospital 2 was a 550-bed teaching general medical center with self-employed specialists, both located in Amsterdam, the Netherlands. During the study period, hospital 1 used a preexisting preauthorization system for broad-spectrum antimicrobials, whereas hospital 2 performed antimicrobial audit and feedback interventions but only in departments not participating in the study.

### **Enrollment**

The local antibiotic formulary committee selected departments for study participation based on the need for change (low appropriateness and moderate to high antimicrobial consumption), for which the results of 12 months of baseline antimicrobial appropriateness and consumption measurements were available. We then approached department heads or the department's infectious disease expert with a participation request. Participation was voluntary, and we offered no financial compensation. Seven of 8 approached medical departments agreed to participate; 1 department head refused for unspecified reasons. Timing of the start of the intervention phase for each department was not randomized because of expected availability issues of relevant department stakeholders, education schedules, and potential approval delays of ethical review boards. Intervention start sequence and timing are shown in eFigure 1 in the Supplement.



## **Outcome Measures**

Our primary outcome was antimicrobial appropriateness, measured with a validated appropriateness assessment instrument 41. One of 3 infectious diseases specialists (including M.A.v.A. and E.J.G.P.) assessed the adult prescriptions, and 1 of 3 infectious diseases/immunology pediatricians (including M.v.d.K.) assessed the pediatric prescriptions for appropriateness. They were masked for clinical outcomes and study period (baseline or intervention). Data were collected prospectively, but assessments were performed retrospectively to enable masking. Each of the following antimicrobial prescription factors was assessed for appropriateness: indication, choice of antimicrobial, dosage, administration route, and duration. A prescription was only deemed to be appropriate if one of the following criteria applied for each of the above factors: complete guideline adherence or guideline deviation or no guideline but based on rational reasons, as judged by the assessing infectious diseases specialist, immunology specialist, or pediatrician. Rationality was defined as an effective antimicrobial regimen that covered relevant pathogens without being excessive (ie, unnecessary combination therapy or broad spectrum when a more narrow spectrum is available). If present, drug allergies, oral intake, and previous culture results were taken into account. Cases that could not be assessed because of missing information were excluded. We notified clinical staff of both hospitals by email before the start of the baseline measurements.

Antimicrobial consumption was a secondary outcome, reported in days of therapy per 100 admissions per month. Antimicrobial appropriateness and consumption measurements only included prescriptions with Anatomical Therapeutic Chemical codes beginning with J01, J02, J04AB02, and J05AB 42. Other outcomes were changes in specific appropriateness categories, intravenous antimicrobial consumption, consumption of specific antimicrobial subgroups, and length of hospital stay.

## **Data Collection**

Antimicrobial appropriateness was measured through point prevalence surveys at a rate of 6 times per year. Local antimicrobial stewardship teams performed the surveys as part of standard quality measurements. All team members were trained and supervised by the coordinating investigator (J.J.S.) using standard operating procedure documents. An antimicrobial case was included in the survey if the patient was admitted to a clinical ward of a participating department and had a prescription for a systemic antimicrobial agent at 0.00 hours on the day of the survey. Relevant clinical data needed for assessment, including prescription indication and reasons for guideline deviations, were collected by contacting the responsible ward physician or were retrieved from medical files. Antimicrobials prescribed for prokinetic reasons (erythromycin) were excluded. Data were then coded and stripped from any identifying information. To prevent anticipatory behavior, we did not notify the clinical wards of the exact survey dates.

Data on antimicrobial consumption, admission rates, admission diagnoses, and length of stay were derived from pharmacy systems and administrative records. Only data on patients with a length of stay of at least 24 hours were included. Two pediatric critical care units were not included because of lack of electronic data. Baseline and intervention periods were at least 12 months, but more data were collected whenever possible.



