## Fuzzy Logic-Based Model to Stratify Cardiac Surgery Risk

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Supplementary Material

Table 1. List of fuzzy variables, categories and definitions selected by the "clinical expert" to predict operative mortality.

| Variables | Categories |  | Definitions | Observations |
| :---: | :---: | :---: | :---: | :---: |
| Gender | Female <br> Male | $\begin{aligned} & 0 \\ & 0.01 \end{aligned}$ | Self-defined | Female gender is associated with worse surgical results |
| Age | Old <br> Senior <br> Young | $\begin{aligned} & 1 \\ & 0.1 \\ & 0 \end{aligned}$ | $>75$ years <br> Between 65 and 75 years <br> $<65$ years | Age is associated with different surgical risk |
| Valued age | Older <br> Same age <br> Younger | $\begin{aligned} & 0.1 \\ & 0.02 \\ & 0 \end{aligned}$ | Seems to be older than the chronological age <br> Seems to have the chronological age <br> Seems younger than the chronological age | Apparent age could be associated to better or worse prognosis |
| Body Types | Obese <br> Endomorph <br> Mesomorph <br> Ectomorph | $\begin{aligned} & 0.2 \\ & 0.1 \\ & 0.02 \\ & 0 \end{aligned}$ | Seems to have $>20 \%$ the ideal weight Classically defined body types | Body constitution is associated with technical difficulty during surgery |
| Body surface | Small <br> Large <br> Standard | $\begin{aligned} & 1 \\ & 0.02 \\ & 0 \end{aligned}$ | Approximately below $1.8 \mathrm{~m}^{2}$ <br> Approximately above $2.1 \mathrm{~m}^{2}$ <br> Between the above ones | Patients with smaller surfaces have higher surgical risk (aortic surgery) |
| General aspect | Bad <br> Regular <br> Good | $\begin{aligned} & 1 \\ & 0.2 \\ & 0 \end{aligned}$ | Patient with neglected appearance <br> Patient with regular appearance <br> Patient with impeccable appearance |  |
| General condition | Critical <br> Unstable <br> Stable | $\begin{aligned} & 1 \\ & 0.1 \\ & 0 \end{aligned}$ | Ventilated or in shock <br> Hemodynamically unstable or unstable angina <br> Excludes the above conditions |  |
| Time of surgery | Emergency <br> Urgency <br> Programmed | $\begin{aligned} & 1 \\ & 0.2 \\ & 0 \end{aligned}$ | Within the first 24 hours <br> During hospitalization <br> Self-defined | The moment of surgery has been associated with surgical mortality in many risk scores |
| Psychology | Depressive <br> Excited <br> Alert <br> Fearful <br> Normal | $\begin{aligned} & 1 \\ & 1 \\ & 0.01 \\ & 0.01 \\ & 0 \end{aligned}$ | Self-defined | There is consensus on the importance of the psyche in postoperative recovery. |
| Wish to undergo surgery | Forced <br> Indifferent <br> Voluntary | $\begin{aligned} & 0.1 \\ & 0.02 \\ & 0 \end{aligned}$ | Does not wish to undergo surgery <br> Does not express any wish <br> Wishes to undergo surgery | The disposition or wish to undergo surgery is a previous condition in clinical practice and could be associated to the outcome. |
| Family context | Bad <br> Regular <br> Good | $\begin{aligned} & 0.1 \\ & 0.02 \\ & 0 \end{aligned}$ | Unfavorable <br> Favorable | The weight of trust in the procedure and in those who perform it. |
| Socio-economic level | Low <br> Average <br> Middle-High | $\begin{aligned} & 0.01 \\ & 0 \\ & 0 \end{aligned}$ | Classically defined | Access to healthcare varies according to the socioeconomic level. |
| History of diabetes | Poorly managed <br> Long standing <br> Well treated <br> None | $\begin{aligned} & 1 \\ & 0.1 \\ & 0.02 \\ & 0 \end{aligned}$ | Poorly controlled <br> Well controlled but long standing <br> Presence of diabetes <br> Self-defined | Not only diabetes but its management along time define the general condition and quality of coronary vessels |

