

# Factors associated with the appropriateness of antibiotics prescribed in French general practice: a cross-sectional study using reimbursement databases

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# ▶ To cite this version:

Maïa Simon, Nathalie Thilly, Ouarda Pereira, Céline Pulcini. Factors associated with the appropriateness of antibiotics prescribed in French general practice: a cross-sectional study using reimbursement databases. Clinical Microbiology and Infection, 2021, 28 (4), pp.609.e1-609.e6. 10.1016/j.cmi.2021.08.026. hal-03557434

# HAL Id: hal-03557434 https://hal.univ-lorraine.fr/hal-03557434v1

Submitted on 22 Jul 2024

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Version of Record: https://www.sciencedirect.com/science/article/pii/S1198743X21004882 Manuscript\_87a4a1f19fd1be22ecafd0e4a7ac6ead

## 1 ORIGINAL ARTICLE

2 Factors associated with the appropriateness of antibiotics prescribed in French general

## 3 practice: a cross-sectional study using reimbursement databases

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#### 16 ABSTRACT

**Objectives** – Identifying characteristics associated with the appropriateness of antibiotic prescriptions is useful to guide antibiotic stewardship interventions. Proxy indicators estimating the appropriateness of antibiotic prescriptions at the general practitioner (GP) level have recently been validated. Our objectives were to identify (i) clusters of GPs according to their appropriateness score based on these proxy indicators results, and (ii) GPs', patients' and practices' characteristics associated with inappropriate prescriptions.

Methods – We conducted a cross-sectional observational study analysing antibiotics prescribed by GPs in one large French region in 2019, using the Health Insurance databases. We identified clusters of GPs according to their appropriateness score calculated from 10 proxy indicators' results. We then analysed the association between the clusters with more inappropriate practices as compared to the one with less inappropriate practices, and GPs', patients', and practices' characteristics. We performed bivariate and multivariable analyses using logistic polytomous regressions.

**Results** – We included 4,819 GPs who were grouped into three clusters. GPs who belong to the clusters with more inappropriate practices were more likely to practice in certain geographical area, to be male, not to have a particular medical practice, to be practicing for longer, to have more patients and consultations, to have a higher proportion of elderly patients, and to prescribe more drugs, more antibiotics and a higher proportion of broad-spectrum antibiotics.

34 Conclusion – We identified clusters of practice as well as factors associated with the appropriateness
 35 of antibiotic prescriptions, using routinely collected data. This might help guide antibiotic
 36 stewardship interventions.

37

38 Keywords: antimicrobial stewardship; general practitioners; antibiotic prescriptions; clusters;
 39 appropriateness; characteristics; quality of care.

40

#### 41 INTRODUCTION

Antimicrobial resistance is a rising threat to global health, and is accelerated by the misuse and overuse of antibiotics in humans and animals.[1] In France, around 125,000 persons are infected by multidrug-resistant bacteria each year, causing 5,500 deaths.[2] Seventy-eight percent of antibiotics are prescribed in primary care in France, with 70% of those being prescribed by general practitioners (GPs).[3]

Antimicrobial stewardship (AMS) has been defined as a "coherent set of actions which promote using antimicrobials responsibly".[4] Metrics are important AMS tools to set targets for improvement and give a feedback to professionals and stakeholders. Indications/diagnoses are required to calculate quality indicators, but computerized national systems linking drug prescriptions to indications/diagnoses are rarely available.[5] In this context, we recently developed 10 proxy indicators (PIs) calculable from routine databases, estimating the appropriateness of antibiotic prescriptions at GP level without requiring indications/diagnoses.[6]

Identifying factors associated with the appropriateness of antibiotic prescriptions is useful to guide AMS interventions. However, in the literature, few studies aimed at identifying such factors in general practice.[7–10] **Supplementary Table S1** summarises the four identified studies, all conducted more than five years ago.