### **Root Cause Analysis**

An analysis of local root causes of inappropriate prescribing was performed after 12 months of baseline measurements for the baseline phase of each department separately. The analysis was based on interviews of a purposive sample of department members. Sample size depended on department size but included at least 2 medical specialists, 2 junior physicians, and 2 nurses per department. Interviews were audio recorded. The interviewer (J.J.S.) was a psychologist and physician trained in qualitative research. Interviewees supplied written informed consent before the interview start. The interviews were guided by a topic list that consisted of standard questions that focused on the cause categories of the Eindhoven Classification Model: technical, organizational, human, and patient (see eTable 1 in the Supplement for a translated topic list 44,43). (The interviewer asked additional questions on potential causes for inappropriate prescribing using the 5 whys method, which entails repeatedly asking for a cause underlying each cause of a certain event as supplied by the interviewee 45. For additional validity, the conclusions of the analysis were discussed with department members during the intervention approach.

### **Intervention Approach**

Figure 1 summarizes the intervention approach. The approach was performed for each department separately and started with a plenary introduction and discussion with department physicians. Participation was voluntary for each department and physician. Department members were stimulated to choose interventions with higher potential for success based on the root cause analysis, which would result in one set of interventions per department. Intervention choice was not predefined, was free, and was only restricted by practical feasibility. Essential to the approach was the appointment of 1 or more antibiotic ambassadors chosen by their peers, which defined the start of the intervention period. We also informed nurses from each department of the baseline results. The ambassador team contained at least 1 medical specialist per department, but participation of junior physicians, nurses, and quality-of-care personnel was encouraged. Department ambassadors were asked to represent their department during subsequent intervention discussions, to champion good antibiotic policy and the chosen interventions 29,3, and to help develop and implement the interventions. Support and involvement of study personnel with each department's intervention approach were determined by the preferences of the antibiotic ambassador(s) and limited to a maximum of 12 months after the start of the intervention period.

### **Statistical Analysis**

We used logistic mixed regression analysis to model antimicrobial appropriateness time trajectories and linear mixed regression analysis to model monthly antimicrobial consumption and length-of-stay time trajectories. Each model contained the fixed-effects variables of time, study period, and the interaction term, which allowed the baseline period to function as control for the intervention period. The intervention period was considered to have started with the first plenary department meeting. Odds ratios were converted to relative risks for better interpretability 46. We included random effects for department and clinical ward in each model. Antimicrobial consumption analyses contained a random effect for month of the year to account for season effects. All continuous outcomes were log transformed before analysis. To be





able to report outcomes on the original scale of measurement, we calculated predicted means per time point, which were then back-transformed in case of continuous outcomes. Regression coefficients from these models were back transformed and then transformed to change percentages for optimal interpretability. The CIs were calculated with 10 000 bootstraps while accounting for the clustered nature of the data. Significance level was .05 (2-sided). Main analyses were limited to the period when data were available for all departments: 16 months before and 12 months after the start of the intervention period.

We performed a sensitivity analysis for both primary outcomes: a mixed-model analysis with only study period as the fixed effect, ignoring slopes. We performed the analyses of the antimicrobial appropriateness and consumption subgroups using the same single fixed-effect method because we assumed time trend estimations were more vulnerable to chance events in these small groups. We used R statistical software, version 3.2.3 with package lme4, version 1.1-11, for all analyses (R Development Core Team.)

## RESULTS

### Population and Point Prevalence Survey Characteristics

There were 21 306 clinical admissions during the baseline period and 15 394 clinical admission during the intervention period. The appropriateness surveys included 1121 patients during the baseline period and 882 patients during the intervention period. Detailed characteristics are given in Table 1.

### Root Cause Analyses and Chosen Interventions

The root cause analyses identified causes in 4 themes: physician (eg, lack of knowledge), culture (eg, rejection of interference), organization (eg, infectious diseases experts set wrong example), and guidelines (eg, hard to find and use). Between 2 and 4 interventions per department were chosen, each connected to 1 or 2 of the above themes; for example, participatory education sessions (physician and culture), presence of infectious diseases physicians during ward round (organization), and guideline revision (guidelines). Detailed characteristics are given in Figure 2 and eTable 1 in the Supplement. Time from the first plenary meeting to the implementation of the first intervention varied between immediate (supervisors promise to improve) to 6 months for the first pediatrics department, where the antibiotic ambassadors team was formed 4 months after the plenary meeting because of logistical problems.

