LivSim: An Open-Source Simulation Software Platform for Community Research and

Development for Liver Allocation Policies

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Abbreviations:

DSA- Donor Service Area

LSAM – Liver Simulated Allocation Model

MELD – Model for End-Stage Liver Disease

OPTN - Organ Procurement and Transplant Network

SRTR - Scientific Registry of Transplant Recipients

UNOS - United Network for Organ Sharing

We developed an open-source software called LivSim, an alternative to the Liver Simulated Allocation Model (LSAM v Aug 2014)¹ created by the Scientific Registry of Transplant Recipients (SRTR). LivSim is designed to perform discrete-event simulation of liver allocation in the United States' Organ Procurement and Transportation Network (OPTN). Written in Python 3.4.2, the software is available for download at https://github.com/LivSim2017/LivSim-Codes.

As the standard simulation tool in transplantation, LSAM assesses alternative liver allocation policies. LSAM allows changes to only liver allocation rules, model parameters, and boost points for testing policies. However, its code cannot be modified when a user tests a policy that is beyond its capabilities. For example, at the time when optimized² and concentric³ neighborhoods were being developed, they could not be tested on LSAM because of their complex geographic structures for sharing. LSAM's inflexibility motivated LivSim's development.

Unlike LSAM, LivSim operates primarily at the DSA level. Using LivSim, the user can directly specify how procured organs are shared between DSAs. Therefore, LivSim was able to examine the allocation performances of the 8-district structure⁴, optimized neighborhoods², and the concentric-neighborhoods solution³.

LivSim operates in a similar manner as does LSAM, and its statistical results are approximate to LSAM's results². LivSim maintains lists of transplant candidates, recipients, and donors; initializes a starting waitlist; and reads in LSAM's input streams of patient arrivals, organ arrivals, status updates/progressions of waitlist candidates, and patient re-listings. Each waitlist candidate is assigned a Model for End-Stage Liver Disease (MELD) score, ABO blood type, Status 1 exception, and HCC exception.

During a status progression, LivSim updates the candidate's MELD score and potentially removes the candidate from the waitlist or indicates the candidate's death. When a donated liver arrives, LivSim creates a list of potential, blood-type-compatible candidates prioritized by their MELD scores and their proximity to the DSA that procure the organ. Iterating through the list, LivSim uses LSAM's organ acceptance model¹ to determine whether the candidate accepts the offered liver for transplant. After transplant, LivSim will determine whether the transplant recipient will relist and, if necessary, return the recipient to the waitlist after calculating the time until graft failure. The LivSim architecture is summarized in Figure 1.

When the simulation finishes, it outputs the following statistics:

- DSA-average MELD at transplant and standard deviation
- DSA-median MELD at transplant and standard deviation
- Number of transplants by year and by DSA
- Number of waitlist mortalities by year and by DSA
- Number of waitlist removals by year and by DSA
- Average transplant waiting time by year and by DSA
- Number of procured organs sent or received between DSAs

Using the output statistics, LivSim can generate statistics on post-transplant mortalities, re-listing and re-transplant mortalities, and transport distances and times.

Being open-source, the LivSim's code can be directly modified to incorporate new features, update survival and acceptance models, change allocation rules, etc. The availability and transparency of LivSim encourages transplantation researchers to strive

for creative allocation policies that follow robust design principles⁵ in potentially saving more lives and reducing geographic disparity overall.

Figure Legends

Figure 1: LivSim's flow chart describing the simulation process from start to finish.

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