58 Our objectives were to identify, based on routinely collected data (i) clusters of GPs 59 according to their appropriateness score based on PIs results, and (ii) GPs', patients' and practices' 60 characteristics associated with inappropriate prescriptions (by comparing clusters with more 61 inappropriate practices with the one with less inappropriate practices).

#### 62 METHODS

#### 63 Study setting and population

GPs were selected from the Health Insurance databases. We included GPs practicing in the Grand Est region of France (66,524,000 inhabitants in France and 5,550,000 inhabitants in the Grand Est region, according to the 2017 census[11]), who took care of at least 100 different patients in 2019 and prescribed at least 10 antibiotic treatments during the year. We excluded GPs who had an exclusive particular medical practice during the year (e.g. homeopathy, acupuncture).

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#### 70 Study design

We conducted a retrospective cross-sectional observational study analysing antibiotics
 prescribed by eligible GPs and dispensed by a community pharmacy in 2019.

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#### 74 Data source

75 In France, all antibiotics are prescribed and reimbursed. The Health Insurance databases link 76 the prescriber and the patient identification numbers to the antibiotics dispensed by community 77 pharmacies, the prescriber specialty and his/her main characteristics and the patients' characteristics 78 (e.g. age, gender, chronic diseases, low income). Dispensing was used as a proxy for prescription as 79 information on prescriptions is not available. The term "antibiotic prescription" refers here to an 80 antibiotic course, whatever the duration of treatment. When two different antibiotics were 81 prescribed by a GP and dispensed on the same day, they were counted separately. As mentioned 82 previously, indications/diagnoses related to a prescription are not available in these databases.

83

#### 84 **Proxy indicators (PIs)**

To overcome the absence of indications/diagnoses in the Health Insurance databases, Thilly et al. developed 10 PIs estimating the appropriateness of antibiotic prescriptions at GP level, 87 calculable from routine Health Insurance databases.[6] These PIs were based on a literature review
88 and used national guidelines as a reference.[12]

Each PI was associated with targets set to reflect the appropriateness of antibiotic prescriptions: the optimal target aims at 100% compliance with national guidelines, while the acceptable target is less restrictive and takes into account that guidelines are not applicable to all patients. These targets were used to calculate the performance for each PI, which is the percentage of GPs who reach the defined target.

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**Supplementary Table S2** presents these 10 PIs, their definition and targets.

95

#### 96 Cluster analysis

97 For each GP, an appropriateness score expressed as a percentage was calculated as followed: 98 [(number of PIs applicable for the GP and for whom the acceptable target is reached) / (number of 99 PIs applicable for the GP)] x 100. A PI was considered applicable if it was based on at least 10 clinical 100 situations per year for the GP. A cluster analysis was conducted to group GPs according to their 101 appropriateness score, reflecting the appropriateness of their antibiotic prescribing practices. The 102 Ward method was used, linking clusters according to the degree of similarity between observations 103 in the same cluster.

104

#### 105 Statistical analyses

106 GPs' and patients' characteristics, as well as GPs' practices, explored for their potential 107 association with inappropriate practices are presented in **Supplementary File S3**.

Pls' results were first calculated for each GP and presented as medians with the interquartile range (IQR: lower quartile; upper quartile). Performances were calculated for each PI and presented as percentages. The cluster analysis was then conducted using a hierarchical clustering method to identify clusters of GPs according to their practices' appropriateness, estimated from their appropriateness score. For each cluster, the median appropriateness score with the IQR and theperformances for each PI were presented.

Comparisons of GPs' and patients' characteristics between the previously identified clusters 114 115 were performed using Chi-square tests for categorical variables (expressed as percentages) and 116 Kruskal-Wallis tests for continuous variables (expressed as medians and IQR). Characteristics 117 identified with p value < 0.10 in bivariate analyses were then introduced in a multivariable polytomous logistic regression model to identify characteristics significantly associated with the 118 119 clusters having more inappropriate practices as compared with the one with less inappropriate 120 practices (used as the reference), taking into account other characteristics. When two identified characteristics were highly collinear, we excluded from the model the one with the higher p-value in 121 122 the bivariate analysis.

