



UNIUNEA EUROPEANĂ



Instrumente Structurale  
2014-2020

# Big Data and Machine Learning on Virtual Graphics Processing Units



**UNIVERSITATEA TEHNICĂ**  
DIN CLUJ-NAPOCA



Adrian Sabou

Computer Science Department

Technical University of Cluj-Napoca

*adrian.sabou@cs.utcluj.ro*

- **Titlu:** Cloud Cercetare UTCN – CLOUDUT  
(<http://cloudut.utcluj.ro>)
- **MySMIS ID:** 124493
- **Contract nr:** 235/ 21.04.2020
- **Tip Proiect:** Program Operațional Competitivitate 2014-2020 (POC)
- **Axa prioritara 1:** Cercetare, dezvoltare tehnologică și inovare (CDI) în sprijinul competitivității economice și dezvoltării afacerilor
- **Acțiunea 1.1.2:** Dezvoltarea unor rețele de centre CD, coordonate la nivel național și racordate la rețele europene și internaționale de profil și asigurarea accesului cercetătorilor la publicații științifice și baze de date europene și internaționale
- **Finanțare:** Fonduri Europene pentru Dezvoltare Regională, Valoarea totală: 4.955.000 RON, din care 4.950.000 RON din fonduri Europene.



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# Welcome to the Era of AI

## DEEP LEARNING EVERYWHERE



Deep Learning is Everywhere [7]

# Cloud Infrastructure

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Minimum requirements:

- 20 x 16 core CPU processors, 2GHz, support for VMWare virtualization and hyperthreading
- 2 AI processing servers. Each server is equipped with 2 x 20 core processors, 512GB RAM, 1TB storage, 2 x GPUs with 640 tensor cores, 32 GB, support for virtualization
- 16GB RAM per CPU core, storing capacity 70TB, RAID 5
- 25Gbps internal and external connectivity

# Cloud Infrastructure

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- 2 x Dell Poweredge R740 servers
  - (each with) 2 x NVIDIA V100 GPUs, 32 GB



Dell Poweredge R740 [6]

Optimized for workload acceleration

Optimized for AI and GPGPU Computing



NVIDIA V100 (PCIe) [1]

# NVIDIA V100 – Specifications

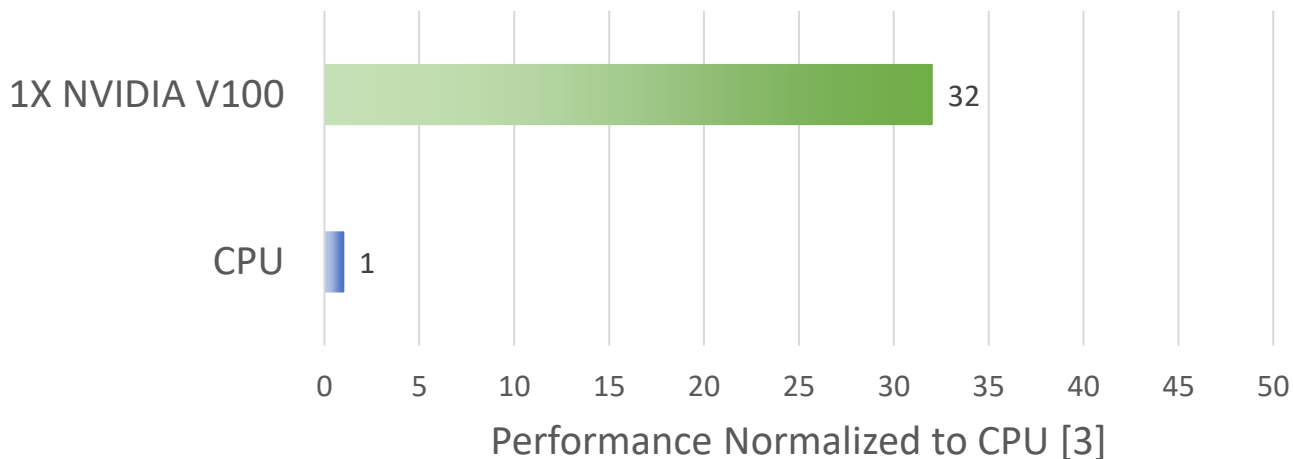
Specification	V100 PCIe	V100 SXM2	V100S PCIe
GPU Architecture	NVIDIA Volta		
NVIDIA Tensor Cores	640		
NVIDIA CUDA Cores	5120		
Double-precision Performance	7 TFLOPS	7.8 TFLOPS	8.2 TFLOPS
Single-precision Performance	14 TFLOPS	17.7 TFLOPS	16.4 TFLOPS
Tensor Performance	112 TFLOPS	125 TFLOPS	130 TFLOPS
GPU Memory	32 GB / 16 GB HBM2		32 GB HBM2
Memory Bandwidth	900 GB/sec		1134 GB/sec
Compute APIs	CUDA, DirectCompute, OpenCL, OpenACC		

