# Propensity score to detect baseline imbalance in cluster randomized trials: the role of the c-statistic - APPENDIX 

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## APPENDIX A: Distribution of the $c$-statistic without baseline imbalance and estimation of the threshold value

## Objectives

The objectives were to study the distribution of the c-statistic in CRTs without baseline imbalance in a variety of situations to determine whether a specific threshold depending on sample size and number of covariates for each scenario is needed, rather than a unique threshold value.

## Methods

Data generation
Data were generated in the same way than in the simulation study presented in the main paper, except that the $r$ generated covariates were balanced.

## Studied scenarios

We studied 36 scenarios in which the following parameters were varied:

- the sample size per arm, $n=(100,500)$. In CRTs, the median number of subjects per arm is $329(\mathrm{IQR}=[143-866])$ [1]. Thus, the chosen values correspond to the situation of a small and average size CRT.
- the number of clusters per arm: $k=(5,10,50)$,
- the number of covariates: $r=(4,10,20)$ for $n=100$ and $r=(10,20,50)$ for $n=500$, corresponding to a ratio $\frac{n}{r}=(25,10,5)$ for $n=100$ and $\frac{n}{r}=$ $(50,25,10)$ for $n=500$. We considered $r_{c}=r_{b}=\frac{r}{2}$.
- the trial design: individually randomized trial (without clustering for the covariates $\boldsymbol{X}_{\mathbf{0}}$ ) or CRT (with an ICC for the covariates $\boldsymbol{X}$ ).


## Results

The boxplots below show the distribution of the $c$-statistic without systematic imbalance. Results were pooled over the number of clusters per arm $k$ and type of trial (CRT vs. individually randomized trial) because these parameters had no impact on the average $c$-statistic (data not shown). Moreover, the correlation between
covariates had no impact on the $c$-statistic distribution (data not shown) when the covariates were balanced. Indeed, the correlation among covariates usually affects the $c$-statistic only when these covariates are predictors in the model.

The results showed that even in absence of systematic baseline imbalance, the median c-statistic varied substantially across the studied scenarios. A predictive model with a $c$-statistic $>0.7$ is commonly considered to be discriminant [2]. This value increased with the number of covariates because small chance imbalance on each covariate may lead to increased global imbalance. Conversely, the median $c$ statistic decreased when the sample size increased: randomization ensures group comparability according to the law of large numbers. Chance imbalance can occur especially for small sample size $[3]$ and then may artificially increase the $c$-statistic. Therefore, these results confirm the need for a specific threshold value for a given CRT rather a unique threshold value.


Figure 1 Distribution of the c-statistic of the propensity score model under the hypothesis of no baseline imbalance as a function of covariates $r$ and the sample size ( $n$ is the sample size per arm). The type of trial (cluster randomized trial [CRT] vs. individually randomized trial) and the number of clusters per arm $k$ had no effect on the distribution. 100000 simulations were performed per scenario.

## APPENDIX B:

## Supplementary example: internal validity

We applied our method on a third example in which there is no risk of confounding bias because of the recruitment of participants prior to the randomization of clusters, in order to control the internal validity of our method.

Oral ivermectin for difficult-to-treat head lice
This study was a double-blind double-dummy CRT comparing oral ivermectin and malathion lotion for difficult-to-treat head lice [4]. In all, 376 households were randomized, corresponding to 398 patients who received ivermectin and 441 who received malathion. Seven individual characteristics were observed at baseline (table 1). Here, the usual chronology of a randomized trial was observed: once an eligible patient was identified and recruited as an index patient, households, rather than the patients, were randomized. Thus, this CRT had low risk of confounding bias, which was strengthened by nonsignificant univariate test results and small standardized differences.

## Results

The PS model contained the seven covariates displayed in Table 1 of this appendix. The PS distribution per arm is displayed in Figure c in Appendix C. Without covariate selection, our method provided a threshold value of 0.584 , whereas the estimated c-statistic for this dataset was 0.576 . With a pre-selection of covariates, five covariates among seven were retained, thus leading to an estimated $c$-statistic of 0.572 and a threshold value of 0.575 . Thus, our method showed good specificity here, with or without covariate selection, because it did not lead to the diagnosis of any baseline imbalance due to recruitment or chance in a large CRT with very low risk of confounding bias.
Table 1 Patient baseline characteristics of the study comparing oral ivermectin and malathion lotion in difficult-to-treat head lice.

| Characteristics |  | Ivermectin $n_{0}=398$ | Malathion $n_{1}=414$ | p | SDiff (\%) |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | mean (standard deviation) mean (standard deviation) |  |  |  |  |
| Age (years) |  | 14.0 (11.6) | 14.2 (12.0) | 0.8408 | 1.36 |
| Weight (kg) |  | 40.4 (21.7) | 40.3 (19.9) | 0.9454 | 0.48 |
|  |  | $n(\%)$ | $n(\%)$ |  |  |
| Sex (Male) |  | 53 (13.3) | 53 (12.8) | 0.8277 | 1.54 |
| Race | Asian | 69 (17.3) | 48 (11.6) | 0.0594 | 16.40 |
|  | Black | 1 (0.3) | 0 (0.0) |  | 7.08 |
|  | White | 323 (81.2) | 361 (87.2) |  | 16.61 |
|  | Other | 5 (1.3) | $5(1.2)$ |  | 0.18 |
| Hair density | Thin | 59 (14.8) | 50 (12.1) | 0.1762 | 8.04 |
|  | Average | 164 (41.2) | $156 \text { (37.7) }$ |  | 7.23 |
|  | Thick | 175 (44.0) | 208 (50.2) |  | 12.59 |
| Hair length | Above earlobe | 65 (16.3) | 57 (13.8) | 0.5088 | 7.16 |
|  | Between earlobe and shoulder | 70 (17.6) | 69 (16.7) |  | 2.44 |
|  | Below shoulder | 263 (66.1) | 288 (69.6) |  | 7.48 |
| Live lice ( $<12$ ) |  | 265 (66.6) | 268 (64.7) | 0.5792 | 3.90 |

## APPENDIX C: <br> Distribution of PS distribution per group in the 3 examples



Figure 2 Propensity score distribution per arm for the three examples. a Example 1: standardized evaluation tool ( $\mathrm{n}=1462$ ) vs. usual care ( $\mathrm{n}=1495$ ) for the management of osteoarthritis. b Example 2: standardized consultation $(n=154)$ vs. usual care $(n=182)$ for patients with osteoarthritis of the knee. c Example 3: ivermectine $(n=398)$ vs. malathion $(n=441)$ for difficult-to-treat head-lice.

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