# \$rm K\$-SVD: An Algorithm for Designing Overcomplete Dictionaries for Sparse Representation

Type Journal Article

**Author** M. Aharon

Author M. Elad

Author A. Bruckstein

URL http://ieeexplore.ieee.org/document/1710377/

Volume 54

Issue 11

Pages 4311-4322

**Publication** IEEE Transactions on Signal Processing

**ISSN** 1053-587X

**Date** 11/2006

Extra 00000

Journal Abbr IEEE Trans. Signal Process.

**DOI** 10/dx8n4f

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Library Catalog DOI.org (Crossref)

Language en

**Short Title** \$rm K\$-SVD

**Date Added** 6/21/2019, 11:46:07 AM **Modified** 6/21/2019, 11:46:11 AM

#### **Attachments**

• Aharon et al. - 2006 - \$rm K\$-SVD An Algorithm for Designing Overcomplet.pdf

# A Study on Overfitting in Deep Reinforcement Learning

Type Journal Article

Author Chiyuan Zhang

**Author** Oriol Vinyals

Author Remi Munos

Author Samy Bengio

URL http://arxiv.org/abs/1804.06893

Publication arXiv:1804.06893 [cs, stat]

**Date** 2018-04-18

**Extra** 00032 arXiv: 1804.06893

**Accessed** 6/21/2019, 12:46:15 PM

Library Catalog arXiv.org

**Abstract** Recent years have witnessed significant progresses in deep Reinforcement

Learning (RL). Empowered with large scale neural networks, carefully designed architectures, novel training algorithms and massively parallel computing devices, researchers are able to attack many challenging RL problems. However, in machine learning, more training power comes with a potential risk of more overfitting. As deep RL techniques are being applied to critical problems such as healthcare and finance, it is important to understand the generalization behaviors of the trained agents. In this paper, we conduct a systematic study of standard RL agents and find that they could overfit in various ways. Moreover, overfitting could happen "robustly": commonly used techniques in RL that add stochasticity do not necessarily prevent or detect overfitting. In particular, the same agents and learning algorithms could have drastically different test performance, even when all of them achieve optimal rewards during training. The observations call for more principled and careful evaluation protocols in RL. We conclude with a general discussion on overfitting in RL and a study of the generalization behaviors from the perspective of inductive bias.

**Date Added** 6/21/2019, 12:46:15 PM **Modified** 6/21/2019, 12:46:58 PM

#### Tags:

Computer Science - Machine Learning, Statistics - Machine Learning

#### **Attachments**

- o arXiv.org Snapshot
- Zhang et al\_2018\_A Study on Overfitting in Deep Reinforcement Learning.pdf

# A tutorial on statistically sound pattern discovery

Type Journal Article

Author Wilhelmiina Hämäläinen

Author Geoffrey I. Webb

**URL** http://link.springer.com/10.1007/s10618-018-0590-x

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**Publication** Data Mining and Knowledge Discovery

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**Date** 3/2019

Journal Abbr Data Min Knowl Disc

DOI 10/gf35nv

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Library Catalog DOI.org (Crossref)

Language en

**Abstract** Statistically sound pattern discovery harnesses the rigour of statistical hypothesis testing to overcome many of the issues that have hampered standard data mining approaches to pattern discovery. Most importantly, application of appropriate statistical tests allows precise control over the risk of false discoveries—patterns that are found in the sample data but do not hold in the wider population from which the sample was drawn. Statistical tests can also be applied to filter out patterns that are unlikely to be useful, removing uninformative variations of the key patterns in the data. This tutorial introduces the key statistical and data mining theory and techniques that underpin this fast developing field. We concentrate on two general classes of patterns: dependency rules that express statistical dependencies between condition and consequent parts and dependency sets that express mutual dependence between set elements. We clarify alternative interpretations of statistical dependence and introduce appropriate tests for evaluating statistical significance of patterns in different situations. We also introduce special techniques for controlling the likelihood of spurious discoveries when multitudes of patterns are evaluated. The paper is aimed at a wide variety of audiences. It provides the necessary statistical background and summary of the state-of-the-art for any data mining researcher or practitioner wishing to enter or understand statistically sound pattern discovery research or practice. It can serve as a general introduction to the field of statistically sound pattern discovery for any reader with a general background in data sciences.