123 Comparisons of practices' characteristics between clusters was restricted to bivariate 124 analyses (as described for GPs and patients' characteristics), because of high collinearity between the 125 six considered variables.

For all final analyses, a p-value < 0.05 for two-sided tests was considered significant. Analyses</li>
 were performed with SAS Enterprise Guide version 7.15 (SAS Institute Inc., Cary, N.C., USA).

128

#### 129 Ethical statement

This is a retrospective observational study which did not modify the medical care of patients. Anonymity was preserved for both patients and prescribers. According to the French law, ethical approval was therefore not required.

#### 133 **RESULTS**

#### 134 Characteristics of GPs and their patients

Of the 6,041 GPs practicing in the Grand Est region, 1,187 GPs took care of less than 100 135 136 different patients in 2019 or prescribed less than 10 antibiotics during the year, and 35 GPs had an 137 exclusive particular medical practice. We therefore included in this study 4,819 GPs who met the 138 inclusion criteria. Their mean age was 53  $\pm$  11.6 years and 63% were male. They took care, on average, of 1,471 ± 736 different patients in 2019, with 4,957 ± 2,521 consultations. The 4,819 139 140 included GPs prescribed in 2019 a total of 2,950,425 antibiotic treatments that were dispensed to 141 1,962,654 different patients. Regarding the characteristics of these patients, 45% were male, 20% 142 were aged < 16 years and 19% > 65 years, 0.8% lived in a nursing home, 14% had a chronic disease 143 and 10% were in the low-income category.

144

#### 145 Appropriateness of antibiotic prescriptions

Results about the 10 PIs are presented in **Table 1.** The performance results were not optimal, varying between 15.3% (PI 4) and 88.5% (PI 2). Substantial variations in prescribing were noticed (large IQR).

149

#### 150 Cluster analysis

151 Three clusters of GPs were identified. **Table 2** presents the description of the three clusters 152 and their performances for each PI.

153

#### 154 GPs' and patients' characteristics

**Table 3** presents GPs' and patients' characteristics for each of the three clusters and their comparisons in bivariate analyses. All GPs' characteristics were significantly associated with the clusters, except for the practice setting. All patients' characteristics were significantly associated with the clusters, except for the percentage of patients with low income. **Table 4** presents results of the multivariable analysis evaluating the association between GPs' and patients' characteristics and inappropriate practices (cluster 2 and cluster 3 versus cluster 1). All GPs' characteristics included in the model were significantly associated with the clusters with a gradient in the associations (OR in cluster 3 > OR in cluster 2 > OR in cluster 1 (= 1), except for gender).

#### 164 GPs' practices

**Table 5** describes GPs' practices for each of the three clusters and their comparisons in bivariate analyses. All the investigated characteristics were significantly associated with inappropriate practices, with a gradient in the associations except for the attainment of the target for the variable "number of antibiotic prescriptions per 100 patients aged 16 to 65 years old without a chronic disease per year". 170 **DISCUSSION** 

171

#### 172 Summary of the main findings

We identified three clusters of GPs reflecting the appropriateness of their antibiotic prescriptions: 15% of GPs with better than average practices, 33% with average practices and 52% with worse than average practices. Almost all GPs' and patients' characteristics were associated with the appropriateness of practices. Several quantity metrics reflecting the volume of drugs and antibiotics prescribed by GPs were also associated with these clusters.

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We identified several GPs' characteristics strongly associated with the appropriateness of prescriptions. We showed significant differences of practices across the geographic areas, that might be explained by different factors to be investigated, for example different medical density.[13] Female GPs were more likely to belong to the cluster with better than average practices. It has been shown that male GPs participate less in postgraduate training in France.[14] GPs with a particular medical practice were more likely to belong to the cluster with better practices. They may use more alternatives to drugs for self-limiting infections, and thus prescribe less antibiotics.