NVIDIA V100 Specifications [3]

# NVIDIA V100 – Acceleration

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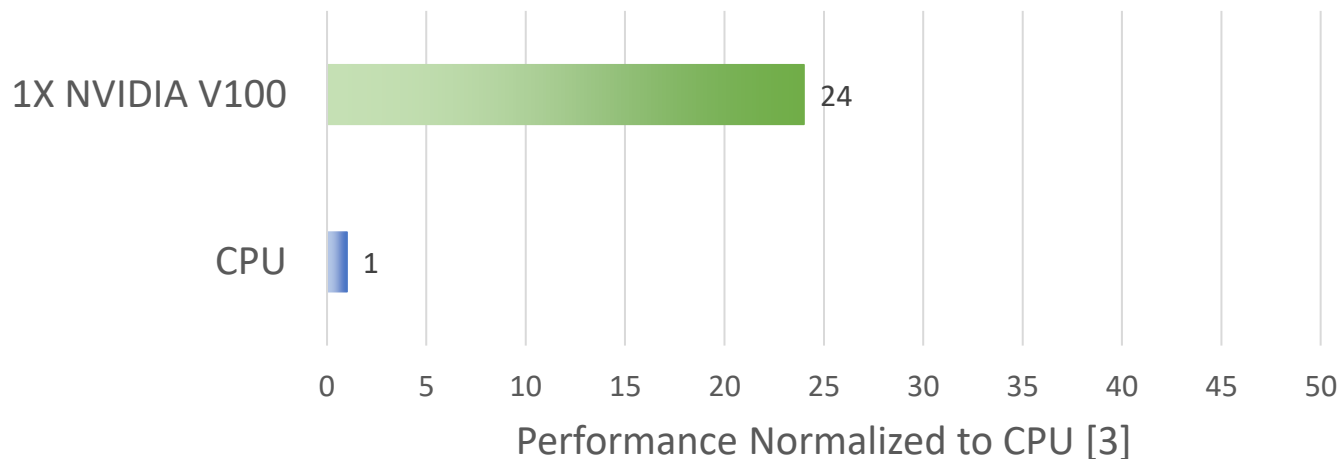
32X Faster Training Throughput than a CPU



ResNet-50 training, dataset: ImageNet2012, BS=256 | NVIDIA V100 comparison: NVIDIA DGX-2™ server, 1x V100 SXM3-32GB, MXNet 1.5.1, container=19.11-py3, mixed precision, throughput: 1,525 images/sec | Intel comparison: Supermicro SYS-1029GQ-TRT, 1 socket Intel Gold 6240@2GHz/3.9Hz Turbo, Tensorflow 0.18, FP32 (only precision available), throughput: 48 images/sec [3]

# NVIDIA V100 – Acceleration

24X Higher Inference Throughput than a CPU Server



BERT Base fine-tuning inference, dataset: SQuADv1.1, BS=1, sequence length=128 | NVIDIA V100 comparison: Supermicro SYS4029GP-TRT, 1x V100-PCI-E-16GB, pre-release container, mixed precision, NVIDIA TensorRT™ 6.0, throughput: 557 sentences/sec | Intel comparison: 1 socket Intel Gold 6240@2.6GHz/3.9Hz Turbo, FP32 (only precision available), OpenVINO MKL-DNN v0.18, throughput: 23.5 sentences/sec [3]

