

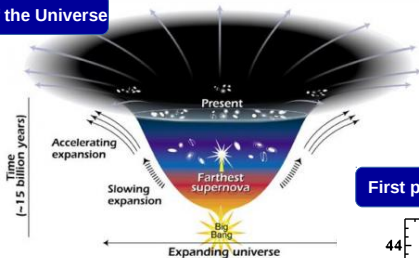
Deep Learning in LSST

Johanna Pasquet



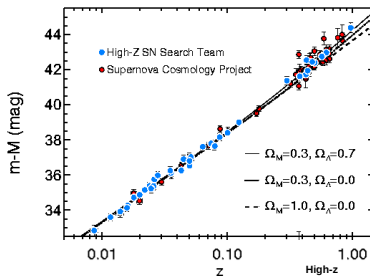
Nature of the dark energy

History of the Universe

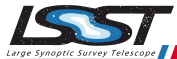


First proof with supernovae Ia

- Dark energy causes the universal expansion to accelerate
- Recent observations of supernovae have produced a value for an acceleration that implies a universe that is about 70 % dark energy



The Large Synoptic Survey Telescope



- LSST will produce the deepest, widest, image of the Universe :
 - 37 billion stars and galaxies
 - 10 year survey of the sky
 - 15 Terabytes of data ...every night !

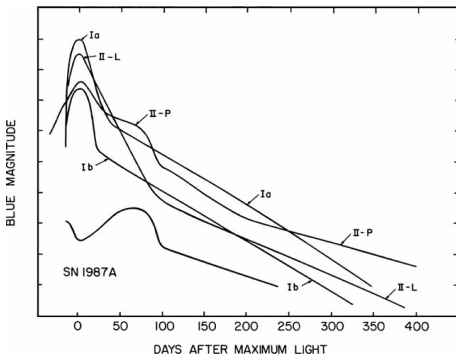


Issues :

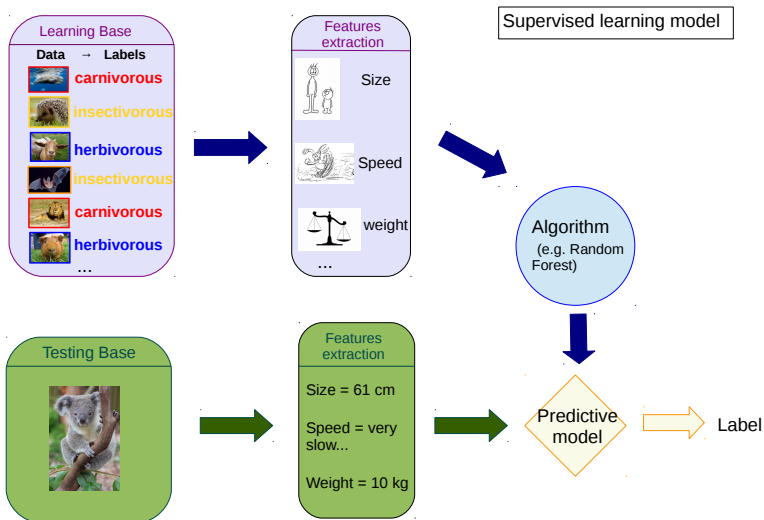
- LSST will discovery hundreds of thousands of type Ia supernovae
- Be able to automatically identify SNe Ia among all the supernovae with only the photometric information

Goals

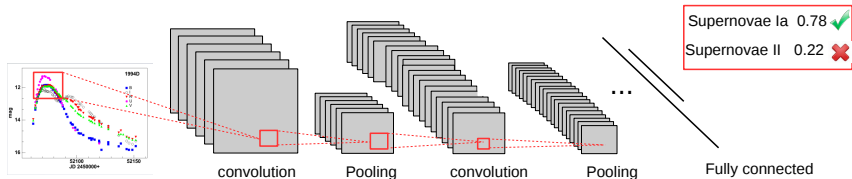
- Identify automatically the Supernovae Ia from the light curve (variation of the brightness of an object along time)