### Antimicrobial Appropriateness

The intervention approach was associated with a significant 13.3% (95% CI, 64.1%-77.4%) increase in antimicrobial appropriateness (relative risk, 1.17; 95% CI, 1.04-1.27), without any significant changes in time trends) Figure 3A). Results of the analyses per appropriateness subgroup are given in Table 2 and per department in eFigure 2 and eTable 2 in the Supplement.

### Antimicrobial Consumption

Antimicrobial consumption did not decrease significantly during the intervention phase, and there were no changes in time trends) Figure 3B). Results of the analyses per antimicrobial drug group are given in Table 2 and per department in eTable 2 in the Supplement.



## Other Results

Length of hospital stay did not change relative to the start of the intervention approach (eFigure 3 in the Supplement .(The single fixed-effect sensitivity analysis supported the primary analysis showing similar results) Table 2.(

## DISCUSSION

To our knowledge, this is the first hospital antimicrobial stewardship study grounded in behavioral science and allowing physicians a free choice in how to improve their own prescribing 28. In our multicenter study in 7 departments divided between 2 hospitals (a teaching and an academic hospital), we found that our approach was associated with a significant 13.3% increase in antimicrobial appropriateness during a period of 12 months after the intervention start. We found no reduction in antimicrobial consumption.

We believe the observed increase in antimicrobial appropriateness is clinically relevant because our definition of appropriateness specifically focused on unwanted prescriptions from a stewardship point of view. Attainment of underlying goals, such as empirical therapy, according to guidelines and de-escalation of therapy improves mortality and other clinical outcomes 2. The potential drawback of such a method is that it is based on expert opinion. However, in a recent validation study 41, the used appropriateness instrument had 80% agreement with a reference standard that consisted of the modal assessment of 15 medical specialists (infectious diseases specialists and clinical microbiologists). Of importance, the persistence of the effect during the relatively long follow-up period of 12 months suggests good sustainability 47,20. The trend back to baseline in Figure 3 is suggestive but too small and the CI is too wide to interpret this as such. The true effect of our approach can be estimated by extrapolating the results from our point prevalence surveys to all antimicrobial days of therapy prescribed at participating departments during the first 12 months of the intervention period (37 046 days). This would mean that the 13.3% increase in appropriateness equaled 4927 improved days of therapy.

Our study design incorporated an extensive number of repeated measurements, which allowed us to control intervention effects for baseline levels and trajectories. This way we could discern between the effects of our intervention approach and previous events or interventions. By starting the intervention approach at a different time for each department (stepped-wedge design), we minimized the chance that the overall effect was influenced by external events (eg, national campaigns for prudent antimicrobial use.(

The effectiveness of our approach is explained by the advantages of using methods from behavioral science. We hypothesize that participating department members felt relatively nonthreatened by our approach because of their freedom in choosing a personal solution, which is an important theme in antimicrobial stewardship-11.

19,17 Moreover, by committing to the project and choosing and developing their own intervention set, they may have felt more inclined to support the project and change their own prescribing behavior 40 -34,8. This may have been an important intervention in itself. Finally, giving prescribers a free intervention choice could have led to them choosing an easy way out, for instance, choosing education as the only intervention. However, because our approach incorporated a root causes analysis of prescribing, a recommended strategy in stewardship 33 -30,7, prescribers were gently



nudged toward using interventions that were likely to be more effective 48. An approach similar to ours has been unsuccessful in improving antimicrobial prescribing in nursing homes 49. However, among other differences, that study used a predetermined list of possible interventions, which may have limited prescribers' feeling of freedom and diminished support of the aforementioned IKEA effect<sup>36-34</sup>. We found no reduction of antimicrobial consumption in our study. This finding may reflect that overall antimicrobial use is a nonspecific measure without information on appropriateness of therapy. Moreover, an increase in antimicrobial prescribing quality can be reached without a reduction in days of therapy, for instance, by increasing streamlining, better dosing, and using more narrow-spectrum therapy empirically) Table 2 2. (In line with this, we found a significant 26% reduction in the consumption of penicillins with  $\beta$ -lactamase inhibitors, which was the most prescribed type of antibiotic in our population. Alternatively, that finding could suggest that prescribers find it harder to stop or refrain from starting than to narrow antibiotic prescribing because these situations may be more dependent on individual clinical reasoning than on evidence-based guidelines.