**Date Added** 6/21/2019, 11:46:25 AM **Modified** 6/21/2019, 11:46:27 AM

#### **Attachments**

• Hämäläinen and Webb - 2019 - A tutorial on statistically sound pattern discover.pdf

# An empirical analysis of dropout in piecewise linear networks

**Type** Journal Article

**Author** David Warde-Farley

**Author** Ian J. Goodfellow

**Author** Aaron Courville

Author Yoshua Bengio

URL http://arxiv.org/abs/1312.6197

**Publication** arXiv:1312.6197 [cs, stat]

**Date** 2013-12-20

**Extra** 00053 arXiv: 1312.6197

Accessed 6/21/2019, 11:56:11 AM

Library Catalog arXiv.org

**Abstract** The recently introduced dropout training criterion for neural networks has

been the subject of much attention due to its simplicity and remarkable effectiveness as a regularizer, as well as its interpretation as a training procedure for an exponentially large ensemble of networks that share parameters. In this work we empirically investigate several questions related to the efficacy of dropout, specifically as it concerns networks employing the popular rectified linear activation function. We investigate the quality of the test time weight-scaling inference procedure by evaluating the geometric average exactly in small models, as well as compare the performance of the geometric mean to the arithmetic mean more commonly employed by ensemble techniques. We explore the effect of tied weights on the ensemble interpretation by training ensembles of masked networks without tied weights. Finally, we investigate an alternative criterion based on a biased estimator of the maximum likelihood ensemble gradient.

**Date Added** 6/21/2019, 11:56:11 AM **Modified** 6/21/2019, 11:56:43 AM

#### Tags:

◆ No DOI found, Computer Science - Neural and Evolutionary Computing, Computer Science - Machine Learning, Statistics - Machine Learning

#### **Notes:**

Comment: Extensive updates; 8 pages plus acknowledgements/references

#### An Introduction to Variational Autoencoders

Type Journal Article

Author Diederik P. Kingma

**Author** Max Welling

**URL** http://arxiv.org/abs/1906.02691

**Publication** arXiv:1906.02691 [cs, stat]

Date 2019-06-06

**Extra** 00000 arXiv: 1906.02691 **Accessed** 6/21/2019, 6:44:44 PM

Library Catalog arXiv.org

**Abstract** Variational autoencoders provide a principled framework for learning deep

latent-variable models and corresponding inference models. In this work, we provide an introduction to variational autoencoders and some important

extensions.

**Date Added** 6/21/2019, 6:44:44 PM **Modified** 6/21/2019, 6:45:13 PM

## Tags:

Computer Science - Machine Learning, Statistics - Machine Learning

## **Attachments**

- arXiv.org Snapshot
- Kingma\_Welling\_2019\_An Introduction to Variational Autoencoders.pdf

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- 1.5 Directed Graphical Models and Neural Networks
- 1.6 Learning in Fully Observed Models with Neural Nets
- 1.7 Learning and Inference in Deep Latent Variable Models
- 1.8 Intractabilities

#### 2 Variational Autoencoders

- 2.1 Encoder or Approximate Posterior
- 2.2 Evidence Lower Bound (ELBO)
- 2.3 Stochastic Gradient-Based Optimization of the ELBO
- 2.4 Reparameterization Trick
- 2.5 Factorized Gaussian posteriors
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- 2.7 Marginal Likelihood and ELBO as KL Divergences
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- 2.9 Related prior and concurrent work

