



Protein Alignment on UPMEM PiM Architecture

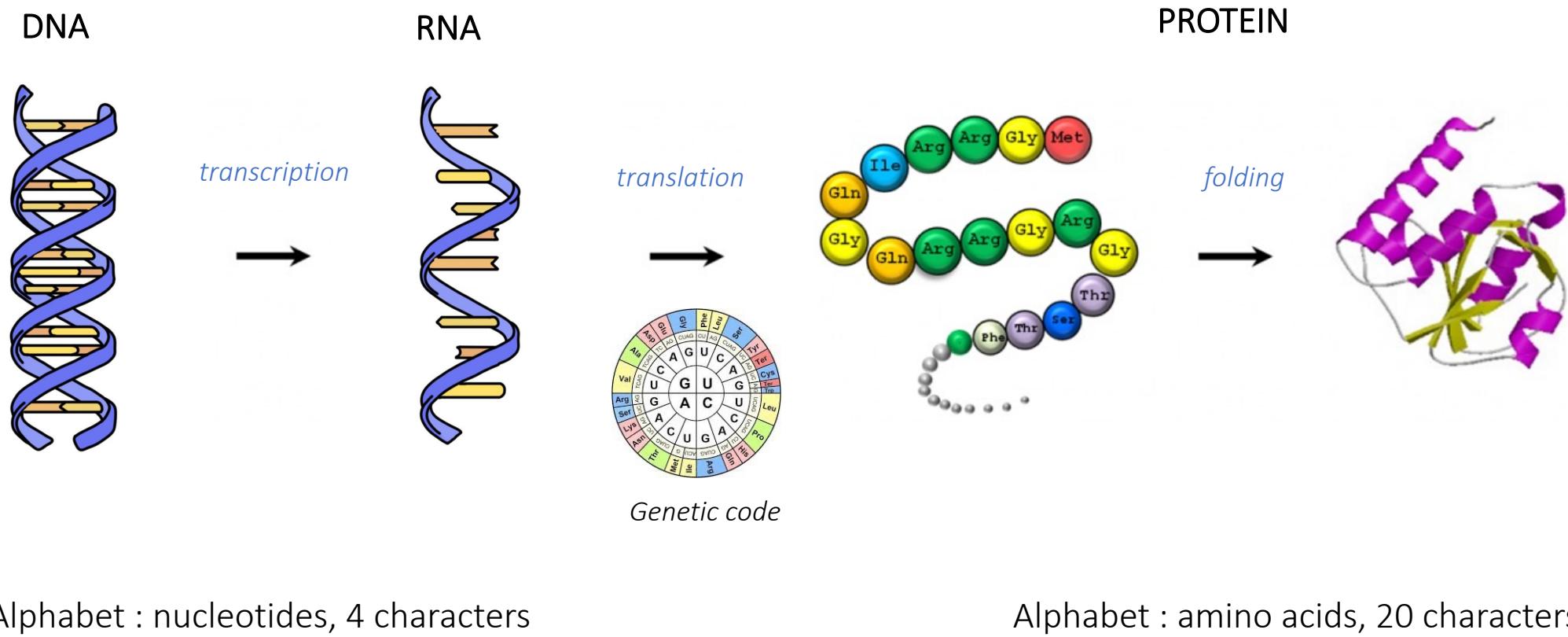
Dominique Lavenier



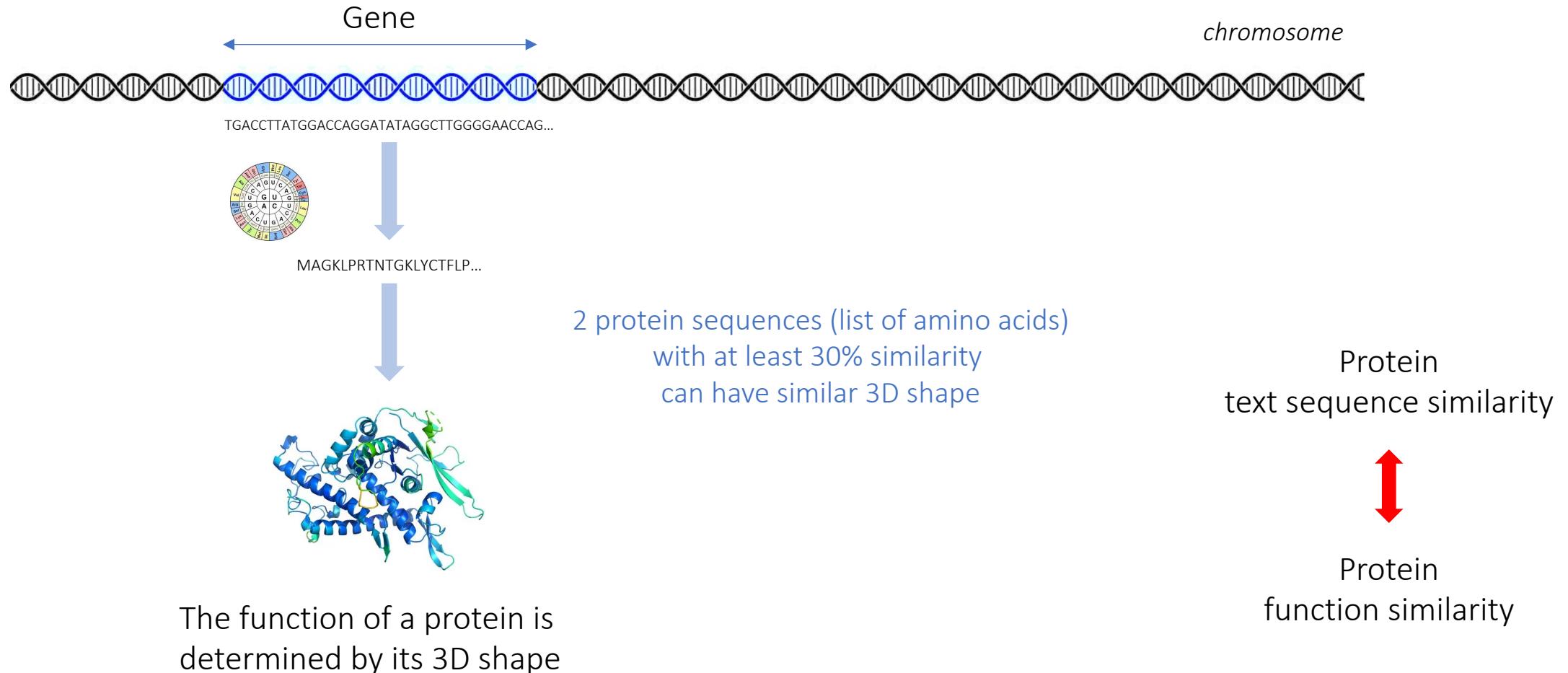