The patient safety of our approach was based on the preserved full autonomy of prescribers at all times during the study, which would make a worsening of patient safety unlikely. Our focus on appropriateness had the advantage that it stimulated adherence to multidisciplinary and generally evidence-based guidelines, even when this would lead to more instead of fewer days of therapy. The absence of an increase in length of hospital stay can be seen as circumstantial evidence in this regard.

### **Limitations and Strengths**

Our study has limitations. First, prescribers' awareness of being monitored could have led to a change in behavior (Hawthorne effect). Because they were informed of the study before the start of the baseline measurements, this could have led to diminished intervention effects. Of importance, the department received even more attention from the research team during the start of the intervention phase; thus, the Hawthorne effect would then be even bigger. However, this behavioral phenomenon (ie, personal attention for commitment leads to behavioral change) is in fact a feature not a bug of the intervention approach mechanism.

Second, the stepped-wedge enrollment order was nonrandomized because the approach was dependent on practical circumstances, such as department preferences, room in the educational roster, or availability of department heads and opinion leaders. We believed that adapting to these circumstances superseded the advantages of randomization, especially because this adaption will also be necessary when implementing our approach in practice. Still, although we found no evidence of this, departments could have stalled their participation in the study until they improved their antibiotic prescribing on their own just before intervention start.

Third, the earlier validation study of the antimicrobial appropriateness method was limited to prescriptions for adult patients. However, there was no procedural difference with the method used for the assessment of pediatric prescriptions.

Fourth, execution of our approach in one pediatric department was less fluent, with delayed implementation of some interventions. This was caused by time constraints of the antibiotic ambassador and the department's extensive size. The local effect of the approach on appropriateness mirrored this (eTable 2 in the Supplement, (perhaps reflecting the importance of the ambassador on the effect.



Fifth, the Dutch health care system differs from other systems, which may limit generalizability. However, our results were achieved regardless of specialists' payment structure because we included both salaried (hospital 1) and self-employed specialists (hospital 2).

Sixth, a potential weakness of a stepped-wedge design is contamination of the intervention; thus, information or effects of departments in the intervention period could have influenced departments still in the baseline period. Although this effect cannot be excluded, to our knowledge, there were no physicians who transferred between participating departments in this period.

Our approach offers good potential for implementation in other hospitals, even in resource-challenged circumstances, because it adapts to local possibilities, requires no expensive investments, and is successful in surgical, medical, and pediatric settings. The root cause analysis method was relatively simple and pragmatic and was performed without help from quality improvement personnel. Our study was performed with a minimal budget, comprising the salary of 1 research physician and an estimated 3 hours per week of infectious diseases specialist efforts for 3 years. Of importance, for practical implementation without research objectives, many (but not all) of our time-consuming appropriateness measurements may then be omitted. On the other hand, a bigger financial budget may increase effectiveness because more expensive desired interventions, such as mobile applications, could then be implemented.

## CONCLUSIONS

Use of a participatory approach based on behavioral theory with a central focus on prescriber autonomy resulted in an increase in antimicrobial appropriateness sustained for at least 12 months. The approach is unique, inexpensive, and suited to different types of hospital departments.

## Article Information

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*Study concept and design* :Sikkens, van Agtmael, Peters, Vandenbroucke-Grauls, Wagner, Kramer.

*Acquisition, analysis, or interpretation of data* :Sikkens, van Agtmael, Peters, Lettinga, van der Kuip.