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- 3.4 Inverse Autoregressive Flow (IAF)
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- 4.2 Alternative methods for increasing expressivity of generative models
- 4.3 Autoregressive Models
- 4.4 Invertible transformations with tractable Jacobian determinant
- 4.5 Follow-Up Work
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  - 6.2 Alternative methods for learning in DLVMs
  - 6.3 Stochastic Gradient Descent

References

## Attention Is All You Need

7 of 53

Type Journal Article

Author Ashish Vaswani

Author Noam Shazeer

Author Niki Parmar

Author Jakob Uszkoreit

**Author** Llion Jones

Author Aidan N. Gomez

**Author** Lukasz Kaiser

Author Illia Polosukhin

URL http://arxiv.org/abs/1706.03762

**Publication** arXiv:1706.03762 [cs]

**Date** 2017-06-12

**Extra** 02136 arXiv: 1706.03762

Accessed 6/21/2019, 5:04:35 PM

Library Catalog arXiv.org

**Abstract** The dominant sequence transduction models are based on complex recurrent

or convolutional neural networks in an encoder-decoder configuration. The best performing models also connect the encoder and decoder through an attention mechanism. We propose a new simple network architecture, the Transformer, based solely on attention mechanisms, dispensing with recurrence and convolutions entirely. Experiments on two machine translation tasks show these models to be superior in quality while being more parallelizable and requiring significantly less time to train. Our model achieves 28.4 BLEU on the WMT 2014 English-to-German translation task, improving over the existing best results, including ensembles by over 2 BLEU. On the WMT 2014 English-to-French translation task, our model establishes a new single-model state-of-the-art BLEU score of 41.8 after training for 3.5 days on eight GPUs, a small fraction of the training costs of the best models from the literature. We show that the Transformer generalizes well to other tasks by applying it successfully to English constituency parsing both with large and limited training data.

**Date Added** 6/21/2019, 5:04:35 PM

**Modified** 6/21/2019, 5:05:45 PM

#### Tags:

Computer Science - Computation and Language, Computer Science - Machine Learning

#### **Notes:**

Comment: 15 pages, 5 figures

#### **Attachments**

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- o arXiv.org Snapshot
- Vaswani et al\_2017\_Attention Is All You Need.pdf

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  - 3.3 Position-wise Feed-Forward Networks
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  - 5.4 Regularization
- 6 Results
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  - 6.2 Model Variations
  - 6.3 English Constituency Parsing
- 7 Conclusion

#### **Attentive Neural Processes**

Type Journal Article

Author Hyunjik Kim

Author Andriy Mnih

**Author** Jonathan Schwarz

Author Marta Garnelo

Author Ali Eslami

Author Dan Rosenbaum

**Author** Oriol Vinyals

Author Yee Whye Teh

URL http://arxiv.org/abs/1901.05761

9 of 53

**Publication** arXiv:1901.05761 [cs, stat]

**Date** 2019-01-17

**Extra** 00007 arXiv: 1901.05761 **Accessed** 6/21/2019, 12:45:52 PM

Library Catalog arXiv.org

Abstract Neural Processes (NPs) (Garnelo et al 2018a;b) approach regression by

learning to map a context set of observed input-output pairs to a distribution over regression functions. Each function models the distribution of the output given an input, conditioned on the context. NPs have the benefit of fitting observed data efficiently with linear complexity in the number of context input-output pairs, and can learn a wide family of conditional distributions; they learn predictive distributions conditioned on context sets of arbitrary size. Nonetheless, we show that NPs suffer a fundamental drawback of underfitting, giving inaccurate predictions at the inputs of the observed data they condition on. We address this issue by incorporating attention into NPs, allowing each input location to attend to the relevant context points for the prediction. We show that this greatly improves the accuracy of predictions, results in noticeably faster training, and expands the range of functions that can be modelled.