GPs who had been in practice longer were more likely to prescribe inappropriately as it has been shown previously.[7,15] Physicians who had been in practice longer may be less likely to adhere to standards of appropriate therapy [16], whereas younger GPs may be more aware and educated on antimicrobial resistance and stewardship.

We also found an association between a higher number of consultations per month and a higher risk of inappropriateness of antibiotic prescriptions. As it has been shown in the literature, a high number of consultations could reflect short consultation durations.[7,17] In this case, it might be too time-consuming for GPs to educate patients and to explain to them why they do not need an antibiotic.[17,18] Shorter consultation duration or higher workload could also lead to less exhaustive clinical examination and thus contribute to diagnostic uncertainty, with GPs prescribing moreantibiotics and notably more broad-spectrum agents to avoid risks.[18]

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Overall, patients' characteristics were associated with the appropriateness of practices, except for the percentage of patients with low income. The National Health Insurance usually reimburses 65% of the cost of antibiotics in France, with 100% of the costs covered in case of low income and almost all other patients having a complementary insurance covering the remaining costs.

The percentage of patients < 16 years old and the percentage of patients > 65 years old were highly collinear (r = - 0.64): the more patients < 16 years old the GP had, the less patients > 65 years old s/he had and *vice-versa*. Both variables were significantly associated with the appropriateness of prescriptions when they were selected individually in the multivariable model. Results show a global effect of patients' age with a gradient: practices are more inappropriate for older patients.

The percentage of patients with chronic diseases and the percentage of patients > 65 years old were also highly collinear (r = 0.79): patients aged 65 and more are indeed more likely to have chronic diseases. When we removed the percentage of patients < 16 years old and percentage of patients > 65 years old variables from the multivariable model, the percentage of patients with chronic diseases was significantly associated with the appropriateness of prescriptions.

213 Older patients are more likely to have chronic diseases. Among other potential contributing 214 factors, GPs might be more likely to prescribe antibiotics to prevent potential bacterial 215 superinfections.[19]

216

We also looked at the association between the appropriateness of antibiotic prescribing and quantity metrics commonly used in France to describe the volume of drugs and antibiotics prescribed by GPs. GPs were more likely to belong to the clusters with average or worse than average practices when they prescribed more drugs, more antibiotics, and a higher proportion of broad-spectrum antibiotics. More appropriate antibiotic prescribing practices seem therefore associated with more prudent use of drugs in general. Our results also suggest that targeting GPs with high total antibiotic use, when other more refined screening methods are not available, seems acceptable. These results are in line with the literature.[20]

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### Comparison with existing literature

The few published studies aiming at identifying factors associated with the appropriateness of antibiotic prescriptions in general practice are summarised in **Supplementary Table S1**.[7–10] In three of the four studies, clinical indications were needed to define the appropriateness of antibiotic prescriptions. Some of the characteristics we identified as associated with the appropriateness of antibiotic prescriptions were also identified in at least one of these studies: number of years of practice, number of patients, patients' age.

233

#### 234 Strenghts and limitations

235 This work brings innovative findings. We believe that the method we used to identify clusters 236 and explore characteristics associated with the estimated appropriateness of antibiotic prescriptions 237 might be replicated in other countries, by adapting the PIs and their targets to the national 238 prescribing guidelines. However, we acknowledge that our study has several limitations. First, the PIs 239 cannot directly assess the appropriateness of each antibiotic prescription, i.e. the adherence to 240 antibiotic prescribing guidelines per indication, as they are calculated without data on 241 indications/diagnoses. Second, while content and clinimetric validities have been assessed [6], a 242 structured consensus procedure is currently ongoing in France, piloted by health authorities, to 243 confirm the face validity of our 10 PIs by a large group of stakeholders. So, the relevance and the 244 understanding of each PI (definition and target) are not yet definitively validated. Third, the present investigation allowed us to identify associations between GPs', patients' and practices' characteristics 245 246 and the appropriateness of antibiotic prescriptions but we cannot exclude that the associations we

found might be due to other unexplored factors. For example, the association between gender and appropriateness might be the consequence of a higher participation in postgraduate training among female GPs in France.