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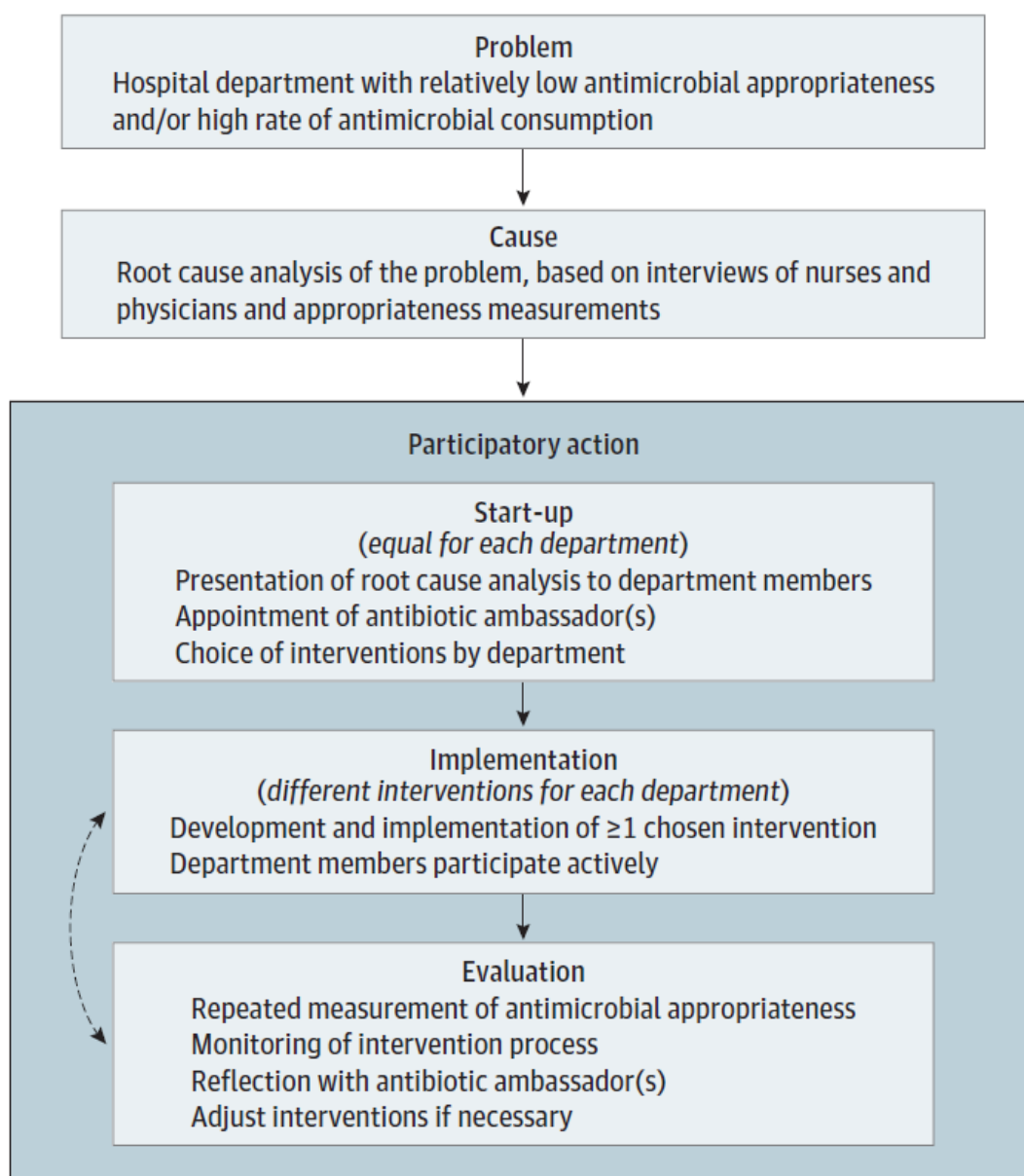


