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Martin Frith Christian Nørgaard Storm Pedersen (Eds.)

# Algorithms in Bioinformatics

16th International Workshop, WABI 2016 Aarhus, Denmark, August 22–24, 2016 Proceedings



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#### Preface

This proceedings volume contains papers presented at the 16th Workshop on Algorithms in Bioinformatics (WABI 2016) that was held at Aarhus University, Aarhus, Denmark, August 22–24, 2016. WABI 2016 was one of eight conferences that were organized as part of ALGO 2016. The Workshop on Algorithms in Bioinformatics was established in 2001, and is an annual conference on all aspects of algorithmic work in bioinformatics, computational biology, and systems biology. The emphasis is on discrete algorithms and machine-learning methods that address important problems in molecular biology, that are founded on sound models, that are computationally efficient, and that have been implemented and tested in simulations and on real datasets. The goal is to present recent research results, including significant work-in-progress, and to identify and explore directions of future research. WABI 2016 was sponsored by the European Association for Theoretical Computer Science (EATCS).

In 2016, a total of 56 manuscripts were submitted to WABI from which 27 were selected for presentation at the conference. Among them, 25 are included in this proceedings volume as full papers presenting novel results not previously published in journals, and two are included as short abstracts of papers that are in the process of being published simultaneously in journals. The 27 papers were selected based on thorough reviewing, usually involving three independent reviewers per submitted paper, followed by discussions in the WABI Program Committee. The selected papers cover a wide range of topics from networks, to phylogenetic studies, sequence and genome analysis, comparative genomics, and mass spectrometry data analysis. Extended versions of selected papers will be published in a thematic series in the journal *Algorithms for Molecular Biology* (AMB), published by BioMed Central.

We thank all the authors of submitted papers and the members of the WABI Program Committee and their reviewers for their efforts that made this conference possible, and the WABI Steering Committee for their help and advice. We also thank all the conference participants and speakers. In particular, we are indebted to the keynote speaker of the conference, Kiyoshi Asai, for his presentation. Finally, we thank Gerth Stølting Brodal and the local ALGO Organizing Committee for their hard work.

June 2016

Martin Frith Christian N. S. Pedersen

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# Abstracts

#### Mass Graphs and Their Applications in Top-Down Proteomics

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Abstract. Although proteomics has rapidly developed in the past decade, researchers are still in the early stage of exploring the world of complex proteoforms, which are protein products with various primary structure alterations resulting from gene mutations, alternative splicing, post-translational modifications, and other biological processes. Proteoform identification is essential to mapping proteoforms to their biological functions as well as discovering novel proteoforms and new protein functions. Top-down mass spectrometry is the method of choice for identifying complex proteoforms because it provides a "bird's eye view" of intact proteoforms. Fragment ion series in top-down tandem mass spectra provide essential information for identifying primary sequence alterations in proteoforms. Extended proteoform databases and spectral alignment are the two main approaches for proteoform identification. However, due to the combinatorial explosion of various alterations on a protein and the limitations of available spectral alignment algorithms, the proteoform identification problem has still not been fully solved.

We propose a new data structure, called the mass graph, for efficient representation of proteoforms of a protein with variable post-translational modifications and/or terminal truncations. The proteoform identification problem is transformed to the mass graph alignment problem, and dynamic programming algorithms are proposed for a restricted version of the problem. The proposed algorithms were tested on two top-down tandem mass spectrometry data sets. Experimental results showed that the proposed algorithms were efficient in identifying proteoforms with variable post-translational modifications and outperformed MS-Align-E in running time and sensitivity for identifying complex proteoforms, especially those with terminal truncations.

**Acknowledgement.** The research was supported by the National Institute of General Medical Sciences, National Institutes of Health (NIH) through Grant R01GM118470.

#### Safely Filling Gaps with Partial Solutions Common to all Solutions

Leena Salmela and Alexandru I. Tomescu

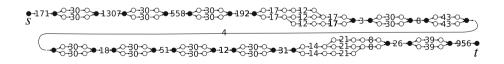
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**Abstract.** Gap filling has emerged as a natural sub-problem of many *de novo* genome assembly projects (e.g., filling gaps in scaffolds). Several methods have addressed it, but only few have focused on strategies for dealing with multiple gap filling solutions and for guaranteeing reliable results. Such strategies include reporting only unique solutions, or exhaustively enumerating all filling solutions and heuristically creating their consensus.

The gap filling problem is usually formulated as finding an *s*-*t* path in the assembly graph, whose length matches the gap length estimate. In this paper we address it with the "safe and complete" framework proposed in [Tomescu and Medvedev, RECOMB 2016] for the contig assembly problem. In terms of gap filling, a *safe solution* is a path of the assembly graph that is a sub-path of all possible *s*-*t* paths whose length matches the gap length estimate.

We give an efficient safe algorithm for the gap filling problem, running in time O(dm), where d is the gap length estimate and m is the number of edges of the assembly graph. To transform the safe paths into a single filling sequence usable in downstream analysis, we fill the gap with an arbitrary filling path, in which we mark the safe subsequences. Experiments on the GAGE bacterial datasets show that our method retrieves over 90 % more safe and correct bases as compared to previous methods differentiating between ambiguous and unambiguous positions, with a precision similar to the one of previous methods.

We implemented this method as version 2.0 of our gap filler of scaffolds, Gap2Seq, available at www.cs.helsinki.fi/u/lmsalmel/Gap2Seq/.



**Fig. 1.** A de Bruijn graph (k = 31) built on *S. aureus* data. We represent unary paths by numbers indicating their length. The estimated gap length is d = 3774, and there are 9216 different *s-t* paths of length *d*. The safe sub-paths (in black) have length 3337 and the precision of our method on these sub-paths is 99.9 %. Notice that most of the bubbles of this graph are caused by SNPs.

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