

## **Pre-calculated LCI systems with uncertainties cannot be used in comparative LCA**

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A recent paper by Qin & Suh (2016) provides an interesting test of the assumption of lognormally distributed LCI results.

We appreciate the importance of this work, and acknowledge that finding out this result must have taken a long computation time. In that respect, we would like to comment on the remark in section 4 that "conducting uncertainty analysis from the unit process level is neither time-efficient nor necessary for most studies. Therefore, the determination of the distribution that best fits the aggregate LCI is needed. It would help improve the efficiency of storing uncertainty data and performing uncertainty analysis in LCA by saving computation and storage of LCI data." The authors further illustrate this alleged advantage by an example where computation is reduced from 1000 minutes to 15 seconds.

This would be great indeed, but the unfortunate fact is that this will not work for "most studies", because most studies are comparative LCAs, comparing a number of alternative product systems, or comparing an existing product system with a proposed redesign. In comparative LCA, including uncertainties in a sampling context should be done in a dependent way (Henriksson et al. 2015), just like the effectiveness of a therapy is best tested with a paired test, as any textbook in statistics (Moore et al 2009; Agresti and Franklin 2013) will discuss.

Using pre-calculated distributions of complete systems, as suggested by Qin & Suh (2016) will lead to a large overestimation of the uncertainty of the results of comparative LCA. Figure 2 of Henriksson et al. (2015) gives an illustration of strongly overlapping error bars when analysed as complete systems, versus a clear-cut answer with moderate error bars when considered from the point of view of dependent sampling and analysis.

Knowledge of the distribution of LCI results does not provide sufficient information for a paired comparison. The result is that each case study requires generating new Monte Carlo samples, dependently

sampled and comparing results between alternative product systems for each Monte Carlo run. The gain of computing time by a factor of 4000, as envisaged by Qin & Suh (2016) will unfortunately thus not be achievable at all in comparative LCA. We must go to smarter algorithms, high performance hardware and parallel computing (Heijungs et al. 2015).

## **References**

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