**Date Added** 6/21/2019, 12:45:52 PM **Modified** 6/21/2019, 12:46:44 PM

#### Tags:

Computer Science - Machine Learning, Statistics - Machine Learning

#### **Attachments**

- arXiv.org Snapshot
- Kim et al 2019 Attentive Neural Processes.pdf

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  - 2.1 Neural Processes
  - 2.2 Attention
- 3 Attentive Neural Processes
- 4 Experimental Results
- 5 Related Work
- 6 Conclusion and Discussion
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- B Experimental details of 1D function regression experiment
- C Additional figures for 1D regression on GP data
- D Experimental details of 2D Image regression experiment
- E Additional figures for 2D Image regression on MNIST and CelebA

## **Auto-Encoding Variational Bayes**

Type Journal Article

Author Diederik P. Kingma

**Author** Max Welling

URL http://arxiv.org/abs/1312.6114

**Publication** arXiv:1312.6114 [cs, stat]

**Date** 2013-12-20

Extra 05075 arXiv: 1312.6114 Accessed 6/21/2019, 5:57:38 PM

Library Catalog arXiv.org

**Abstract** How can we perform efficient inference and learning in directed probabilistic models, in the presence of continuous latent variables with intractable posterior distributions, and large datasets? We introduce a stochastic variational inference and learning algorithm that scales to large datasets and, under some mild differentiability conditions, even works in the intractable case. Our contributions is two-fold. First, we show that a reparameterization of the variational lower bound yields a lower bound estimator that can be straightforwardly optimized using standard stochastic gradient methods. Second, we show that for i.i.d. datasets with continuous latent variables per datapoint, posterior inference can be made especially efficient by fitting an approximate inference model (also called a recognition model) to the intractable posterior using the proposed lower bound estimator. Theoretical advantages are reflected in experimental results.

**Date Added** 6/21/2019, 5:57:38 PM **Modified** 6/21/2019, 5:59:07 PM

#### Tags:

Computer Science - Machine Learning, Statistics - Machine Learning

#### **Attachments**

- arXiv.org Snapshot
- Kingma\_Welling\_2013\_Auto-Encoding Variational Bayes.pdf

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  - 2.3 The SGVB estimator and AEVB algorithm
  - 2.4 The reparameterization trick
- 3 Example: Variational Auto-Encoder
- 4 Related work
- 5 Experiments
- 6 Conclusion
- 7 Future work
- **A Visualisations**
- B Solution of DKL(qbold0mu mumu 2005/06/28 ver: 1.3 subfig package(z) || pbold0mu mumu 2005/06/28 ver: 1.3 subfig package(z)), Gaussian case
- C MLP's as probabilistic encoders and decoders
  - C.1 Bernoulli MLP as decoder
  - C.2 Gaussian MLP as encoder or decoder
- D Marginal likelihood estimator
- E Monte Carlo EM
- F Full VB
  - F.1 Example

# Batch Normalization: Accelerating Deep Network Training by Reducing Internal Covariate Shift

**Type** Journal Article **Author** Sergey Ioffe

**Author** Christian Szegedy

Pages 9

Library Catalog Zotero

Language en

**Abstract** Training Deep Neural Networks is complicated by the fact that the

distribution of each layer's inputs changes during training, as the parameters of the previous layers change. This slows down the training by requiring lower learning rates and careful parameter initialization, and makes it notoriously hard to train models with saturating nonlinearities. We refer to this phenomenon as internal covariate shift, and address the problem by normalizing layer inputs. Our method draws its strength from making normalization a part of the model architecture and performing the normalization for each training mini-batch. Batch Normalization allows us to use much higher learning rates and be less careful about initialization, and in some cases eliminates the need for Dropout. Applied to a stateof-the-art image classification model, Batch Normalization achieves the same accuracy with 14 times fewer training steps, and beats the original model by a significant margin. Using an ensemble of batch-normalized networks, we improve upon the best published result on ImageNet classification: reaching 4.82% top-5 test error, exceeding the accuracy of human raters.