## TABLES AND FIGURES





Figure 1. Intervention Approach Used in the Current Study



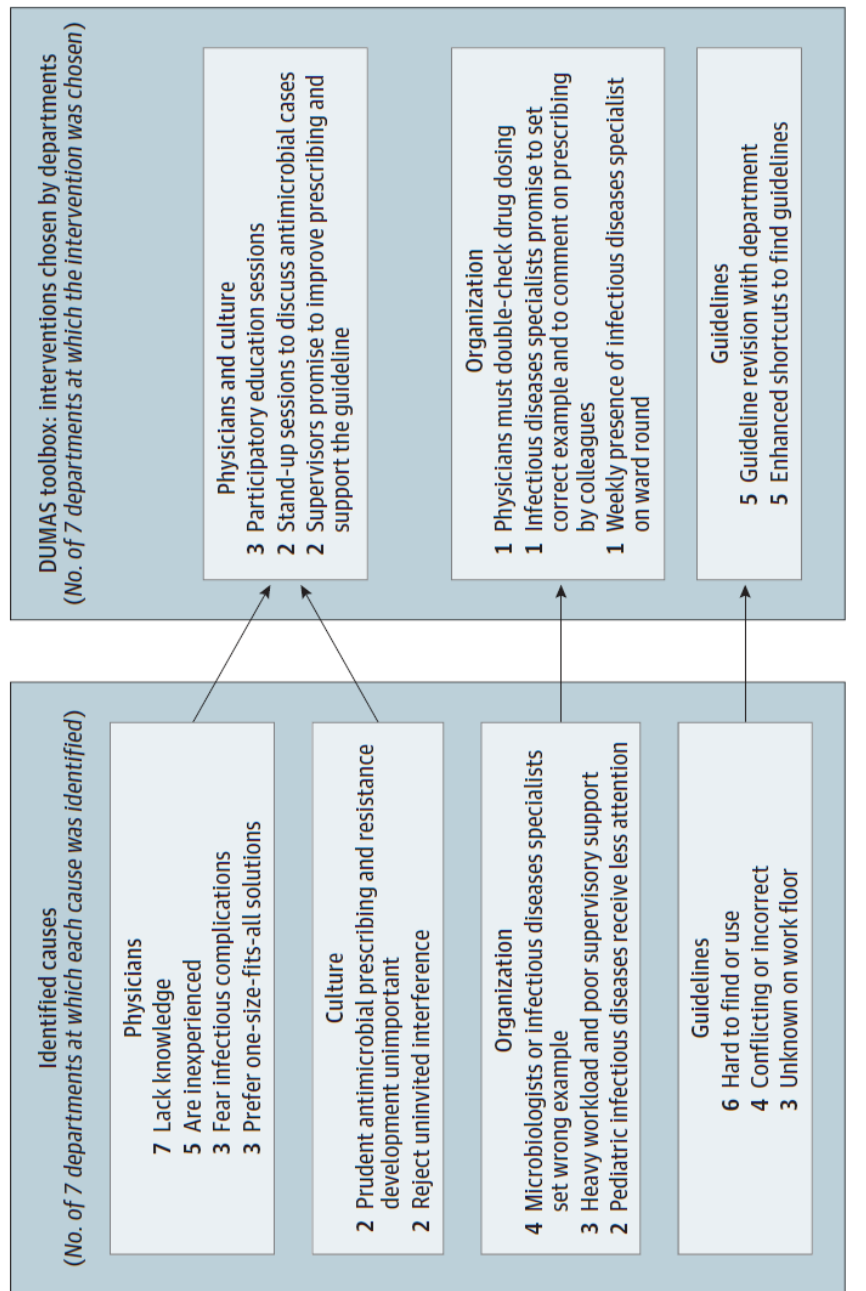


**Table 1. Patient and Point Prevalence Survey Characteristics During the Baseline (16 Months) and Intervention Periods (12 Months)<sup>a</sup>**