250

#### 251 *Implications*

252 Such a cluster analysis may be used to guide AMS interventions. For example, the "worse 253 than average" cluster might benefit from high-intensity AMS interventions and the situations 254 covered by the different proxy indicators might help design tailored messages as already suggested 255 previously (e.g. reducing durations of antibiotic prescriptions according to national guidelines for PI 256 8).[6] In addition, identifying the GPs and practices' characteristics associated with the 257 appropriateness of antibiotic prescriptions can help to select GPs to target in priority for AMS 258 interventions. For example, in our sample of GPs from the Grand Est region of France, GPs who need 259 to improve their antibiotic prescriptions the most are male who have been in practice longer, in 260 certain geographical areas, who do not have a particular medical practice and who had a higher 261 number of consultations per month.

262

In conclusion, several characteristics related to GPs, their patients, and their practices were associated with the estimated appropriateness of their antibiotic prescriptions. Identifying such characteristics as well as clusters of GPs was easily done based on routine reimbursement data and might help guide antibiotic stewardship interventions, with the overall objectives of improving the quality of care and reducing antibiotic resistance.

268	TRANSPARENCY DECLARATION
269	All authors: no conflicts of interest to declare.
270	
271	FUNDING
272	This research did not receive any specific grant from funding agencies in the public, commercial, or
273	not-for-profit sectors.
274	
275	ACKNOWLEDGEMENTS
276	The authors would like to thank Dr Odile Blanchard, director of the DRSM Grand Est, for her support.
277	
278	CONTRIBUTION
279	Conceptualization: CP
280	Methodology: CP, NT, OP, MS
281	Software and formal analysis: OP
282	Writing – Original draft: MS

283 Writing – Review and Editing: CP, NT, OP

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Table 1. Results for the 10 proxy indicators estimating the appropriateness of antibiotic prescriptions by general practitioners (GPs) of the Grand Est region in north-eastern France in 2019 (n = 4,819 GPs).

Proxy indicator (PI) [6]	Median	IQR (1 <sup>st</sup> quartile ; 3 <sup>rd</sup> quartile)	Acceptable target value	Performance (% of GPs who reached the target)
Pl 1 Antibiotic prescriptions against urinary tract infections in men (ratio)	0	0.0 ; 0.3	< 0.5	82.5
PI 2 Antibiotic prescriptions against urinary tract infections in women (ratio)	3.8	2.0 ; 7.0	>1	88.5
PI 3 Repeated prescription of quinolones (%)	13.0	5.0 ; 21.1	< 10%	38.5
PI 4 Seasonal variation of total antibiotic prescriptions (%)	45.0	29.2 ; 62.5	< 20%	15.3
PI 5 Seasonal variation of quinolone prescriptions (%)	28.6	-9.1 ; 80.0	< 10%	38.0
PI 6 Amoxicillin / second-line antibiotics prescriptions (ratio)	0.9	0.5 ; 1.3	>1	40.0
PI 7 Prescriptions of not indicated antibiotics (%)	1.1	0.4 ; 2.2	< 0.5%	29.7
PI 8 Estimated duration of antibiotic prescriptions > 8 days (%)	3.9	2.1 ; 6.9	< 10%	86.5
PI 9 Co-prescription of antibiotic and systemic non-steroidal anti- inflammatory drugs (%)	9.9	5.3 ; 16.6	< 5%	23.2
PI 10 Co-prescription of antibiotic and systemic corticosteroids (%)	12.3	6.8 ; 20.3	< 5%	15.9

Table 2. Description of the three clusters reflecting the appropriateness of antibiotic practices and their performances for the 10 proxy indicators (n = 4,819 GPs).