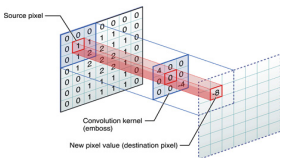
Supervised learning



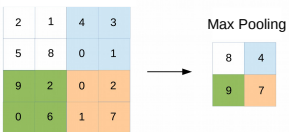
Convolutional Neural Network



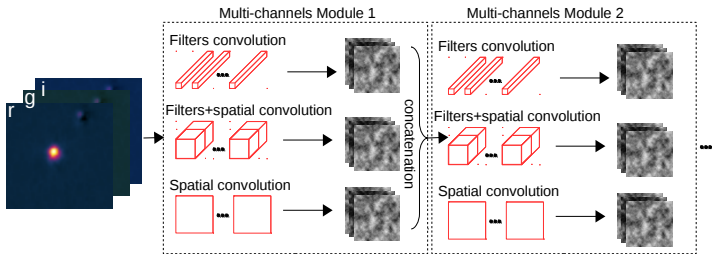
Convolution



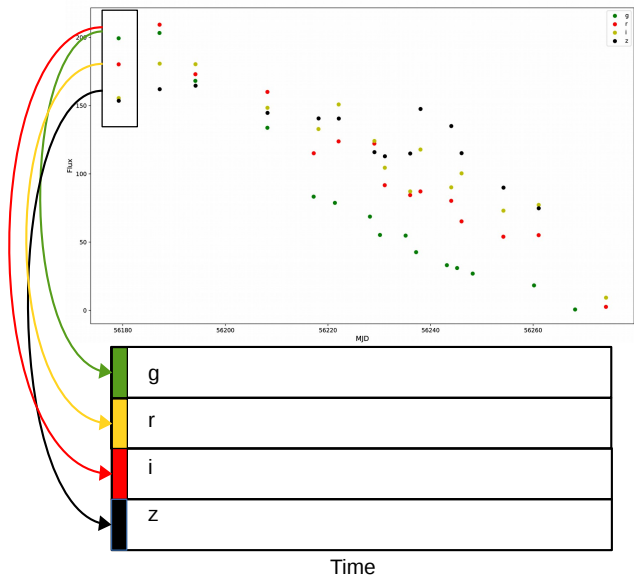
Pooling



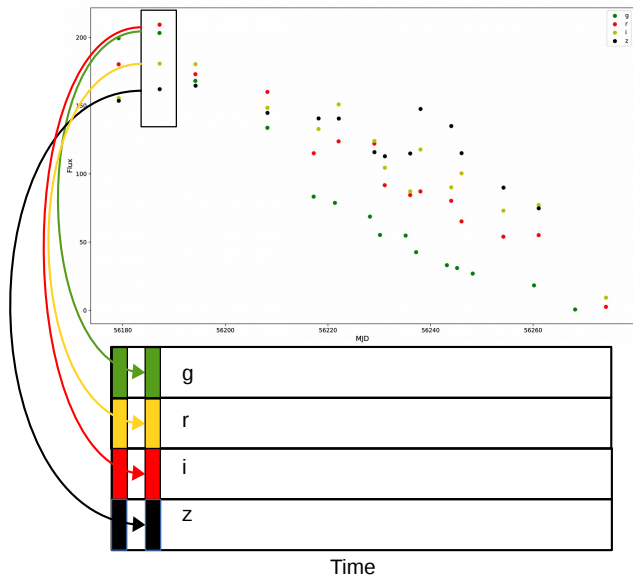
Input data : images



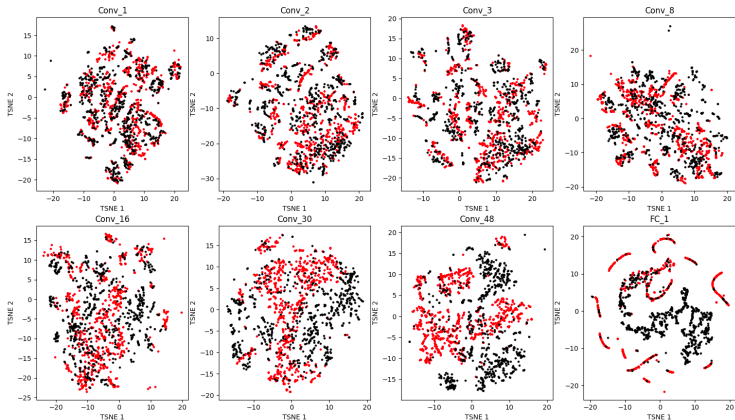
Input data : light curves images



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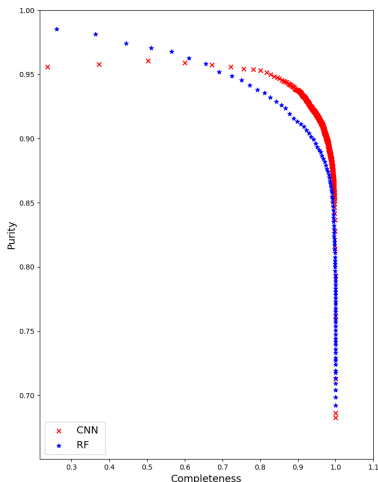


Separation of classes with a t-SNE



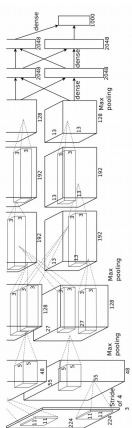
First result

- Bi-metric to evaluate the algorithm :