More details regarding Deep Learning Performance -

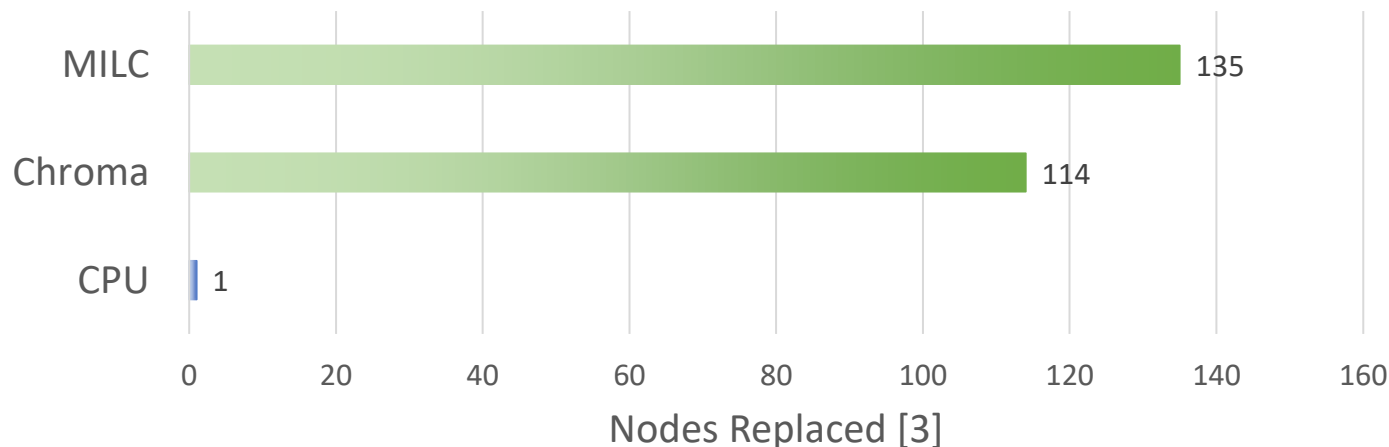
<https://developer.nvidia.com/deep-learning-performance-training-inference>



# NVIDIA V100 – Acceleration

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HPC: One V100 Server Node Replaces Up to 135 CPU-Only Server Nodes



16x V100-SXM2-32GB in NVIDIA HGX-2™ | Application (dataset): MILC (APEX Medium) and Chroma (szscl21\_24\_128) | CPU server: dual-socket Intel Xeon Platinum 8280 (Cascade Lake) [3]

More details regarding HPC Performance -

<https://developer.nvidia.com/hpc-application-performance>

# NVIDIA V100 – DL and HPC

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- Compatible with the most popular Deep Learning frameworks and with 600+ HPC applications [3]

