Databases and ontologies

**Limbform: a functional ontology-based database of limb regeneration experiments**

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**Abstract**

**Summary:** The ability of certain organisms to completely regenerate lost limbs is a fascinating problem, far from solved. Despite the extraordinary published efforts during the last centuries of scientists performing amputations, transplantsations, and molecular experiments, no mechanistic model exists yet that can completely explain patterning during the limb regeneration process. The lack of a centralized repository to enable the efficient mining of this huge dataset is hindering the discovery of comprehensive models of limb regeneration. Here, we introduce Limbform (Limb formalization), a centralized database of published limb regeneration experiments. In contrast to natural language or text-based ontologies, Limbform is based on a functional ontology using mathematical graphs to represent unambiguously limb phenotypes and manipulation procedures. The centralized database currently contains more than 800 published limb regeneration experiments comprising many model organisms, including salamanders, frogs, insects, crustaceans, and arachnids. The database represents an extraordinary resource for mining the existing knowledge of functional data in this field; furthermore, its mathematical nature based on a functional ontology will pave the way for artificial intelligence tools applied to the discovery of the sought-after comprehensive models of limb regeneration. The Limbform database is freely available at http://limbform.daniel-lobo.com. Contact: michael.levin@tufts.edu

1 **INTRODUCTION**

Most phyla include species with the remarkable ability to regenerate lost body sections, being the regeneration of limb appendages one of the most complex and fascinating processes (Brockes and Kumar, 2008). Hundreds of experiments based on physical manipulations and molecular disturbances have identified many key genetic elements necessary for limb regeneration; however, no model exists yet that can explain the sufficient mechanisms that enable salamanders and other organisms to carry out the perfect regeneration of amputated limbs (Nacu and Tanaka, 2011). Understanding the process of regeneration of complex 3-dimensional shape from cell growth is a problem of fundamental importance in biology, and this goal should not get lost in the search for the minute details of genetic and molecular interactions if we ever hope to find comprehensive testable models required to implement the sought-after promising biomedical applications (Lobo, et al., 2014b).

The lack of formalization tools to describe functional experiments and a centralized repository to store and analyze the vast experimental literature of limb regeneration is hindering our ability to find a comprehensive model of limb regeneration. Papers are written in natural language, which is ambiguous and difficult to systematically mine and analyze, whereas proposed text-based ontologies (Robinson and Webber, 2014) are not ideal for describing qualitative (upper-arm vs. fore-arm), quantitative (number of fingers), topological (ectopic hand in fore-arm), and geometrical (segment length) information key in regenerative experiments.

In contrast, novel functional mathematical ontologies based on graphs have been recently proposed for the formalization of morphologies and manipulations for planarian worm (Lobo, et al., 2013b) and limb (Lobo, et al., 2014a) regenerative experiments. In contrast to natural language, a mathematical graph can unambiguously specify morphological data (Lobo, et al., 2011). A graph can represent both complete joint-less organisms such as planaria (where regions are represented by graph nodes connected by graph edges) and joint-based structures such as limbs (where segments connected by joints are represented by graph edges connected by graph nodes).

Here, we present a database based on a functional ontology system that unambiguously centralize the knowledge of limb regeneration experiments in a diverse set of model organisms, enabling the unambiguous description, centralize storage, and manual and automated mining of this vast dataset.

2 **METHODS**

2.1 **Functional graph-based ontology for limb morphologies and manipulations**

To unambiguously describe the main characteristics of a limb morphology in the database, we used a novel functional ontology for limb regeneration experiments (Lobo, et al., 2014a). A mathematical graph represents the topological structure of a limb, where nodes specify limb segments and links the connection between them. Labels in the graph define the segment type and its geometrical characteristics, including connection angles and overall size and shape. Manipulations are defined in the ontology with a tree-like mathematical graph, being the external nodes (leaves of the tree) starting limb morphologies and the internal nodes elemental actions per-

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formed to the limb (remove, crop, join, relocate, reverse, or irradiate). Links define the interrelation between actions.

2.2 Database implementation and curation
The Limbform database is implemented with the database engine SQLite (public domain). A single file stores both the database schema and the data, facilitating the administration and sharing of databases. The centralized database was manually curated using a freely-available, specific software tool (Lobo, et al., 2014a), which uses interactive graph representations and automatically-generated cartoon diagrams as an optimal user-interface for regeneration experiments (Lobo, et al., 2013a).

3 RESULTS
We created the Limbform database of limb regeneration experiments based on a functional ontology of mathematical graphs. The database currently contains published regeneration experiments performed on the main model organisms in limb regeneration, including salamanders, frogs, insects, crustaceans, and arachnids. An experiment in the database links a manipulation procedure (any combination of cuts, amputations, reversals, grafts, and irradiations) to the resultant limb morphologies at specific regeneration times. In this way, the database can record morphologies with partial penetrance, as well as temporal events during the regeneration process. In addition, an experiment also includes information about the publication details (including a web link to the original publication), the species used, and the pharmacological treatments and their timing administered during the experiment.

Currently, the centralize database contains 829 experiments manually curated from 90 selected publications spanning from the 1950s to the present day. The selected experiments cover a wide range of surgical manipulations and pharmacological treatments and a great variety of resultant morphologies.

Figure 1 shows screenshots of the database, accessed with the specific software application. The database is logically divided into experiments, manipulations, morphologies, treatments, species, and publications (Fig. 1A). The details of an experiment include its name, publication, species, pharmacological treatments, the manipulation performed, and the resultant morphologies obtained at specific times after amputation (Fig. 1B). Limb morphologies contain segments specific to the species used, their topological connectivity, and their general shapes (Fig. C). Complex manipulations are made of a combination of nested elemental actions, such as crops and joins (Fig. D).

4 DISCUSSION AND CONCLUSIONS
Limbform is the first repository centralizing the main experiments of limb regeneration in multiple model organisms. We curated hundreds of limb regeneration experiments, resultant morphologies, and manipulations from the published literature into a centralized database. We have followed a careful curation methodology to assure the consistency of the data; however, we encourage the publications’ authors to verify the accuracy of the curated experiments and report through our dedicated website any possible inaccuracy in the data. We are continuously publishing revised versions of the database, with new and corrected data, and will incorporate user revisions as they are submitted.

The rapid accumulation of regeneration experiments and the difficulty of human scientists to glean algorithmic (constructive) models of pattern formation (not merely genetic pathways) necessitate the use of computational approaches. The Limbform database, due to the mathematical and functional nature of its ontology, will pave the way for the application of computational automated tools based on artificial intelligence algorithms that will assist in the discovery of comprehensive models of regeneration.

The Limbform database of limb regeneration experiment represents an invaluable resource for the community and establishes the first necessary steps of a new bioinformatics of shape. This in turn will assist in the discovery and development of innovative biologically models driving transformative applications in regenerative biomedicine.

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Fig. 1. Components of the database of limb experiments, visualized with the dedicated software tool. (A) Window listing all the experiments stored in the database. (B) A regeneration experiment describes the treatments, manipulations, and resultant morphologies. (C) A limb morphology is defined with a graph representing the segments topology and their overall shape. (D) A surgical manipulation is defined with a hierarchy of elemental actions.