GenScale, Univ. Rennes, IRISA/CNRS, INRIA - France



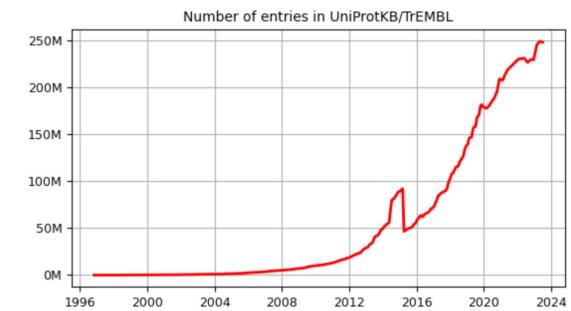
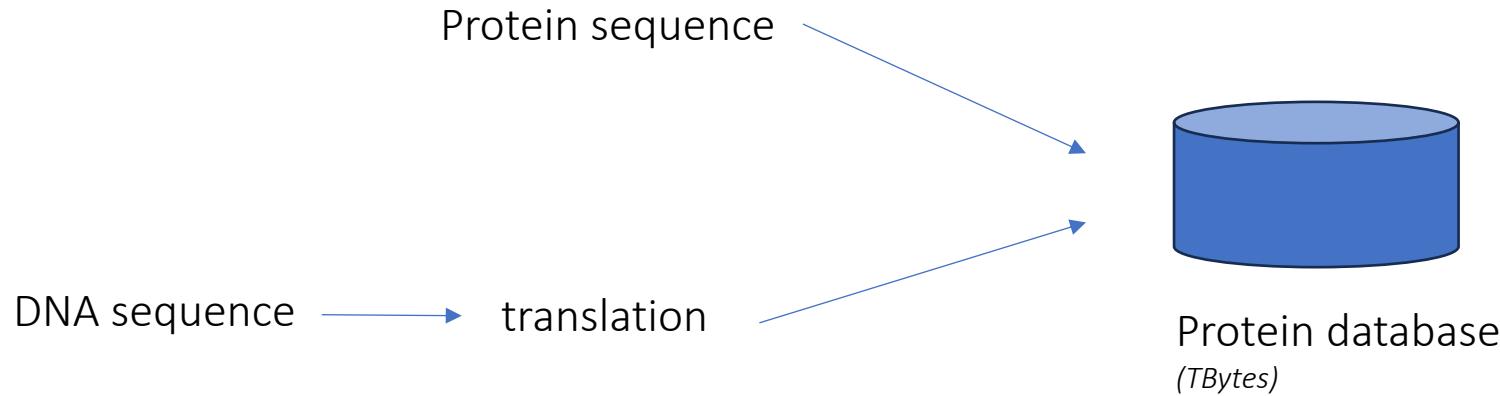
Central dogma of molecular biology



