

Gene expression

DECOMP—from interpreting Mass Spectrometry peaks to solving the Money Changing Problem

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ABSTRACT

Summary: We introduce DECOMP, a tool that computes the sum formula of all molecules whose mass equals the input mass. This problem arises frequently in biochemistry and mass spectrometry (MS), when we know the molecular mass of a protein, DNA or metabolite fragment but have no other information. A closely related problem is known as the Money Changing Problem (MCP), where all masses are positive integers. Recently, efficient algorithms have been developed for the MCP, in which DECOMP applies to real-valued MS data. The excellent performance of this method on proteomic and metabolomic MS data has recently been demonstrated. DECOMP has an easy-to-use graphical interface, which caters for both types of users: those interested in solving MCP instances and those submitting MS data.

Availability: DECOMP is freely accessible at <http://bibiserv.techfak.uni-bielefeld.de/decomp/>

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1 INTRODUCTION

Suppose you are given a DNA fragment of mass 2650 ± 1 Da and have no other information. What nucleotide combinations exist with this mass? In fact, there exist two such combinations: either 8 Guanines (totaling 2632.42 Da, plus 18.01 Da for a water molecule) or 7 Cytosines and 2 Thymines (2631.42 Da plus 18.01 Da). DECOMP solves this and similar problems efficiently.

Formally, the MASS DECOMPOSITION PROBLEM can be stated as follows: Given an ordered set of positive real numbers (a_1, \dots, a_k) (a weighted alphabet), an error bound ϵ , and a query M , we search for all non-negative integer vectors (c_1, \dots, c_k) such that $M - \epsilon \leq c_1 a_1 + \dots + c_k a_k \leq M + \epsilon$. If the a_i 's are positive integers and $\epsilon = 0$, this is known as the Money Changing Problem (MCP) or Coin Change Problem. In biochemical mass spectrometry (MS) applications, the alphabet corresponds to the molecular masses of the 20 amino acid residues (for protein fragments); of the four nucleotides (for DNA); or of the elements that are expected to occur

(e.g. CHNOPS for most metabolites). The query M is the mass of the sample molecule.

A considerable amount of biochemical and mass spectrometry literature exists on the problem of determining the sum formula of a sample molecule from its mass, see for instance (Bertrand *et al.*, 1987; Fürst *et al.*, 1989; Pomerantz *et al.*, 1993), and there are approaches that use known sum formulas for interpreting a mass spectrum (Grange *et al.*, 2006; Kind and Fiehn, 2006; Spengler, 2004). There exist software packages to compute these sum formulas, for example Seth (<http://www.zebra-crossing.de/software/>), ElComp (<http://medlib.med.utah.edu/masspec/>), HiRes MS (<http://homepage.sunrise.ch/mysunrise/joerg.hau/sci/>), Elemental Composition Calculator (<http://www.wsearch.com.au/>) and MF finder (<http://www.chemcalc.org/>). To the best of our knowledge, all of these packages use exhaustive search to decompose the input mass. Since exhaustive search checks all potential solutions up to the input mass, it will slow down significantly when the input mass increases. To this end, note that there exist 1.9×10^{10} sum formulas with mass up to 2000 Da over the amino acid alphabet.

In addition, some of these packages, e.g. Seth or Elemental Composition Calculator, are available for one operating system only, while others are restricted to one type of alphabet, for example to the molecular masses of elements (HiRes MS, MF finder).

2 METHODS

The Money Changing Problem can be solved with a simple dynamic programming algorithm (Gilmore and Gomory, 1965). Recently, two of the authors presented new algorithms for solving the MCP and its variants (Böcker and Lipták, 2005a, b). We construct a data structure in which we backtrack in a smart order, ensuring that the runtime is proportional to the number of solutions. Our algorithm's main advantage over the classical DP algorithm is its vastly reduced space requirement, with equal or better runtimes, depending on the alphabet. Clearly, it is far superior to any type of exhaustive search.

