### RetAlign

# An efficient solution for MSA using alignment networks

Adrienn Szabó Phd student of Eötvös University, Budapest (ELTE) and DMS Group Institute for Computer Science and Control, Hungarian Acedemy of Sciences

June 30, 2014

ション ふゆ マ キャット キャット しょう

#### Table Of Contents

▲□▶ ▲□▶ ▲□▶ ▲□▶ ▲□▶ ● □ ● ●



**2** RetAlign algorithm

**3** Evaluation, results, future work...

#### About me

#### Education

- MSc: Software engineer, Budapest University of Technology and Economics (2008)
- PhD: Data mining techniques on biological data (supervisors: András Benczúr, István Miklós), Eötvös University, Budapest (ongoing)



・ロト ・ 日 ・ ・ 日 ・ ・ 日 ・ ・ 日

#### About me

#### **Research** interests

- Bioinformatics, especially multiple sequence alignment, and problems with a lot of data
- Data mining, machine learning, text mining, especially on biological datasets

#### Work

- Developer and research assistant at Data Mining and Search Group (head: András Benczúr), MTA SZTAKI (2007 -)
- Software engineer intern at Google Zürich (2009)

#### MSA – Introduction

- Multiple sequence alignment (MSA): alignment of three or more biological sequences
- Needed for phylogenetic analysis, function prediction of proteins, etc.



	:		**	*		:	*.	*:*	:
1mnmC	TKPYRGHR-	FTKENVR	ILES	FAKNIENPYLD	KGLENLMKN	TSLSRIC	IKNWV	SNRR	RKEKTITIAPEL
lau7A	RKRKR-RTT	ISIAAKD	ALERI	FGEHSKPS	QEIMRMAEE	LNLEKEV	VRVWF	CNRRQR	EKRVKT-SLNQSL
lakhA	KSPKG-KSS	ISPQARA	FLEEV	FRRKQSLNS	KEKEEVAKK	CGITPL	VRVWF	INKRMRS	SK
lfjlA	KQRRS-RTT	FSASQLD	ELERA	FERTQYPDI	IYT <mark>REELA</mark> QR	TNLTEAF	I QVWF	<b>QNRRARI</b>	LRKQHTSVS
lftt	MRRKR-RVI	FSQAQVY	ELERF	RFKQQKYLS	APEREHLASM	IHLTPT	VKIWF	QNHRYK	KRQAK-DKAAQQ
lftz	MDSKRTRQT	TRYQTL	ELEKE	FHFNRYITH	RRR <mark>RIDIA</mark> NA	LSLSER	IKIWF	<b>QNRRMK</b> S	SKKDRTLDSSPEH

## Basics – pairwise sequence alignment

- The standard edit distance based formulation of sequence alignment leads to  $\mathcal{O}(L^2)$
- Dynamic programming: *Smith-Waterman* and *Needleman-Wunsch* algorithms

AAB24882	TYHMCQFHCRYVNNHSGEKLYECNERSKAFSCPSHLQCHKRRQIGEKTHEHNQCGKAFPT 60
AAB24881	YECNQCGKAFAQHSSLKCHYRTHIGEKPYECNQCGKAFSK 40
	**** *** * * ** * * **** * *****
AAB24882	PSHLQYHERTHTGEKPYECHQCGQAFKKCSLLQRHKRTHTGEKPYE-CNQCGKAFAQ- 116
AAB24881	HSHLQCHKRTHTGEKPYECNQCGKAFSQHGLLQRHKRTHTGEKPYMNVINMVKPLHNS 98
	**** * ********************************

Problems with multiple sequence alignment

- For straightforward dynamic programming solutions, each additional sequence multiplies the time and memory required
- Finding the optimal alignment is NP-complete
- Corner-cutting methods shrink the search space, but are still exponential in memory and running time
- Heuristics applied: *progressive alignment*

## Progressive alignment

・日本 ・四本 ・日本 ・日本

- A guide tree is used, and pairwise alignments at each inner node
- Polynommial running time
- Once a gap has been inserted it can not be removed



## RetAlign - main idea

- Store a set of optimal and suboptimal alignments at each step of the progressive alignment procedure
- Propagate the partial networks at each inner node of a guide tree upwards
- Essentially we are extending the *Waterman-Byers* algorithm to align a network of alignments to another network of alignments

#### RetAlign - data structure

We used a special data structure:

x-network: a set of alignment paths that contain the optimal pairwise alignment and all suboptimal paths that have an alignment score above the optimal score minus x

(日) (日) (日) (日) (日) (日) (日)

Note: this is a DAG

#### RetAlign - data structure

This network shows three different alignments of the sequences ALLGVGQ and AVGQ:



# Outline of the RetAlign algorithm

- Build or load a guide tree for the sequences
  Bottom-up, for each node v of the tree:
  - calculate the  $x_v$ -network of its children's sub-networks using the generalized Waterman-Byers algorithm

(日) (日) (日) (日) (日) (日) (日)

 Return the best scored alignment from the x-network calculated at the root of the guide tree

#### Measuring performance

・ロト ・ 日 ・ モ ・ ト ・ モ ・ うへぐ

- Tested and evaluated on the *BAliBASE* datasets, that contain more than 6000 sequences
- Compared with the most widely used MSA packages: ClustalW, MAFFT and FSA

#### Accuracy comparison



Figure : Comparison of alignment software on BAliBASE v2.01 Refs [1-5]. Alignment accuracy of multiple alignment programs compared to that of ReAlign as measured on BAIBASE v2.01 Reference sets [1-5] using the provided bali\_score tool (SP and TC scores calculated on all of the columns versus on columns containing features are all shown). RetAlign was run with sequence weighting on, a single guide tree treation and with a rescular threshold of 800. FSA was run in maximum sensitivity mode. MAFT was run with the auto switch and ClustaW with the default settings.

## Current and future work

Working on a sequel paper: how to build up an alignment network from multiple separete MSA alignments?

• different input parameters for the underlying MSA algorithm

・ロト ・ 日 ・ モ ・ ト ・ モ ・ うへぐ

- sampling
- measure performance

#### References and sources

#### • Publication:

Adrienn Szabó, Ádám Novák, István Miklós, Jotun Hein: *Reticular alignment: A progressive* corner-cutting method for multiple sequence alignment, BMC Bioinformatics, 2010

- References:
  - http://en.wikipedia.org/wiki/Sequence\_alignment
  - http://en.wikipedia.org/wiki/Multiple\_sequence\_alignment

・ロト ・ 日 ・ ・ 日 ・ ・ 日 ・ ・ 日 ・ ・ つ へ ?

- Sources of pictures:
  - http://upload.wikimedia.org/wikipedia/commons/8/86/ Zinc-finger-seq-alignment2.png
  - http://cnx.org/content/m15807/latest/

# Questions?



・ロト ・ 日 ・ モ ト ・ モ ・ うへぐ