Text / Function relationship



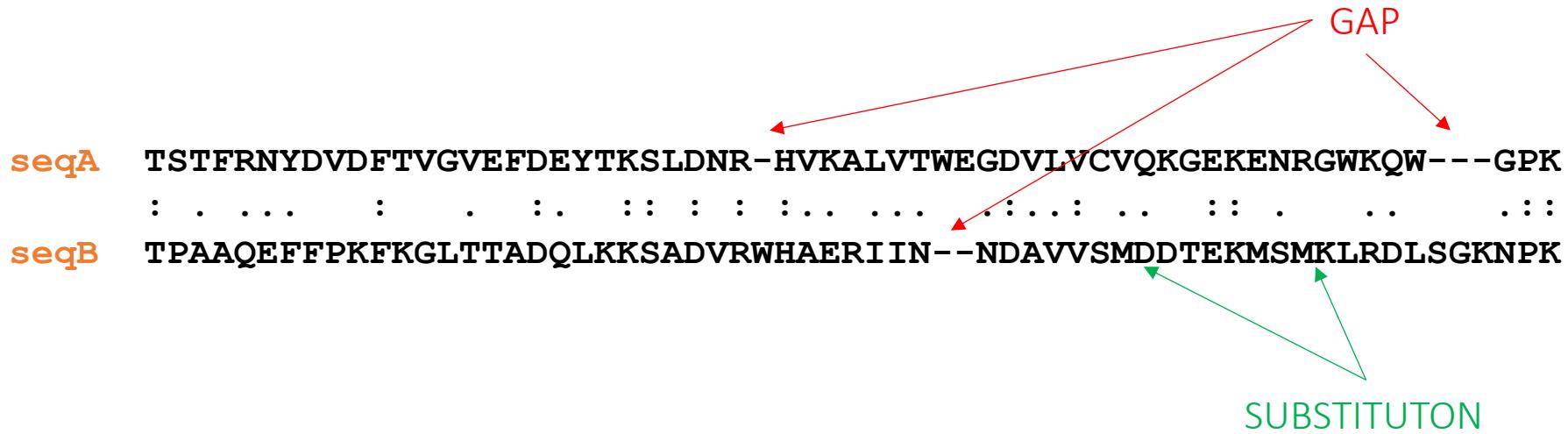
Protein database search



Execution time → hours/days/weeks of computation (metagenomic projects: billions of DNA sequences)

Querying results = list of alignments

Alignments



Find the best match between 2 sequences using the minimum number of elementary edit operations

The score of an alignment is the cost of all edit operations

The substitution cost between 2 amino acids is given by a substitution matrix

j	C	S	T	P	A	G	N	D	E	Q	H	R	K	M	I	L	V	F	Y	W	5-11
i	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	4
1	0	9	-1	-3	0	-3	-3	-3	-4	-3	-3	-3	-3	-3	-3	-3	-3	-3	-3	5-11	
2	-1	0	5	-1	-1	-1	-2	-2	-2	-2	-2	-2	-2	-2	-2	-2	-2	-2	-2	4	
3	-1	1	0	-1	-1	-1	-2	-2	-2	-2	-2	-2	-2	-2	-2	-2	-2	-2	-2	3	
4	-3	-1	7	0	0	-1	-1	-1	-1	-1	-1	-1	-1	-1	-1	-1	-1	-1	-1	2	
5	0	1	0	-1	0	-1	-1	-1	-1	-1	-1	-1	-1	-1	-1	-1	-1	-1	-1	1	
6	-3	0	-2	-2	0	0	6	0	0	0	0	0	0	0	0	0	0	0	0	0	
7	-3	-1	0	-2	-2	-2	0	6	0	0	0	0	0	0	0	0	0	0	0	-1	
8	-3	1	-1	-1	-1	-2	-1	1	6	0	0	0	0	0	0	0	0	0	0	-2	
9	-4	0	-1	-1	-1	-1	-2	-1	1	6	0	0	0	0	0	0	0	0	0	-3	
10	-3	0	-1	-1	-1	-1	-2	0	0	0	2	5	0	0	0	0	0	0	0	-4	
11	-3	0	-2	-2	-2	-2	1	-1	0	0	0	8	0	0	0	0	0	0	0	0	
12	-3	-1	-1	-2	-1	-2	0	-2	0	1	0	5	0	0	0	0	0	0	0	0	
13	-3	-1	-1	-1	-1	-2	0	0	-1	1	1	2	5	0	0	0	0	0	0	0	
14	-1	0	-1	-1	-1	-3	-2	-3	0	-2	-1	-1	5	0	0	0	0	0	0	0	
15	-1	-2	-1	-3	-1	-4	-3	-3	-2	-3	-3	-3	1	1	1	1	1	1	1	1	
16	-1	-2	-1	-3	-1	-4	-3	-4	-3	-2	-3	-2	2	2	2	2	2	2	2	2	
17	-1	-2	0	-2	0	-3	-3	-3	-2	-3	-3	-2	1	3	1	1	1	1	1	1	
18	-2	-2	-2	-4	-2	-3	-3	-3	-3	-1	-3	-3	0	0	0	-1	6	0	0	0	
19	-2	-2	-2	-3	-2	-3	-2	-3	-2	-1	-2	-2	2	2	2	-1	-1	-1	3	7	
20	-2	-3	-2	-4	-3	-2	-4	-4	-3	-2	-3	-2	-1	-3	-2	-3	-1	-3	-2	11	

