Hsieh et al. has recently published a paper on the counterfactual generation of process data. They call their framework DiCE4EL and shares many ideas with our framework. Therefore, we want to highlight the key differences and similarities.

In their approach they attempt to solve various issues that we have also highlighted in ??. Furthermore, they do so by incrementally generating the model in a sequential order. However, unlike Oberst and Sontag, whose solution creates counterfactuals for every step in the sequence, Hsieh et al. focus on critical decision points they call milestones.

To gain a better understanding, it is important to briefly outline the event log the authors use. It was taken from a Dutch bank which processes loan applications in which customers request a certain amount of money. The activities relate to either application states or manual work activities. The application states consist of tasks generated by a machine and manual work activities produced by humans. Hence, the manual work items occur in reference to the application state. For instance, if the loan application is in a pre accepted state, then the next events are often produced by humans who are reviewing the state. Those events are essentially, sub-events of the application state. The human activities do not have to happen sequentially. They can occur in parallel. The moment all manual work items conclude, marks the decision for the next application state. For instance, from pre accepted to accepted. Now, to understand why the milestone approach works, requires to know that an application loan process will change to a rejection state, for instance, if all manual work items are completed. There will not be applications that suddenly switch to another state although the work items of a previous state have not concluded, yet. Thus, one can split the entire sequence into subsequences or ignore the sub events entirely, which reduces the search space significantly.

One issue with this approach is the fact that one would first have to identify these milestones. Hence, a crucial distinction to our proposed framework, is their dependence on knowledge about the true process as displayed in this section. Our framework does not leverage structural information about the true process model in question. We believe this is the core contribution in constrast to their approach.

However, similarities between both frameworks do exist. Mainly, our approach also relies on prediction scores of the model we attempt to explain. Similar to Hsieh et al., we incorporate these scores into our quality measure.

The next difference stems from how DiCE4EL operationalises the quality criteria of their counterfactuals and on what bases they optimize their algorithm. we will discuss those after discussing our operationalisation in ??

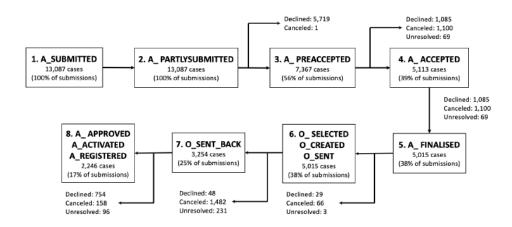


Figure 1: Milestones of loan application process captured in BPIC2012 as identified in [1]