theano

mxnet

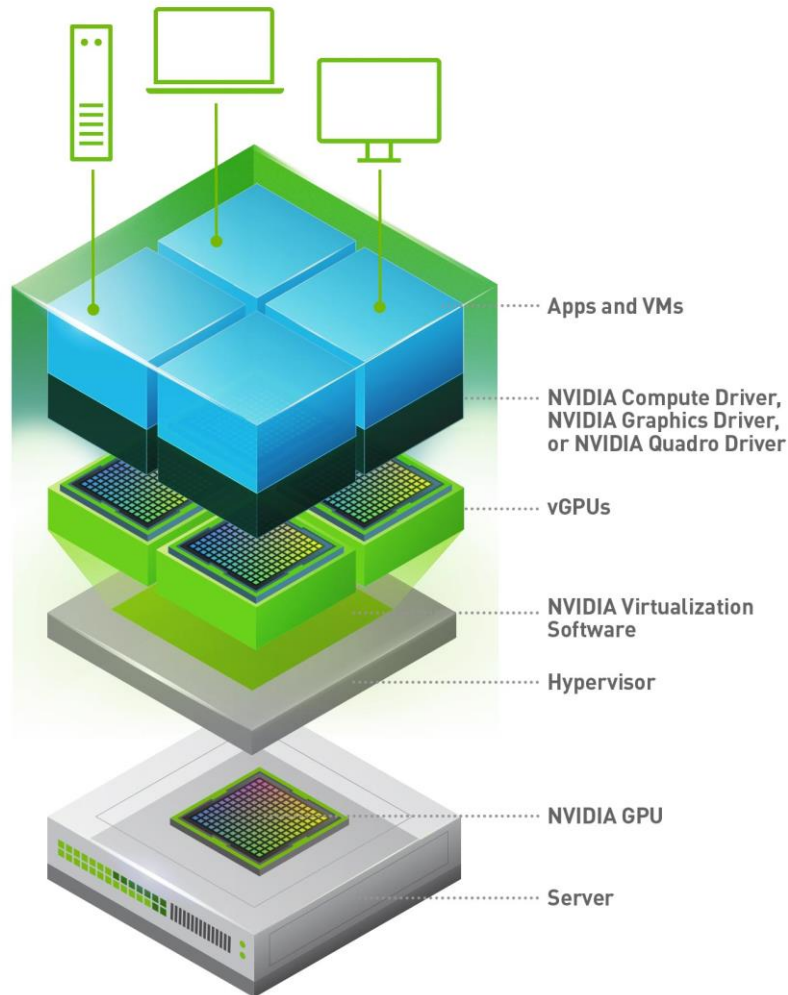


 TensorFlow

 Caffe2

PYTORCH

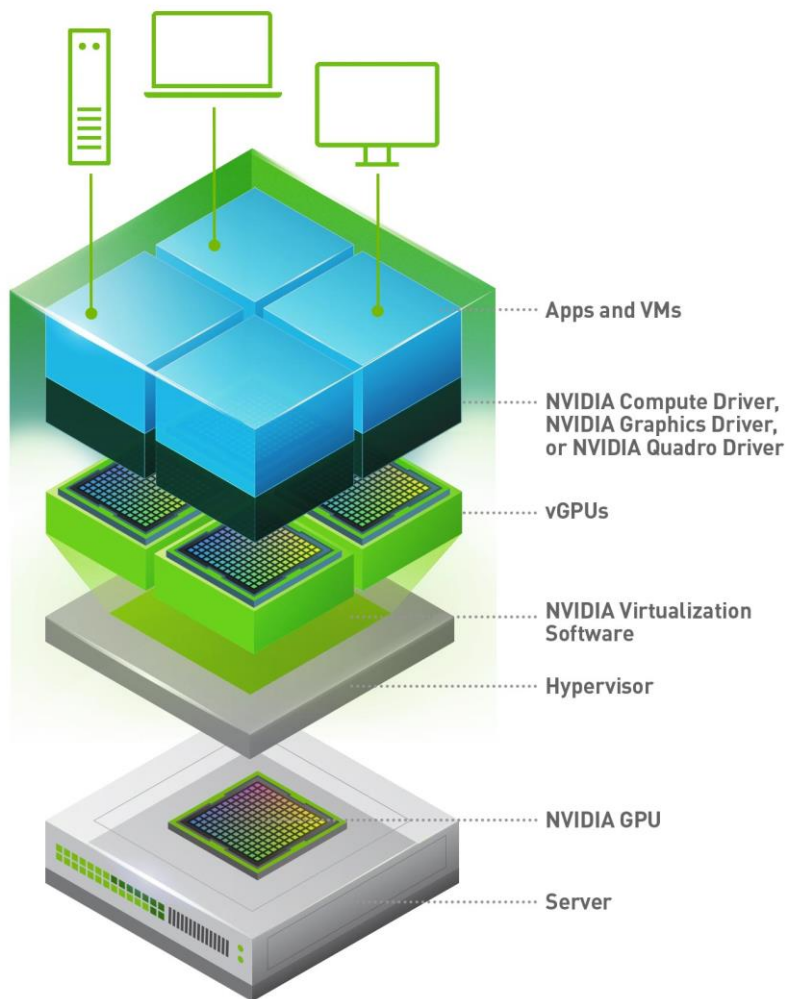
# NVIDIA V100 – Virtualization



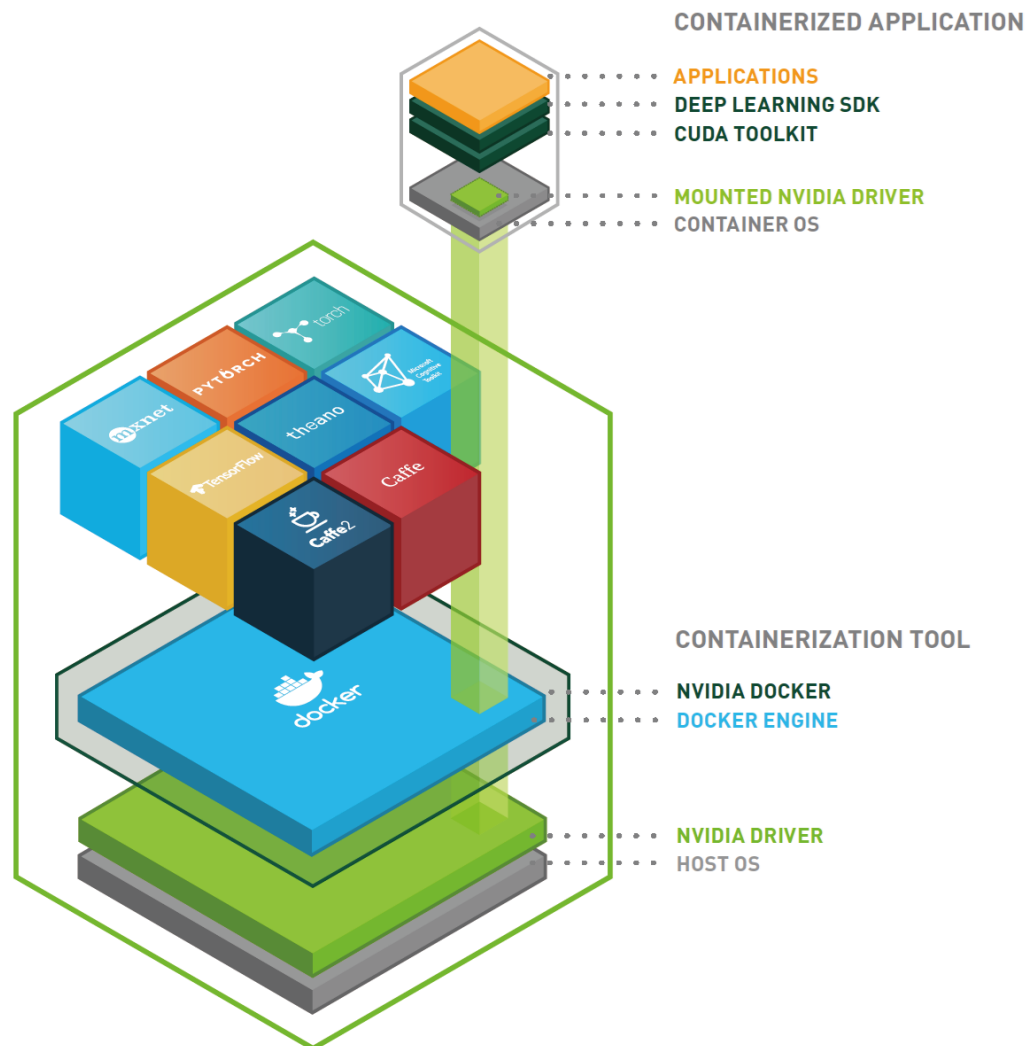
NVIDIA GPU Virtualization Stack [4]

- GPU Virtualization
- NVIDIA Virtual GPU Software Solutions
  - NVIDIA GRID (Virtual PC (GRID vPC) and Virtual Apps (GRID vApps)) (VDI)
  - NVIDIA Quadro Virtual Workstation (Graphics Processing)
  - NVIDIA Virtual Compute Server (Virtualization for complex AI and Compute tasks)

# Virtualization vs. Containerization



NVIDIA GPU Virtualization Stack [4]