Alignments

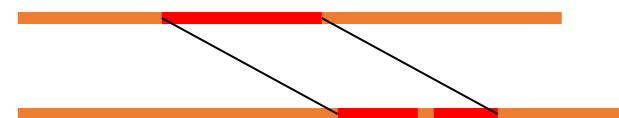
2 types :

→ global alignment



To compare proteins of the same family

→ local alignment



To find similar regions

Computation of alignments

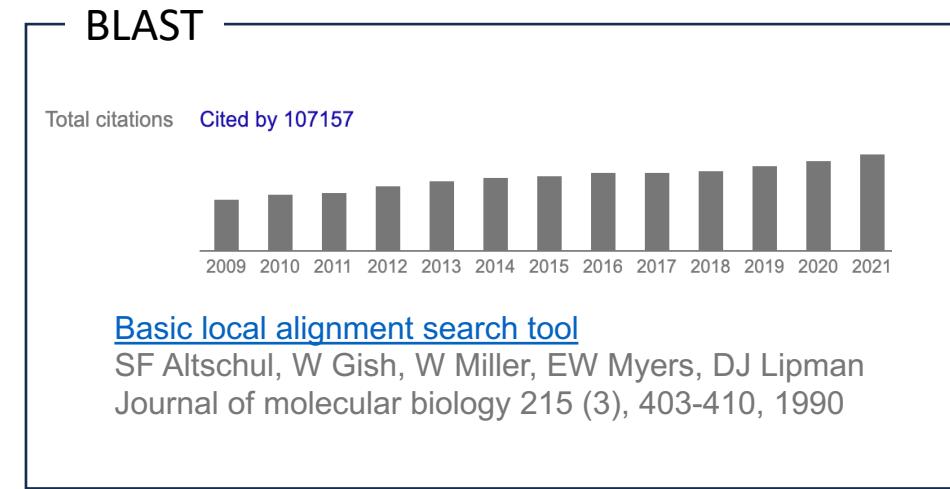
Seed & extend heuristics

Much faster than dynamic programming methods

Reference software = BLAST

3 step process:

1. Search seed
2. Extend seed → hit
3. Compute alignment from hit



seeds = words of 3 amino acids

→ Hypothesis:

An alignment can be built only if
the 2 sequences share at least 2
compatible seeds within a given interval

Computation of alignments

Seed & extend heuristics

3 step process:

1. Search seed
2. Extend seed → hits
3. Compute alignment from hits

MEVF**PLT**GFAYMCTGHPTYLIROWPNQPANPMVCTRE

KLMPRTYKSGHPVYLSROLPQ**PLT**CQTPLQANPER

MEVF**PLT**GFAY
OLPQ**PLT**CQTP

No possible extension

Computation of alignments

Seed & extend heuristics

3 step process:

1. Search seed
2. Extend seed → hits
3. Compute alignment from hits

MEVFPLTGFAYMCT**GHP**TYLIROWPNQPANPMVCTRE

KLMPRTYKS**GHP**VYLSROLQPQLTCQTPLQANPER

TYMCT**GHP**TYLIROWPNQP
RTYCS**GHP**VYLSROLQPQL

TYMCT**GHP**TYLIROWPNQP
| | | | | |
RTYCS**GHP**VYLSROLQPQL

TYMCT**GHP**TYLIROWPNQP
|| | | | | | | |
TY-CS**GHP**VYLSROLP-QP

1. seed search

2. seed extension

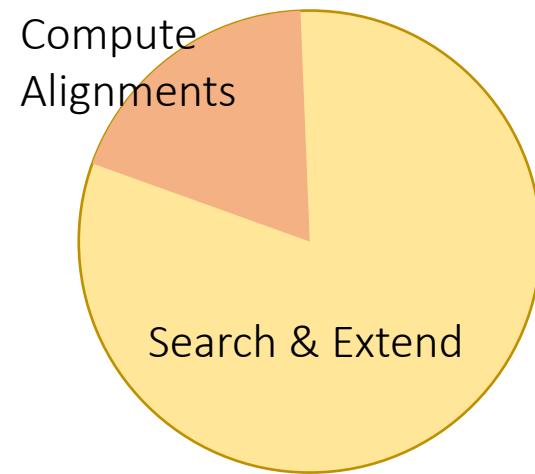
3. alignment computation

Computation of alignments

Seed & extend heuristics

3 step process:

1. Search seed
2. Extend seed → hits
3. Compute alignment from hits



% execution time

Most of the execution time is spent in step 1 & 2

PiM implementation

Pang: Protein Alignment with No Gap

First version of protein alignment on UPMEM PiM for feasibility study. On going work



Objectives

- Design a parallel implementation using both PiM and the host processor resources
 - PiM → DPU + MRAM
 - Processors → cores + legacy RAM

Seed-extend strategy:

1. Search seeds → DPU
2. Extend seed → hits → Host
3. Compute alignments (no gap)

Seed-extend strategy of Pang slightly different from the blast strategy
Same sensitivity

Database indexing

To speed up the “search” step (avoid systematic scan of the database)

