

#### VirHunter: a deep learning-based method for detection of novel viruses in plant sequencing data

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#### ▶ To cite this version:

Grigorii Sukhorukov, Macha Nikolski. VirHunter: a deep learning-based method for detection of novel viruses in plant sequencing data. PlantGen 2021, Jun 2021, Novosibirsk, Russia. hal-03271424

#### HAL Id: hal-03271424 https://hal.science/hal-03271424v1

Submitted on 25 Jun 2021

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# VirHunter: a deep learning-based method for detection of novel viruses in plant sequencing data

Sukhorukov Grigorii, Macha Nikolski

Cbib BIOINFORMATIQUE

Prediction virus

0.9

Prediction plant

0.09

Prediction bacteria

0.01

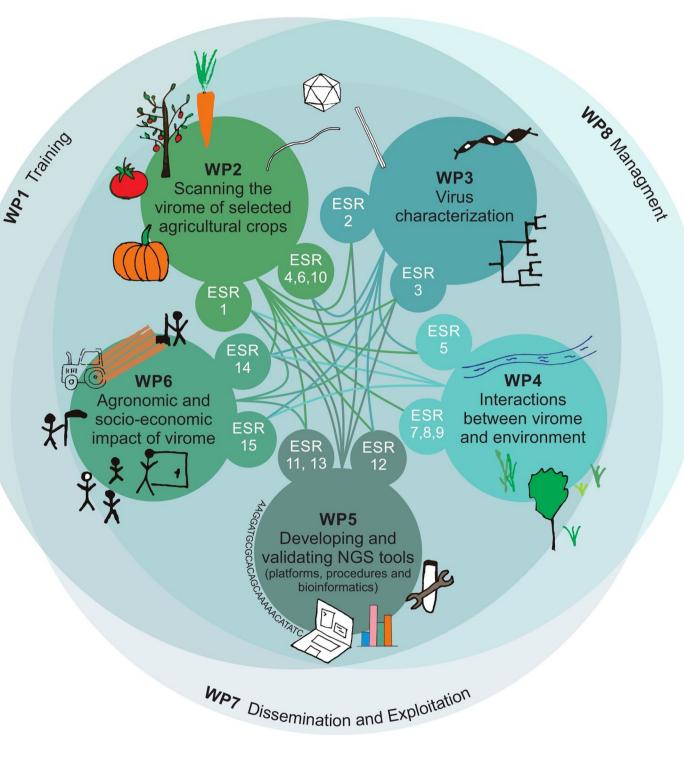
**Final prediction** 

#### **Plant viruses in our lives**

➤ Plant Viruses cause 50% of the emerging plant diseases and pose an important threat to many agricultural crops worldwide, they are responsible for production losses estimated at € 15 to 45 billion per year.

# **MSCA ITN INEXTVIR**

Network for Next Generation Training and Sequencing of Virome



## VirHunter idea

- Develop deep learning approach to detect novel plant viruses from assembled contigs of plant virome sequencing data
- > Leverage multiple models that rely on different k-mer sizes
- Enable multi-class approach to deal with contamination problem (virus, plant, bacteria)
- Validate the approach on leave-out datasets (family, genus, specie levels)

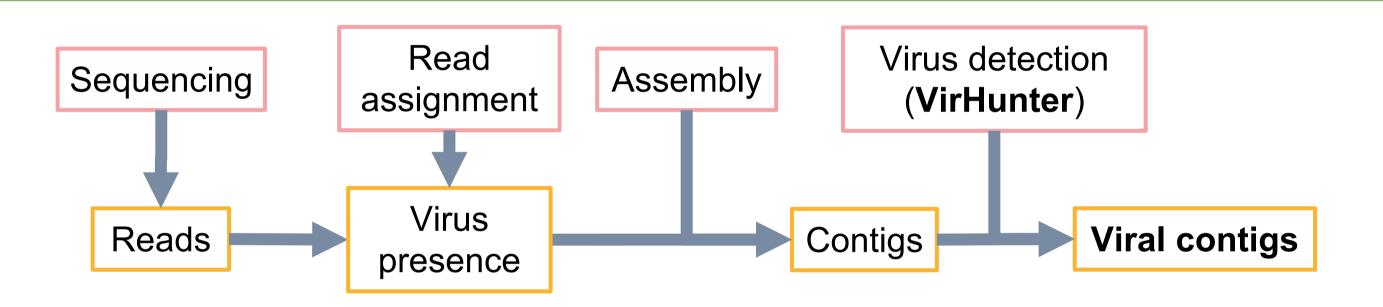
#### **Network architecture**

intermediate table

- classification
- Our research:
  Bioinformatics pipelines
  development for virome
  classification

INEXTVIR project landscape

## Novel virus detection workflow



### What makes VirHunter special

**ML** classifier

- Highly accurate novel virus identification
- Deals with contamination

3 streams DL network

Forward

CTGAC...

GACTG...