(continue)

| Variables | Categories |  | Definitions | Observations |
| :---: | :---: | :---: | :---: | :---: |
| Other comorbidities | Severe | 1 | CRF, CHF, neurologic, hematologic | Comorbidities can increase surgical risk |
|  | Mild | 0.1 | COPD |  |
|  | None | 0 | Self-defined |  |
| Antiaplatelet therapy | Recent use of IIb/IIla | 0.1 | Administered until 5-10 days previously | Aspirin or clopidogrel use are associated to higher rate of postoperative bleeding |
|  | Aspirin | 0 | Is presently taking or has taken aspirin until previous week |  |
|  | Aspirin interruption | 0 | Interrupted aspirin more than one week ago |  |
| Combined surgery | Mitral | 1 | CABG + mitral valve replacement or repair | Combination surgery poses greater risk than single coronary artery surgery |
|  | Aortic | 0.1 | $C A B G$ + aortic valve replacement |  |
|  | None | 0 | Self-defined |  |
| Reoperation | Patent mammary | 1 | Presence of patent mammary | Not only redo surgery implies greater risk, but presence of a patent mammary vein or cardiomegaly increases the risk of technical complications. |
|  | Prior valve surgery | 0.5 | Prior mitral, aortic or congenital surgery |  |
|  | Prior coronary surgery | 0.2 | Prior CABG |  |
|  | None | 0 | Self-defined |  |
| History of angioplasty | Left main CA | 0.2 | Left main coronary artery percutaneous coronary intervention | Presence of one or more previous percutaneous coronary intervention may be associated to worse coronary beds or LV function impairment |
|  | Yes | 0.02 | Prior percutaneous coronary intervention (ex- |  |
|  | None | 0 | cept main (A) |  |
|  |  |  | Self-defined |  |
| Coronary vessel quality | Poor | 1 | Self-defined | Coronary vessel quality is specially related to long-term outcomes |
|  | Moderate | 0.1 |  |  |
|  | Good | 0 |  |  |
| Anterior descending bed | Absent | 1 | Self-defined | The left anterior descending bed is intimately associated with immediate and long-term coronary artery surgery outcomes |
|  | Poor | 1 |  |  |
|  | Present | 0 |  |  |
| Coronary lesions | Left main + RCA | 0.3 | Left main and right coronary artery lesion | Location of coronary artery lesions |
|  | Left main | 0.2 | Left main coronary lesion with intact right coronary artery |  |
|  | 2-3 vesssels | 0.1 | Two- or 3-vessel disease |  |
|  | 1 vessel | 0.02 | One-vessel lesion (generally LDA) |  |
|  | None | 0 | Non-coronarypatient |  |
| Left ventricular function | Severe | 1 | Self-defined | LV function is considered in almost all risk scores |
|  | Moderate | 0.1 |  |  |
|  | Normal | 0 |  |  |
| Valve surgery | Aortic regurgitation | 0.2 | Self-defined | Valve surgery, whether or not alone, is associated with greater surgical risk. The quality of the ascending aorta in aortic regurgitation may impair the replacement technique |
|  | Mitral surgery | 0.1 |  |  |
|  | Aortic stenosis | 0.1 |  |  |
|  | None | 0 |  |  |

Note: The values assigned to each characteristic correspond to the final weight and calibration in the test set.
RCA: Right coronary artery. CABG: Coronary artery bypass graft surgery. LDA: Left descending artery. COPD: Chronic obstructive pulmonary disease. CHF: Chronic heart failure. CRF: Chronic renal failure. LV: Left ventricular.

Fig. 1. Fuzzy cognitive map diagram used to predict mortality with preoperative fuzzy variables


Values between nodes represent the weight (strength of connection) assigned to each relationship based on the tables of influence.