Database = list of protein sequences

For each possible word of 3 characters over the protein alphabet, a list of tuples (n,x) is created:

n = protein sequence number

x = position of the word in the protein sequence

Example

Protein 1: TREQNES

Protein 2: MSTREP

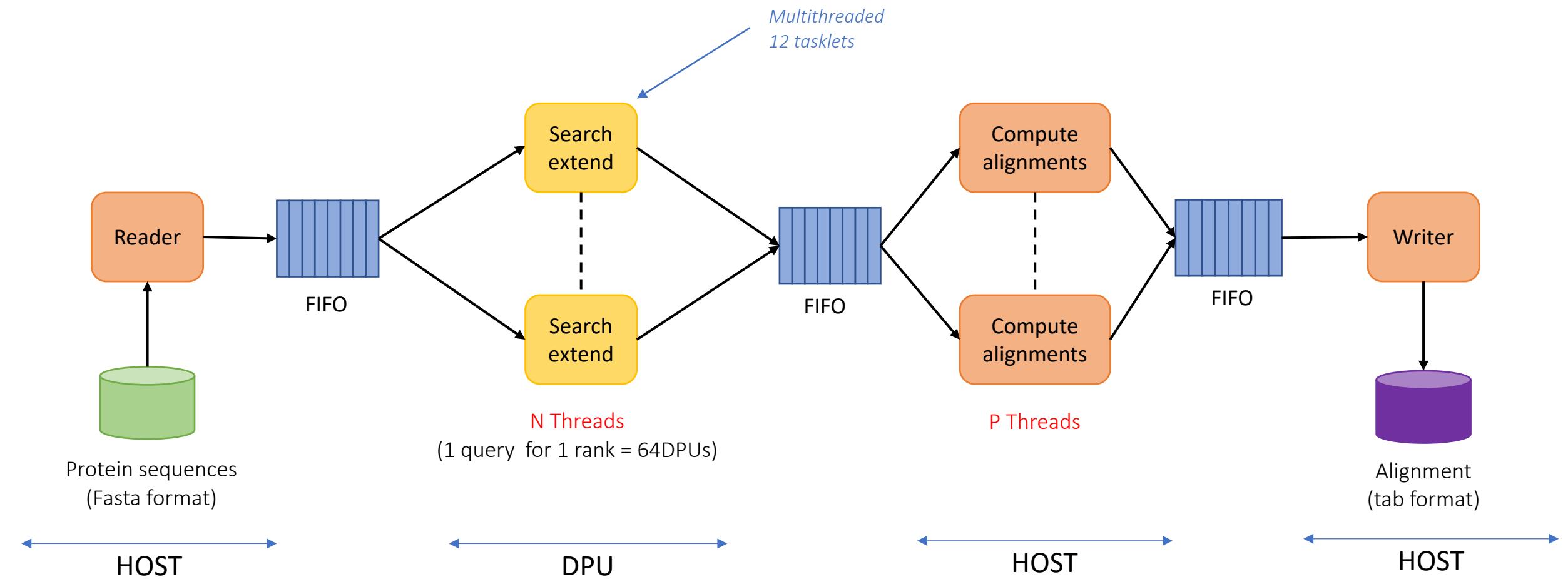
TRE	(1,1), (2,3)
REQ	(1,2)
EQN	(1,3)
QNE	(1,4)
NES	(1,5)
MST	(2,1)
STR	(2,2)
REP	(2,4)

Index

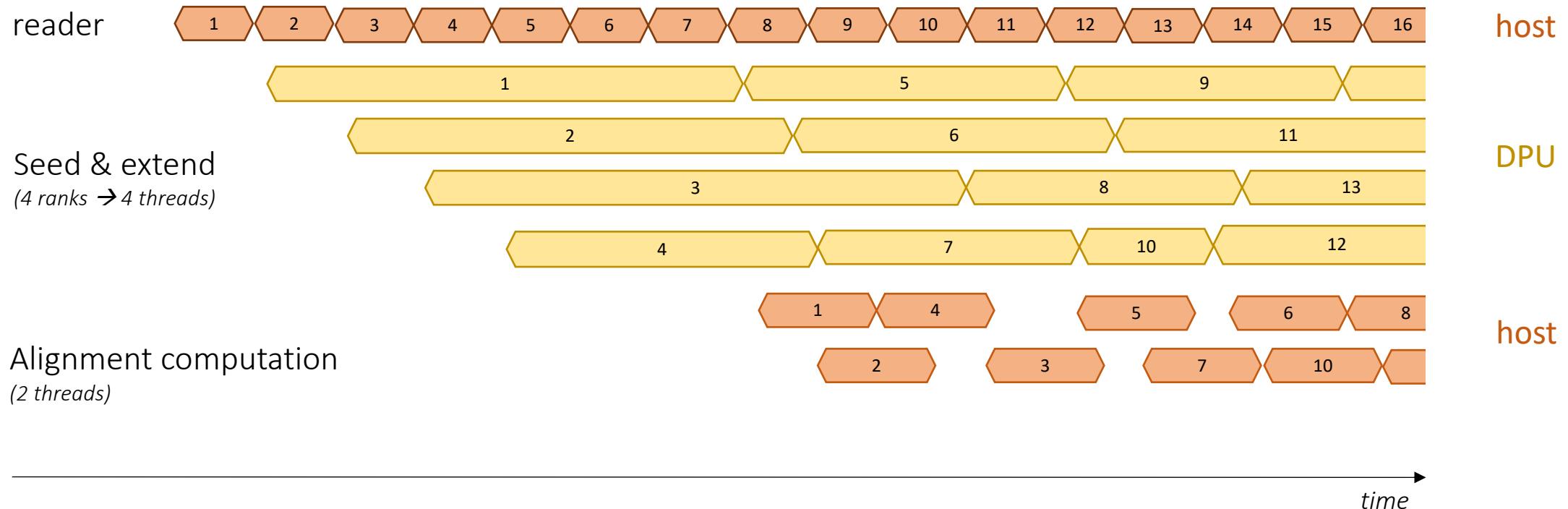
- stored in the PiM memory
- fit in a single rank (64 DPUs, 4 Gbytes)
- split over 64 MRAM DPUs
 - each MRAM contains part of the database*