Reverse

- Can be easily integrated in standard pipelines
- Uses novel hybrid architecture
  (deep learning + standard machine learning)

#### Challenges of novel virus detection

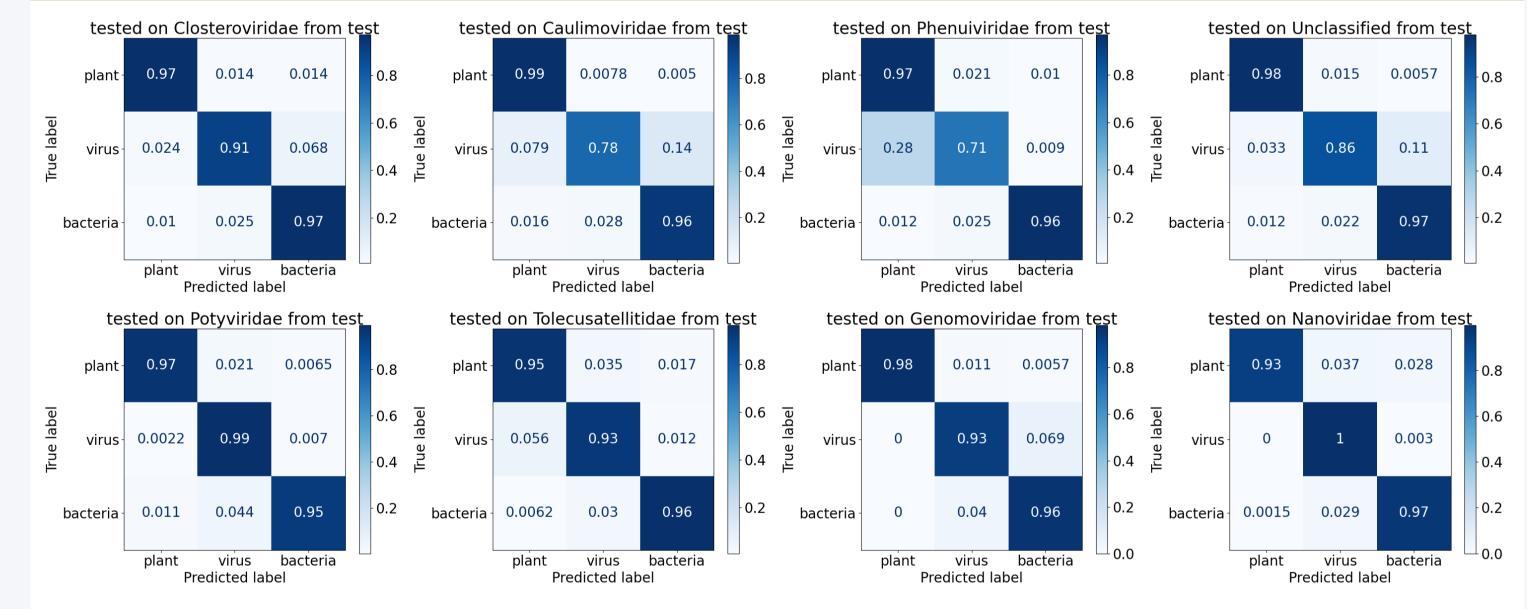
- Virome samples are usually contaminated with bacterial or plant genetic material
- Sequencing technology may disfavor detection of some viruses
- Plant virus families are very dissimilar
- Much of plant viral diversity is not yet described

<sup>20</sup> <sup>10</sup> 

#### **Existing tools**\*







#### Confusion matrices for viral family leave-out datasets

ΤοοΙ	% of correctly identified viruses	Weighted average
VirHunter	(69-91%)	85.6%
DeepVirFinder	(57-83%)	72.5%

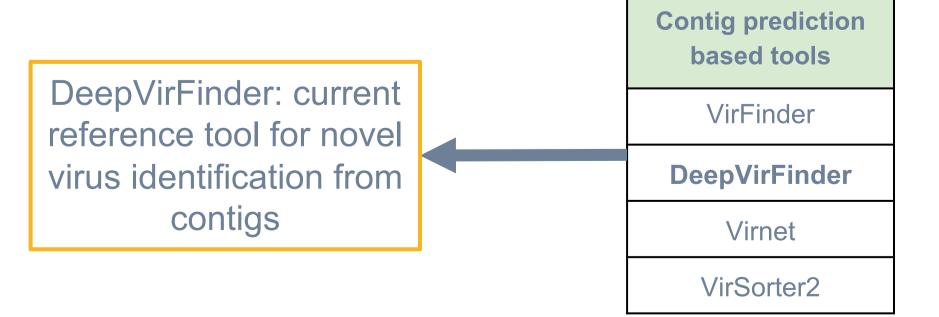
## VirHunter outperforms DeepVirFinder!

# Model interpretability

Model-4

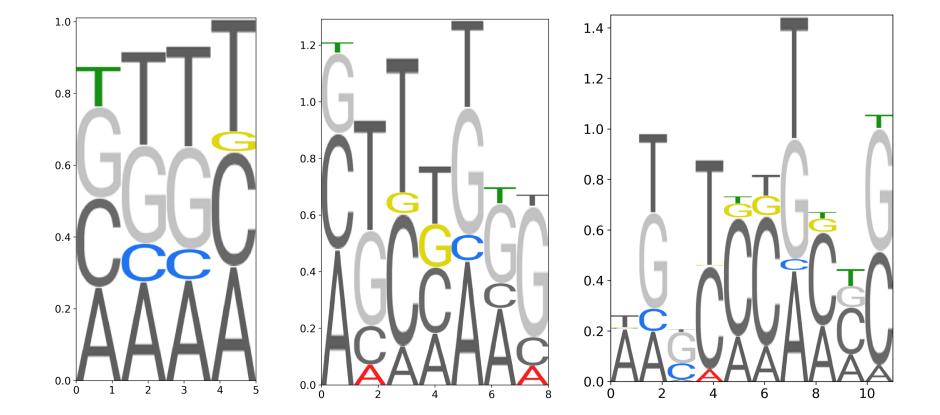
Model-7

Model-10



\* work done together in collaboration with:

University of Ljubljana, Faculty Of Computer And Information Science, Ljubljana, Slovenia Plant Pathology Laboratory, TERRA, Gembloux Agro-Bio Tech, University of Liège, Gembloux, Belgium



#### Examples of motifs learnt by the models. Letters in color are rewarded, letters in gray are penalized