**Date Added** 6/21/2019, 11:31:58 AM **Modified** 6/21/2019, 11:32:02 AM

#### Tags:

♠ No DOI found

#### **Attachments**

• Ioffe and Szegedy - Batch Normalization Accelerating Deep Network Tra.pdf

### Convolutional Neural Networks for Sentence Classification

**Type** Journal Article

Author Yoon Kim

URL http://arxiv.org/abs/1408.5882

**Publication** arXiv:1408.5882 [cs]

**Date** 2014-08-25

**Extra** 04407 arXiv: 1408.5882 **Accessed** 6/21/2019, 11:30:28 AM

Library Catalog arXiv.org

Language en

**Abstract** We report on a series of experiments with convolutional neural networks

(CNN) trained on top of pre-trained word vectors for sentence-level

classification tasks. We show that a simple CNN with little hyperparameter tuning and static vectors achieves excellent results on multiple benchmarks. Learning task-specific vectors through fine-tuning offers further gains in performance. We additionally propose a simple modification to the architecture to allow for the use of both task-specific and static vectors. The CNN models discussed herein improve upon the state of the art on 4 out of 7 tasks, which include sentiment analysis and question classification.

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#### Tags:

◆ No DOI found, Computer Science - Computation and Language, Computer Science - Neural and Evolutionary Computing

#### **Notes:**

Comment: To appear in EMNLP 2014

#### **Attachments**

• Kim - 2014 - Convolutional Neural Networks for Sentence Classif.pdf

# Convolutional Sequence to Sequence Learning

Type Journal Article

**Author** Jonas Gehring

Author Michael Auli

Author David Grangier

Author Denis Yarats

Author Yann N. Dauphin

URL http://arxiv.org/abs/1705.03122

**Publication** arXiv:1705.03122 [cs]

**Date** 2017-05-08

**Extra** 00688 arXiv: 1705.03122

**Accessed** 6/21/2019, 5:04:24 PM

Library Catalog arXiv.org

**Abstract** The prevalent approach to sequence to sequence learning maps an input

sequence to a variable length output sequence via recurrent neural networks.

We introduce an architecture based entirely on convolutional neural networks. Compared to recurrent models, computations over all elements can be fully parallelized during training and optimization is easier since the number of non-linearities is fixed and independent of the input length. Our

use of gated linear units eases gradient propagation and we equip each decoder layer with a separate attention module. We outperform the accuracy of the deep LSTM setup of Wu et al. (2016) on both WMT'14 English-German and WMT'14 English-French translation at an order of magnitude faster speed, both on GPU and CPU.

**Date Added** 6/21/2019, 5:04:24 PM **Modified** 6/21/2019, 5:04:39 PM

#### Tags:

Computer Science - Computation and Language

#### **Attachments**

- arXiv.org Snapshot
- Gehring et al\_2017\_Convolutional Sequence to Sequence Learning.pdf

## Deep learning

Type Journal Article

Author Yann LeCun

Author Yoshua Bengio

**Author** Geoffrey Hinton

URL http://www.nature.com/articles/nature14539

Volume 521

**Issue** 7553

Pages 436-444

**Publication** Nature

ISSN 0028-0836, 1476-4687

**Date** 5/2015

**Extra** 15695

Journal Abbr Nature

DOI 10/bmqp

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Library Catalog DOI.org (Crossref)

Language en

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**Modified** 6/21/2019, 11:43:58 AM

#### **Attachments**

• LeCun et al. - 2015 - Deep learning.pdf

# Design challenges and misconceptions in named entity recognition

Type Conference Paper

Author Lev Ratinov

Author Dan Roth

URL http://portal.acm.org/citation.cfm?doid=1596374.1596399

Place Boulder, Colorado

Publisher Association for Computational Linguistics

Pages 147

**ISBN** 978-1-932432-29-9

**Date** 2009

DOI 10/dkk8vf

Accessed 6/21/2019, 1:35:08 PM

Library Catalog DOI.org (Crossref)

Conference Name the Thirteenth Conference

Language en

Abstract We analyze some of the fundamental design challenges and

misconceptions that underlie the development of an efficient and robust NER system. In particular, we address issues such as the representation of

text chunks, the inference approach needed to combine local NER

decisions, the sources of prior knowledge and how to use them within an NER system. In the process of comparing several solutions to these challenges we reach some surprising conclusions, as well as develop an

NER system that achieves 90.8 F1 score on the CoNLL-2003 NER shared

task, the best reported result for this dataset.