Database querying

DPU are dedicated to the search and extend steps
Host manage I/O and computes alignment



Synchronization



Experiments

Data sets

- Query
 - S1k.fa = 10^3 proteins
 - S10k.fa = 10^4 proteins
- Database = SwissProt, 563 000 proteins → index can fit on a rank (64 DPUs)

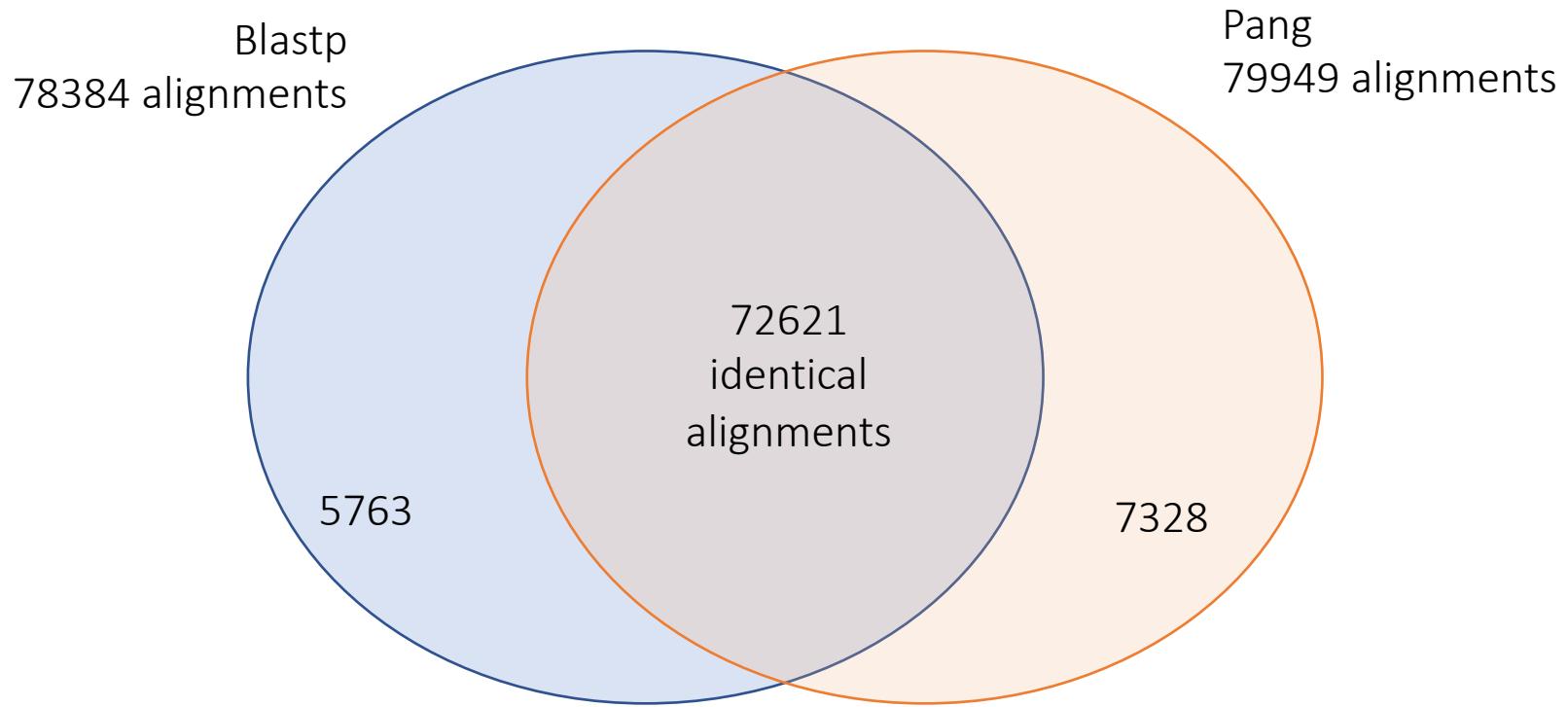
Hardware: UPMEM server

- CPU: 2 × Intel Xeon 4215 processeur, 2.5 GHz (16 cores)
- 256 Gbytes of standard memory
- 160 Gbytes of PiM memory (40 ranks of 64 DPUs)