 - $\text{purity} = \frac{TP}{TP+FP}$
 - $\text{completeness} = \frac{TP}{TP+FN}$
- The **CNN** performance are compared to an optimized **random forest (RF)** performance with a feature extraction step

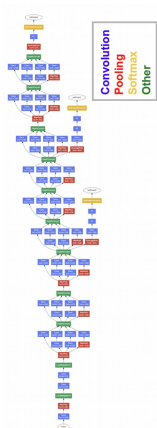


Going deeper

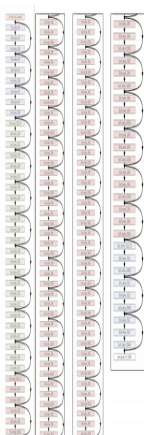
Alexnet
~60 millions



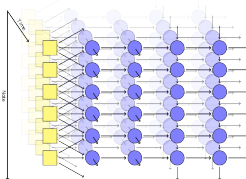
GoogLeNet
~5 millions



ResNet
~3,8 billions



LSTM / RNN



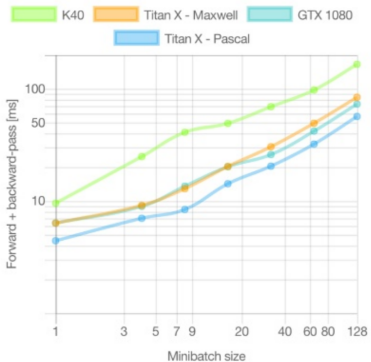
Nvidia GeForce GTX Titan X



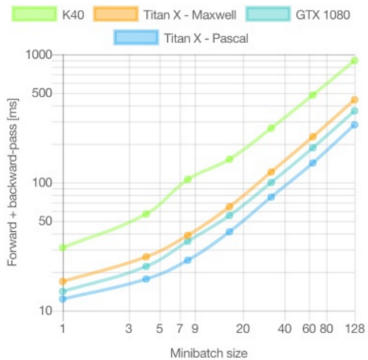
- cores : 3584
- Frequency : 1531 MHz
- VRAM : 12 GB