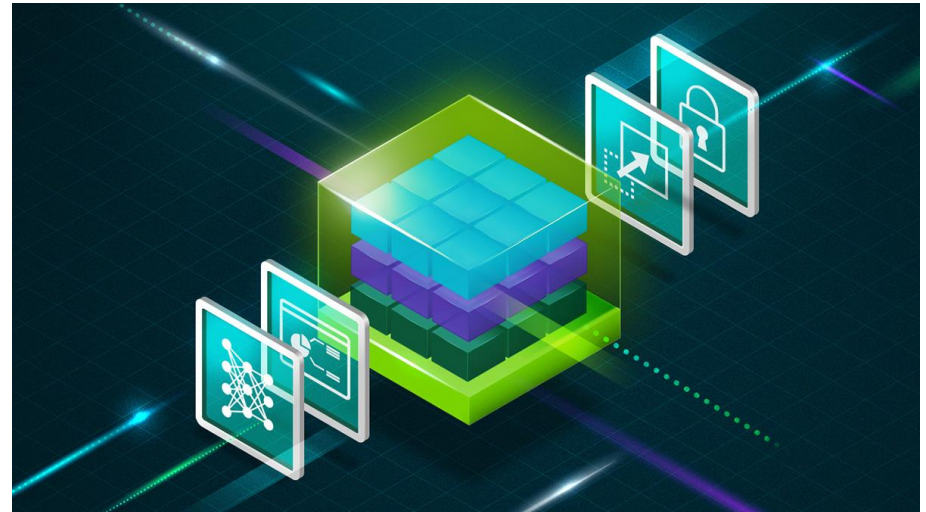


NVIDIA GPU Containerization Stack [8]

# NVIDIA Virtual Compute Server

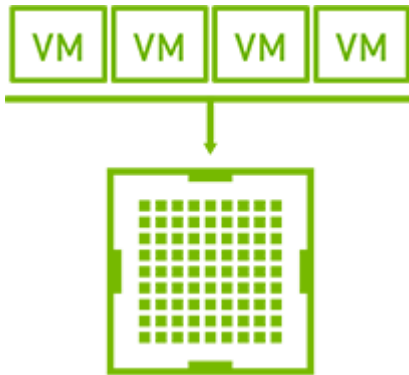
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- Software solution to virtualize computation for AI, Deep Learning, and Data Science
  - Artificial Intelligence
  - Deep Learning
  - Data science
  - High Performance Computing



NVIDIA Virtual Compute Server [5]

# NVIDIA Virtual Compute Server



GPU Sharing [5]

- GPU Sharing

- Fractional GPU sharing with NVIDIA vGPU technology
- Multiple VMs sharing the same GPU
- Maximizing utilization

- GPU Aggregation

- A VM can access more than one GPU
- Multi GPU Computing – GPUs aren't directly interconnected
- Peer-to-peer Computing – GPUs are interconnected through NVLink for higher bandwidth



GPU Aggregation [5]

# NVIDIA Virtual Compute Server

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Management and Monitoring [5]

- Management and Monitoring

- Support for app-, guest-, and host-level monitoring
- Live VM migration
- Suspend, resume, thresholds

- Multi-Instance GPU

- Specific for NVIDIA A100 Tensor Core GPU
- Partitioning the cores into up to seven instances
- Provisioning a VM on an instance



Multi-Instance GPU [5]

# Conclusions

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- GPUs – enormous potential for accelerating AI and GPGPU Computation
- GPU Virtualization – Maximum flexibility
- NVIDIA vGPU Software Solutions
  - NVIDIA Virtual Compute Server – AI and GPGPU Compute Tasks
  - GPU Sharing – Maximize utilization
  - GPU Aggregation – Flexible Multi GPU Computing



# References

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- [2] NVIDIA, "NVIDIA A100 Tensor Core GPU," 2020. [Online]. Available: <https://www.nvidia.com/en-us/data-center/a100/>.
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# Thank you for your attention!



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DIN CLUJ-NAPOCA



Adrian Sabou

Computer Science Department  
Technical University of Cluj-Napoca  
*adrian.sabou@cs.utcluj.ro*