Comparison with blastp (ungapped)

```
blastp -query s10k.fa -db sprot -ungapped -out align.blast -comp_based_stats F -evaluate 1e-6 -seg yes -outfmt 6 -num_threads X
```

Pang vs Blastp sensitivity



Data : s1k.fa (10^3 proteins) vs SwissProt (563K proteins)

Pang speed-up vs Blastp

Rank
64 DPU on the same die
Optimized transfer

Execution time: Blastp & Pang (in sec.) - 10^4 proteins

	blastp	Pang(1)	Pang (2)	Pang (4)	Pang (8)	Pang (16)	Pang (24)	Pang (32)
16 cores	844,00	938,14	473,26	240,98	127,15	73,37	62,51	55,46
8 cores	1490,00	939,83	475,31	243,12	128,75	74,42	61,13	55,62
4 cores	2821,00	939,72	475,00	242,66	128,34	76,87	62,06	56,22
2 cores	5495,00	939,05	475,32	242,94	128,63	82,50	67,48	62,13
1 core	10440,00	943,09	477,64	244,97	142,47	96,83	82,23	78,98

Run with 32 PiM ranks

Speed-up = Blastp time / Pang time

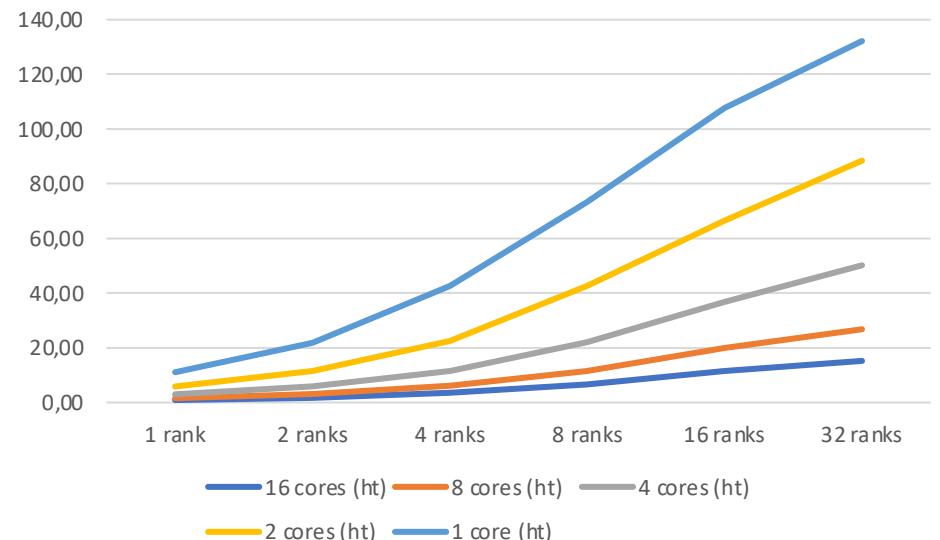
Pang time include database indexing

Taskset linux command is used to constrain the number of cores

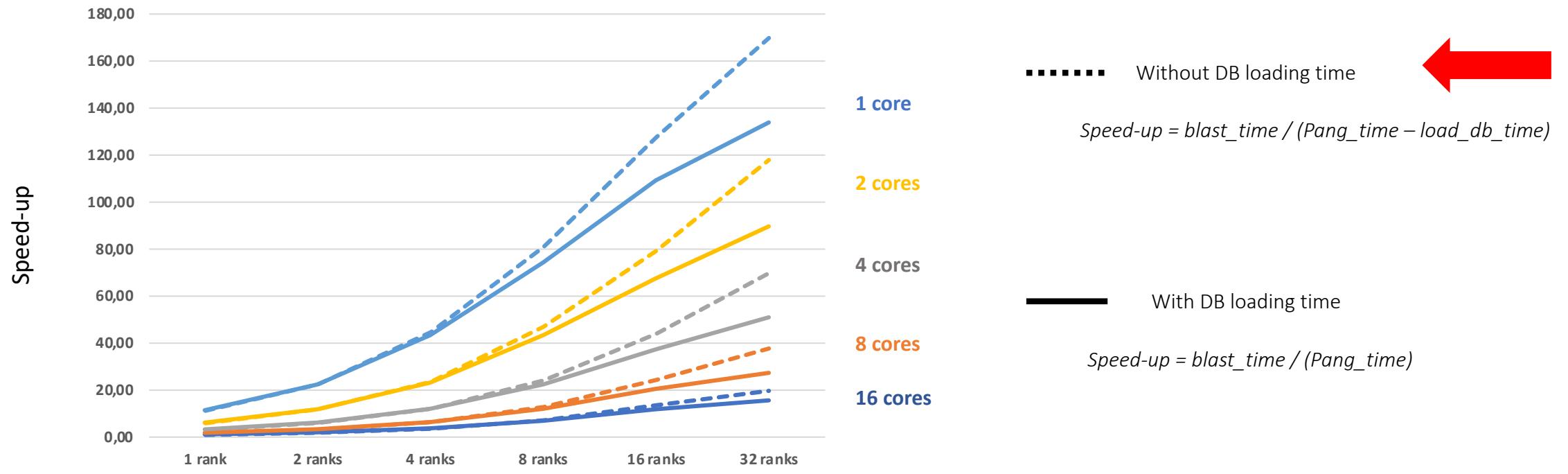
Hyper threading is active

Pang speed-up

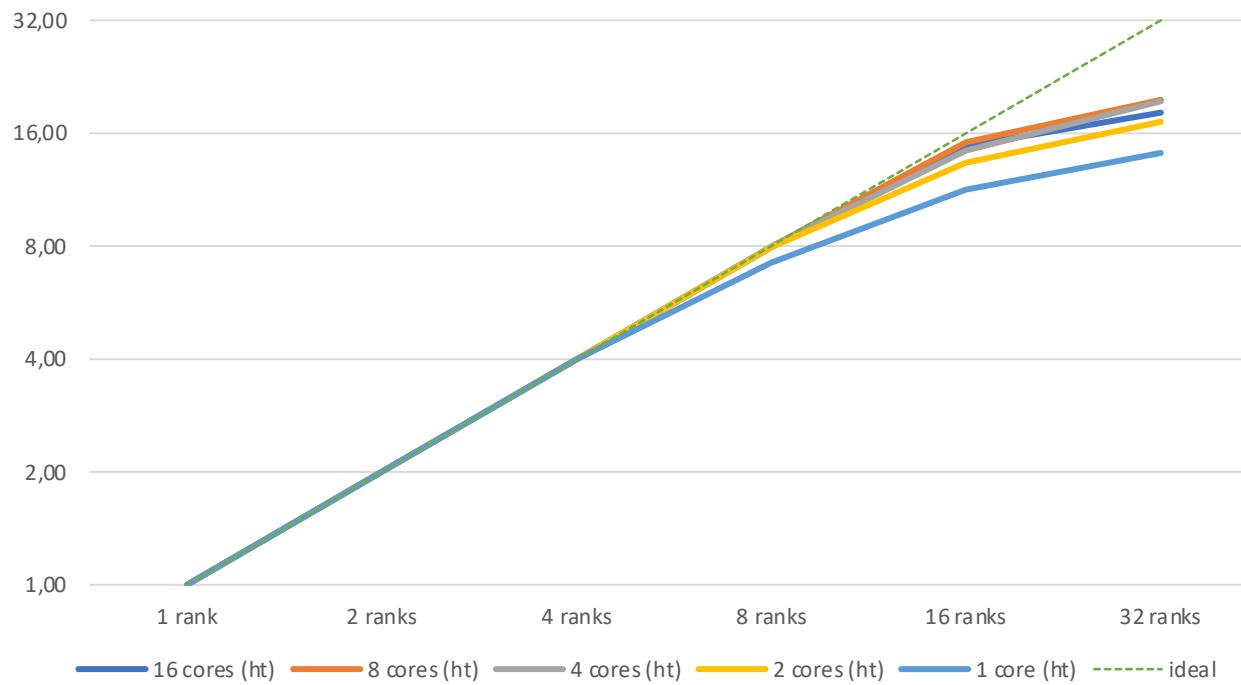
	1 rank	2 ranks	4 ranks	8 ranks	16 ranks	32 ranks
16 cores	0,90	1,78	3,50	6,64	11,50	15,22
8 cores	1,59	3,13	6,13	11,57	20,02	26,79
4 cores	3,00	5,94	11,63	21,98	36,70	50,18
2 cores	5,85	11,56	22,62	42,72	66,61	88,44
1 core	11,07	21,86	42,62	73,28	107,82	132,19



Pang speed-up vs Blastp without database loading time



Pang Scalability (without DB loading)



Scalability = $\frac{\text{exec. Time 1 rank}}{\text{exec. Time N ranks}}$

Conclusion

- Good speed-up on protein alignment can be achieved compared to commonly used software
 - DPU are well suited for string processing
→ No floating point operations, no multiplication, ...
- Code need to be completely rewritten
 - Fine grained parallelism
 - Cannot implement specific functions due to DPU limitation (size of the scratchpad for example)
- Next
 - Extend analysis with other data sets
 - Energy saving analysis
 - Optimization with DIAMOND ideas
 - Software much faster than blastp, but less sensitive
 - Add gaps
 - Performances will slightly decrease
 - Nucleic vs Protein (blastx)

Thank you for your attention

Dominique Lavenier

lavenier@irisa.fr

GenScale, Univ. Rennes, IRISA/CNRS, INRIA - France