		Cluster 1 "Better than average practices" N = 709 GPs (14.7%)	Cluster 2 "Average practices" N = 1,574 GPs (32.7%)	Cluster 3 "Worse than average practices" N = 2,536 GPs (52.6%)
		Appropriateness score <sup>a</sup> : 71.4 (70.0 ; 80.0)	Appropriateness score <sup>a</sup> : 55.6 (50.0 ; 60.0)	Appropriateness score <sup>a</sup> : 30.0 (30.0 ; 40.0)
Proxy indicator (PI) [6]	Target value	Performa	inces (% of GPs who reached t	he target)
PI 1 Antibiotic prescriptions against urinary tract infections in men	< 0.5	97.8	94.9	70.5
PI 2 Antibiotic prescriptions against urinary tract infections in women	> 1	95.9	96.1	82.0
PI 3 Repeated prescription of quinolones	< 10%	76.0	53.5	19.5
PI 4 Seasonal variation of total antibiotic prescriptions	< 20%	43.2	18.3	6.0
PI 5 Seasonal variation of quinolone prescriptions	< 10%	64.2	51.7	23.4
PI 6 Amoxicillin / second-line antibiotics prescriptions	>1	75.2	58.3	18.8
PI 7 Prescriptions of not indicated antibiotics	< 0.5%	76.9	39.6	10.3
PI 8 Estimated duration of antibiotic prescriptions > 8 days	< 10%	91.3	91.4	82.2
PI 9 Co-prescription of antibiotic and systemic non-steroidal anti-inflammatory drugs	< 5%	69.1	28.6	6.9
PI 10 Co-prescription of antibiotic and systemic corticosteroids	< 5%	44.6	18.3	6.3

<sup>a</sup> The appropriateness score is expressed as a percentage, displayed using medians (1<sup>st</sup> quartile ; 3<sup>rd</sup> quartile) and calculated as [(number of PIs applicable for each GP and for whom the acceptable target is reached) / (number of PIs applicable for each GP)] x 100.

# Table 3. Description of GPs' and patients' characteristics for the three identified clusters – Bivariate analyses (n = 4,819 GPs).Bold indicates a p-value < 0.05.</td>

	Characteristics	Cluster 1 "Better than average practices" N = 709 GPs (14.7%)	Cluster 2 "Average practices" N = 1,574 GPs (32.7%)	Cluster 3 "Worse than average practices" N = 2,536 GPs (52.6%)	p-value
GPs' characteristics					
	08 Ardennes	13.3	37.8	48.9	_
	10 Aube	9.6	36.8	53.6	
	51 Marne	25.1	39.0	35.9	_
	52 Haute-Marne	8.3	22.6	69.2	_
Geographic area	54 Meurthe-et-Moselle	20.3	35.5	44.2	_
%	55 Meuse	13.8	34.8	51.5	- <b>&lt; 0.0001</b> - -
	57 Moselle	12.6	28.7	58.7	
	67 Bas-Rhin	11.3	29.8	59.0	
	68 Haut-Rhin	13.3	32.2	54.5	
	88 Vosges	15.1	35.6	49.4	_
GP's gender	Male	11.7	28.6	59.7	4.0.0001
%	Female	19.9	39.3	40.9	- < 0.0001
Particular medical	Yes	32.2	32.6	35.3	
practice %	No	13.7	32.7	53.6	- <0.0001
	Rural (< 5,000 inhabitants)	14.5	32.3	53.3	
Practice setting %	Suburban (5,000 – 20,000 inhabitants)	14.0	31.2	54.8	0.108
/0	Urban (> 20,000 inhabitants)	15.8	34.5	49.8	_