Characteristic	Baseline Period	Intervention Period
No. of patients admitted to participating departments (range of total patients per department)	21 306 (726-7501)	15 934 (505-5741)
No. of patients included in point prevalence surveys	1121	882
Patients with at least 1 antimicrobial prescription	459 (40.9)	346 (39.2)
No. of prescriptions in point prevalence surveys	700	531
Exclusion because of incomplete information or used as prokinetic	12 (1.7)	7 (1.3)
Prophylactic indication	114 (16.6)	67 (12.8)
Medical	84 (12.2)	47 (9.0)
Surgical	30 (4.4)	20 (3.8)
Therapeutic indication	574 (83.5)	456 (87.2)
Respiratory tract infection	143 (24.9)	145 (31.8)
Urinary tract infection	32 (5.6)	35 (7.7)
Soft-tissue infection	79 (13.8)	59 (12.9)
Intra-abdominal infection	48 (8.4)	54 (11.8)
Intravascular infection	19 (3.3)	20 (4.4)
Sepsis due to other cause	146 (25.4)	76 (16.7)
Other indication	107 (18.6)	67 (14.7)

<sup>a</sup> Data are presented as number (percentage) of patients unless otherwise indicated.

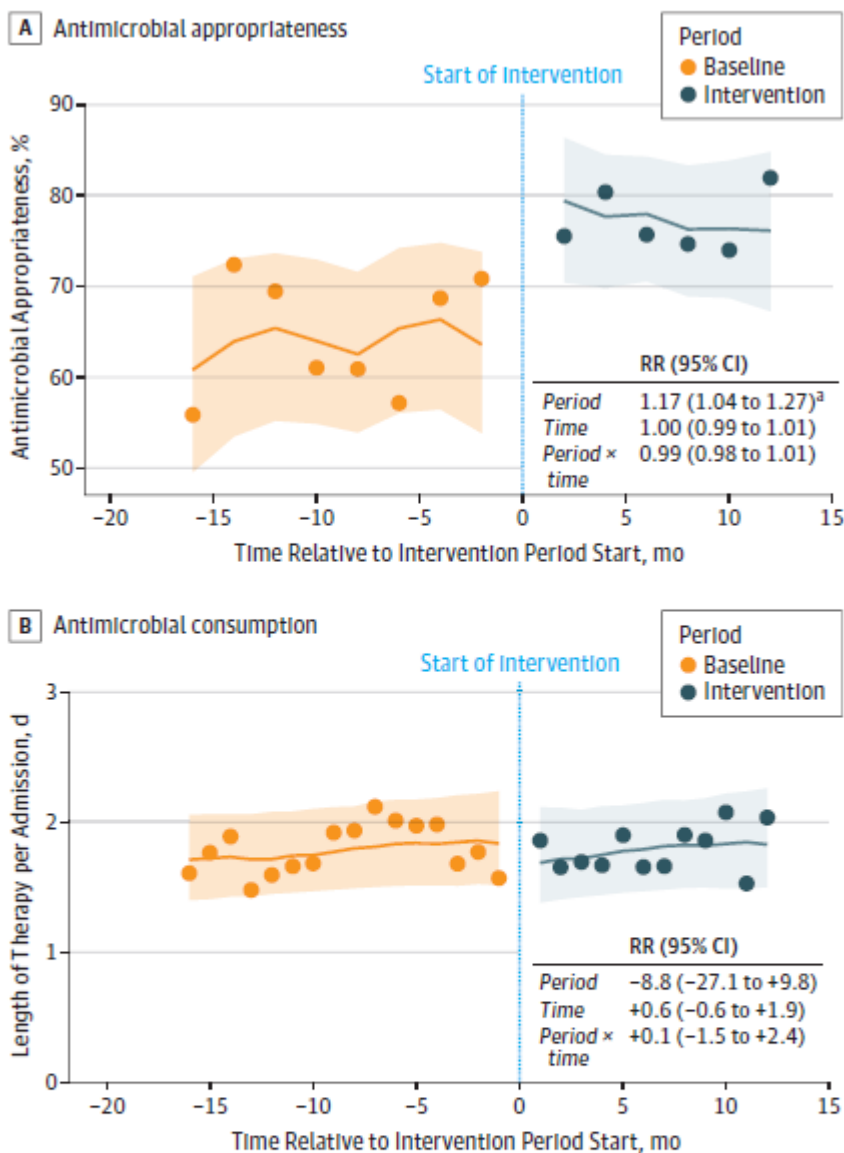
Figure 2. Summary of the Root Cause Analyses and Interventions Chosen by the Departments to Improve Their Prescribing



DUMAS indicates Dutch Unique Method for Antimicrobial Stewardship.