Benchmark

AlexNet

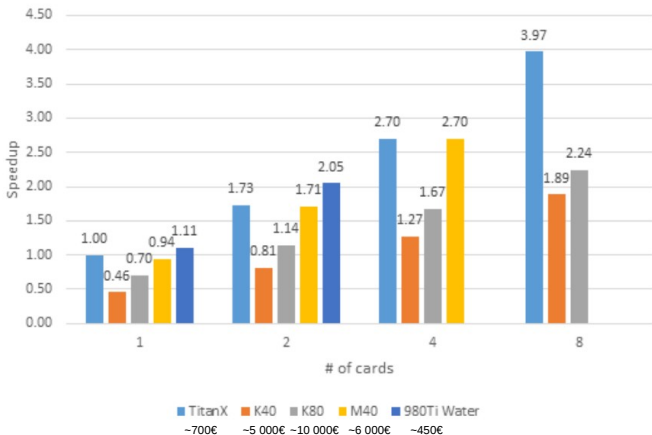


GoogleNet



Benchmark

Caffe Benchmark Test Results



Deep Learning Frameworks

Caffe



MINERVA

mxnet



MatConvNet

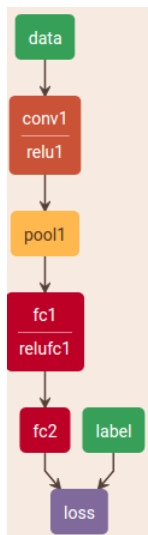
DL4J
Deeplearning4j

theano



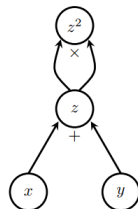
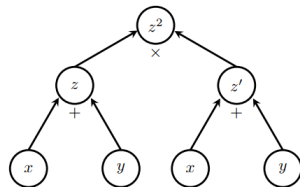
Caffe

- Caffe is a deep learning framework made with expression speed, and modularity in mind. Caffe is developed by the Berkeley Vision and Learning Center as well as community contributors and is popular for computer vision.



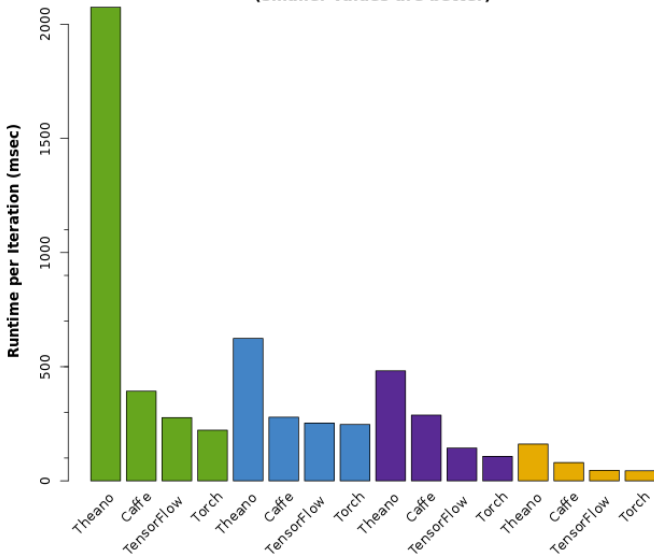
TensorFlow

- TensorFlow is a software library for numerical computation using data flow graphs, developed by Google's Machine Intelligence research organization.

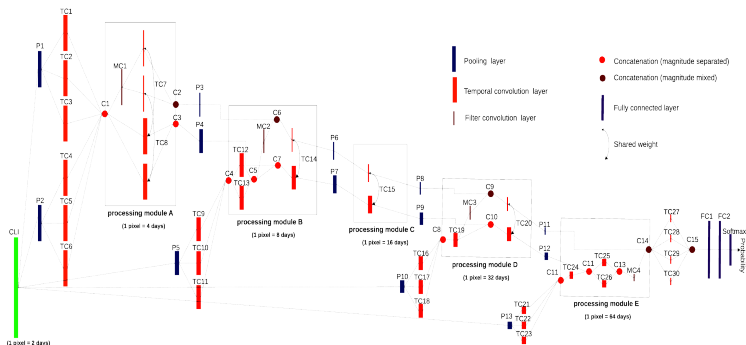


Frameworks benchmarks

Runtime per Training Iteration on the Tesla P100
(smaller values are better)



Conclusion



Titan X (maxwell) : 3 days
 GTX 1080 (Pascal) : <2,5 days
 CPU i7 6700 : 8x3.4GHz : >27 days

(estimation on 2 epochs)

- A problem ?
- The solution :