<b>Number of years of practice (2019 - installation date)</b> Median (1 <sup>st</sup> quartile ; 3 <sup>rd</sup> quartile)	8 (2 ; 25)	15 (5 ; 28)	24.5 (13 ; 32)	< 0.0001
Number of patients (in 2019) Median (1 <sup>st</sup> quartile ; 3 <sup>rd</sup> quartile)	1257 (871 ; 1709)	1397 (1029 ; 1815)	1399 (1039.5 ; 1847.5)	< 0.0001
Number of consultations per month Median (1 <sup>st</sup> quartile ; 3 <sup>rd</sup> quartile)	310.3 (219.8 ; 420.0)	376.2 (282.1 ; 497.4)	427.6 (315.4 ; 565.4)	< 0.0001
Patients' characteristics				
% of patients with chronic diseases Median (1 <sup>st</sup> quartile ; 3 <sup>rd</sup> quartile)	13.2 (10.6 ; 16.0)	13.1 (10.9 ; 15.8)	13.8 (11.5 ; 16.8)	< 0.0001
% of patients with low income Median (1 <sup>st</sup> quartile ; 3 <sup>rd</sup> quartile)	6.5 (3.3 ; 13.1)	6.5 (3.5 ; 12.6)	6.6 (3.3 ; 12.5)	0.815
<b>% of patients &lt; 16 years old</b> Median (1 <sup>st</sup> quartile ; 3 <sup>rd</sup> quartile)	21.0 (16.1 ; 25.4)	19.8 (15.4 ; 23.9)	17.8 (13.8 ; 21.6)	< 0.0001
<b>% of patients &gt; 65 years old</b> Median (1 <sup>st</sup> quartile ; 3 <sup>rd</sup> quartile)	18.5 (13.1 ; 24.7)	18.7 (13.7 ; 24.5)	19.8 (14.9 ; 25.5)	< 0.0001

Table 4. Association between the GPs' and patients' characteristics and the identified clusters – Multivariable polytomous logistic analysis (n = 4,819 GPs). The following variables were not included since they were highly collinear with included variables: number of patients (collinear with the number of consultations per month, r = 0.71); and percentage of patients > 65 years old (collinear with the percentage of patients with chronic diseases, r = 0.79). The variable percentage of patients with chronic diseases was removed from the model because of its non-significance (p = 0.131). The reference class is Cluster 1 "better than average practices". Bold indicates a p-value < 0.05.

For example, cluster 3 ("worse than average practices") included 23% more men than cluster 1 ("better than average practices"). The variables percentage of patients < 16 years old, percentage of patients > 65 years old and percentage of patients with chronic disease were moderately to highly collinear (percentage of patients < 16 years old and percentage of patients with chronic disease (r = -0.53); percentage of patients < 16 years old and percentage of patients > 65 years old and percentage of patients with chronic disease (r = -0.53); percentage of patients < 16 years old and percentage of patients > 65 years old and percentage of patients with chronic disease (r = -0.53); percentage of patients < 16 years old and percentage of patients > 65 years old and percentage of patients with chronic disease (r = 0.79)). However, when we selected only one of these three variables in the model at a time, they were all significantly associated with inappropriate practices.

		MULTIVARIABLE ANALYSIS				
		Cluster 2 "average practi	ces"	Cluster 3 "worse than average practices"		
Characteristics		VS Cluster 1 "better than average practices"		VS Cluster 1 "better than average practices"		
		Odd Ratio (95% confidence interval)	p-value	Odd Ratio (95% confidence interval)	p-value	
	08 Ardennes	1.58 (0.98 ; 2.55)	0.063	1.92 (1.17 ; 3.15)	0.010	
	10 Aube	2.52 (1.45 ; 4.38)	0.001	3.80 (2.17 ; 6.66)	< 0.0001	
	51 Marne	1 (reference)	-	1 (reference)	-	
	52 Haute-Marne	1.60 (0.76 ; 3.35)	0.216	5.18 (2.58 ; 10.40)	< 0.0001	
Coographic area	54 Meurthe-et-Moselle	1.19 (0.87 ; 1.64)	0.280	1.35 (0.97 ; 1.89)	0.075	
Geographic area	55 Meuse	1.43 (0.79 ; 2.57)	0.238	1.91 (1.05 ; 3.45)	0.033	
	57 Moselle	1.24 (0.89 ; 1.73)	0.213	2.17 (1.55 ; 3.05)	< 0.0001	
	67 Bas-Rhin	1.75 (1.28 ; 2.38)	0.0004	3.45 (2.51 ; 4.73)	< 0.0001	
	68 Haut-Rhin	1.74 (1.22 ; 2.48)	0.002	2.99 (2.08 ; 4.30)	< 0.0001	
	88 Vosges	1.54 (1.01 ; 2.35)	0.043	2.02 (1.32 ; 3.11)	0.001	
CP/s gondon	Male	0.92 (0.76 ; 1.12)	0.92 (0.76 ; 1.12) 0.411		0.040	
GP's gender	Female	1 (reference)	-	1 (reference)	-	
)articular modical practice	Yes	1 (reference)	-	1 (reference)	-	
Particular medical practice	No	2.20 (1.57 ; 3.08)	< 0.0001	4.30 (3.00 ; 6.18)	< 0.0001	
lumber of years of practice	(2019 - installation date) a	1.03 (1.02 ; 1.03)	< 0.0001	1.05 (1.04 ; 1.06)	< 0.0001	
Number of consultations per	month <sup>b</sup>	1.003 (1.002 ; 1.003)	< 0.0001	1.004 (1.003 ; 1.005)	< 0.0001	

