
*Computational Modelling of the Human
Heart and Multiscale Simulation of its
Electrophysiological Activity aimed at the
Treatment of Cardiac Arrhythmias related
to Ischaemia and Infarction*

DOCTORAL THESIS

Alejandro Daniel López Pérez

Supervisors:

Prof. José María Ferrero De-Loma Osorio

Dr. Rafael Sebastián Aguilar



UNIVERSITAT
POLITÈCNICA
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<https://www.youtube.com/playlist?list=PL98EKQIbetNq4MdEMpVkOd6bx0TQNYDXZ>

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