**Figure 3. Antimicrobial Appropriateness and Consumption**



A, Antimicrobial appropriateness relative to the start of the intervention phase and logistic mixed-model regression analysis. Mean antimicrobial appropriateness increased 13.3%, from 64.1% at intervention start to 77.4% at 12-month follow-up. B, Antimicrobial consumption in days of therapy per admission relative to the start of the intervention phase and logistic mixed-model regression analysis. Points represent results from the point prevalence surveys; lines, predicted means from the regression analysis; and shaded area, 95% CIs around these predicted means. RR indicates relative risk.

<sup>a</sup> The RR was significantly different from 1 at the .05 level.

Table 2. Point Prevalence Survey Outcomes During Baseline (16 Months) and Intervention Periods (12 Months)

Outcome	Total Within Period, %		Absolute Difference	RR or Relative Difference (95% CI)
	Baseline Period	Intervention Period		
Appropriate overall	64.1	77.4	13.3	1.16 (1.11 to 1.23) <sup>a</sup>
Inappropriate, per category				
Antimicrobial unnecessary	6.6	1.5	-5.2	0.24 (0.08 to 0.45) <sup>a</sup>
Inappropriate choice	11.2	8.0	-3.2	0.62 (0.42 to 0.90) <sup>a</sup>
Inappropriate dose	11.4	6.1	-5.4	0.56 (0.35 to 0.80) <sup>a</sup>
Inappropriate administration	1.8	2.0	0.2	1.19 (0.43 to 2.57) <sup>a</sup>
Excessive duration	4.4	4.9	0.5	1.11 (0.64 to 1.83) <sup>a</sup>
Antimicrobial consumption in days of therapy or admission				
Overall	2.00	2.02	0.03	1.2 (-14.7 to 19.9) <sup>b</sup>
Intravenous only	1.21	1.28	0.07	5.8 (-8.4 to 22.7) <sup>b</sup>
By antimicrobial group				
Penicillin without BL inhibitor	0.38	0.41	0.03	8.4 (-13.8 to 36.6) <sup>b</sup>
Penicillin with BL inhibitor	0.50	0.37	-0.13	-26.3 (-41.1 to -8.4) <sup>b</sup>
Cephalosporin (first or second generation)	0.01	0.01	-0.00	-15 (-56.5 to 66.5) <sup>b</sup>
Cephalosporin (third generation)	0.25	0.31	0.06	22.7 (4.8 to 43.2) <sup>b</sup>
Carbapenem	0.00	0.01	0.00	24.2 (-74.8 to 519.1) <sup>b</sup>
Quinolone	0.09	0.07	-0.02	-22.8 (-49.3 to 17.3) <sup>b</sup>
Clindamycin	0.01	0.01	-0.00	-11.8 (-51.8 to 62.4) <sup>b</sup>
Aminoglycoside	0.03	0.03	-0.00	-12.3 (-49.7 to 51.1) <sup>b</sup>
Trimethoprim with or without sulfonamide	0.02	0.02	0.00	11.2 (-47.8 to 137.0) <sup>b</sup>
Other antibiotic	0.21	0.24	0.02	11.8 (-22.6 to 59.9) <sup>b</sup>
Antifungal or antiviral	0.05	0.02	-0.03	-57.2 (-81.3 to -1.6) <sup>b</sup>

Abbreviations: BL,  $\beta$ -lactamase; RR, relative risk.

<sup>a</sup> Relative risk for appropriateness.

<sup>b</sup> Relative difference.