% of patients < 16 years old $^{\circ}$	0.99 (0.98 ; 1.00)	0.126	0.95 (0.94 ; 0.97)	< 0.0001

<sup>a</sup> increased risk of being in cluster 2 or 3 (as compared to cluster 1) per additional year of practice.

<sup>b</sup> increased risk of being in cluster 2 or 3 (as compared to cluster 1) per additional consultation per month.

<sup>c</sup> increased risk of being in cluster 2 or 3 (as compared to cluster 1) per 1% more patients.

# 1 Table 5. Description of GPs' practices according to the identified clusters – Bivariate analyses (n = 4,819 GPs).

2 Bold indicates a p-value < 0.05.

Variables		Cluster 1 "Better than average practices" N = 709 GPs (14.7%)	Cluster 2 "Average practices" N = 1,574 GPs (32.7%)	Cluster 3 "Worse than average practices" N = 2,536 GPs (52.6%)	p-value
<b>Number of units of all drugs per patient per month</b> Median (1 <sup>st</sup> quartile ; 3 <sup>rd</sup> quartile)		4.5 (3.9 ; 5.3)	4.8 (4.2 ; 5.6)	5.3 (4.6 ; 6.1)	< 0.0001
Number of antibiotic prescriptions per 1000 patients per y Median (1 <sup>st</sup> quartile ; 3 <sup>rd</sup> quartile)	ear	236.1 (156.7 ; 334.7)	335.9 (242.7 ; 447.6)	455.1 (322.8 ; 618.2)	< 0.0001
Number of antibiotic prescriptions per 100 patients aged 1 years old without a chronic disease per year Median (1 <sup>st</sup> quartile ; 3 <sup>rd</sup> quartile)	6 to 65	20.7 (14.3 ; 31.9)	28.6 (19.5 ; 39.2)	36.5 (25.5 ; 52.6)	< 0.0001
% of patients treated by broad-spectrum antibiotics (amox clavulanate, 3rd and 4th generation cephalosporins and fluoroquinolones) per year Median (1 <sup>st</sup> quartile ; 3 <sup>rd</sup> quartile)	icillin-	25.3 (19.0 ; 31.5)	27.4 (21.5 ; 34.4)	34.2 (26.2 ; 44.8)	< 0.0001
Target reached (≤ 20%) for the P4P indicator 'number of antibiotic prescriptions per 100 patients from 16 to 65	Yes	25.7	38.7	35.6	
years old without a chronic disease' %	No	8.4	30.5	61.1	- <0.0001
Target reached (≤ 32%) for the P4P indicator 'percentage of patients treated by broad-spectrum antibioticsYes(amoxicillin-clavulanate, 3rd and 4th generation cephalosporins and fluoroquinolones)'No		16.4	40.1	43.5	
		6.3	22.8	70.9	- <0.0001

3 P4P: pay-for-performance