For non-integer alphabets, the variables are scaled to integers using some precision $\delta \in \mathbb{R}$. The scaling and the error bound ϵ introduce rounding errors of two types. False positives, which do not lie in the interval $[M - \epsilon, M + \epsilon]$, can be dealt with by a simple consistency

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Masses
 List of masses to decompose (in Dalton) (space-separated):
 2053.3 3347.5 4525.7 7483.2
 or upload from file (supported file formats):
 Browse...
 Mass distribution is: ☐ monoisotopic ☒ average isotopic
 Allowed mass error: Da (absolute)
 (The resulting decomposition's mass will deviate by at most this much from the query mass.)
 Computational precision: ☐ automatic ☒ manual: Da

Alphabet
 Select a predefined alphabet, enter your own, or upload an alphabet file.
☒ Nucleotides ☐ Amino Acids ☐ Atoms (CHNOPS)
☒ Custom:
 A 313.0576956
 C 289.0463726
 G 329.0525197
 T 304.0460373
 Upload: Browse...

Constraints
 Decompositions must contain at least:
 Decompositions must contain at most: 10

Modifications
 Modifications of the entire molecule: +H2O (+18 Da)
 Fixed modifications (every nucleotide or amino acid gets modified):
 (multiple selections allowed):
 Acetylation (+42 Da)
 Amidation (-1 Da)
 Biotinylation (+226 Da)
 Carboxylation (+44 Da)
 Variable modifications (some nucleotides or amino acids get modified):
 (multiple selections allowed):
 Acetylation (+42 Da)
 Amidation (-1 Da)
 Biotinylation (+226 Da)
 Carboxylation (+44 Da)

Output and Filtering
☒ Show only chemically plausible decompositions (for atom alphabets)
☒ Show actual mass for each decomposition.
☒ Show deviation from query mass for each decomposition.
☒ Show at most the 100 best decompositions per input mass.
 Submit Reset

Fig. 1. Submission form for the real-valued mass decomposition problem.

check. False negatives, on the other hand, pose a non-trivial problem; we discuss in detail how to avoid false negatives in Böcker *et al.* (2006).

3 IMPLEMENTATION AND USE

DECOMP's core is written in C++ and runs on the Bielefeld University Bioinformatics Server (BiBiServ). DECOMP can be accessed interactively using a simple web interface. After submission, results are computed on the web server and can be retrieved as a text file.

DECOMP can also be used as a Web Service, which is useful for batch processing and other non-interactive uses. Java source code for an example Web Service client that can be used on the command line will be available for download.

The user can choose between two input forms, depending on whether he wants to solve a real-valued or an integer problem. The submission consists of (1) supplying the query mass or masses, and (2) defining the alphabet. For the real-valued case, we provide predefined alphabets of the common biomolecules (amino acid, nucleotides, CHNOPS) and give the choice between monoisotopic and average values. Alternatively, the user can define his own alphabet or upload it from a file. In addition, the error bound and computation precision can be set. Different formats of MS output, such as *dta*, *mgf* and others are supported to upload a query. The user can define modifications or choose from a list of predefined ones, where both modifications of the entire molecule (such as addition of a water molecule) and amino-acid-specific modifications (fixed or

variable) are supported. The predefined modifications include those due to sample preparation or the ionization process, as well as common post-translational modifications. Moreover, the user can supply minimum and maximum constraints for each character (e.g. the solution should include at least one C). The output is ranked according to deviation from the query. For the atom alphabet, the sum formulas can be checked for chemical plausibility (Kind and Fiehn, 2007).

For the integer (MCP) case, the user can choose between different mass decomposition problems: compute all solutions (default), compute one solution, compute the number of solutions, or decide whether a solution exists. For a screenshot of the submission form, see Figure 1.

4 CONCLUSION

We have presented DECOMP, a new program to compute decompositions of an input query. Its two primary applications are (1) computing sum formulas of sample molecules from MS spectra, i.e. identifying all molecules with a certain molecular mass from different types of samples: protein, DNA, metabolites or others; and (2) solving instances of the Money Changing Problem. It employs recently developed, very efficient algorithms whose applicability to real-life MS data has been demonstrated (Böcker *et al.*, 2006). DECOMP is supplied with an easy-to-use web interface that allows users to modify all important parameters. Results can be used either independently or as a starting point for further evaluations in the identification pipeline of unknown sample fragments.

DECOMP fills a need for a simple and efficient tool that can quickly compute solutions for mass decomposition problems, both for helping to interpret MS data, and for solving MCP problems. A standalone program, which also allows users to integrate more data such as isotopic distributions, is currently under development.

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