Proceedings Title Proceedings of the Thirteenth Conference on Computational Natural

Language Learning - CoNLL '09

**Date Added** 6/21/2019, 1:35:08 PM **Modified** 6/21/2019, 1:35:12 PM

#### **Attachments**

• Ratinov and Roth - 2009 - Design challenges and misconceptions in named enti.pdf

# Dropout: A Simple Way to Prevent Neural Networks from Overfitting

Type Journal Article

**Author** Nitish Srivastava

Author Geoffrey Hinton

**Author** Alex Krizhevsky

**Author** Ilya Sutskever

**Author** Ruslan Salakhutdinov

Pages 30

Extra 12530

Library Catalog Zotero

Language en

**Abstract** Deep neural nets with a large number of parameters are very powerful machine learning systems. However, overfitting is a serious problem in such networks. Large networks are also slow to use, making it difficult to deal with overfitting by combining the predictions of many different large neural nets at test time. Dropout is a technique for addressing this problem. The key idea is to randomly drop units (along with their connections) from the neural network during training. This prevents units from co-adapting too much. During training, dropout samples from an exponential number of different "thinned" networks. At test time, it is easy to approximate the effect of averaging the predictions of all these thinned networks by simply using a single unthinned network that has smaller weights. This significantly reduces overfitting and gives major improvements over other regularization methods. We show that dropout improves the performance of neural networks on supervised learning tasks in vision, speech recognition, document classification and computational biology, obtaining stateof-the-art results on many benchmark data sets.

**Date Added** 6/21/2019, 11:44:59 AM **Modified** 6/21/2019, 11:45:03 AM

#### Tags:

● No DOI found

#### **Attachments**

• Srivastava et al. - Dropout A Simple Way to Prevent Neural Networks f.pdf

# Efficient Object Localization Using Convolutional Networks

Type Journal Article

**Author** Jonathan Tompson

**Author** Ross Goroshin

Author Arjun Jain

Author Yann LeCun

**Author** Christopher Bregler

URL http://arxiv.org/abs/1411.4280

**Publication** arXiv:1411.4280 [cs]

**Date** 2014-11-16

Extra 00392 arXiv: 1411.4280 Accessed 6/21/2019, 11:32:25 AM

Library Catalog arXiv.org

Language en

**Abstract** Recent state-of-the-art performance on human-body pose estimation has

been achieved with Deep Convolutional Networks (ConvNets). Traditional ConvNet architectures include pooling and sub-sampling layers which reduce computational requirements, introduce invariance and prevent over-training. These benefits of pooling come at the cost of reduced localization accuracy. We introduce a novel architecture which includes an efficient 'position refinement' model that is trained to estimate the joint offset location within a small region of the image. This refinement model is jointly trained in cascade with a state-of-the-art ConvNet model [21] to achieve improved accuracy in human joint location estimation. We show that the variance of our detector approaches the variance of human annotations on the FLIC [20] dataset and outperforms all existing approaches on the MPII-human-pose dataset [1].

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#### Tags:

◆ No DOI found, Computer Science - Computer Vision and Pattern Recognition

#### **Notes:**

Comment: 8 pages with 1 page of citations

#### **Attachments**

• Tompson et al. - 2014 - Efficient Object Localization Using Convolutional .pdf

# Explaining Landscape Connectivity of Low-cost Solutions for Multilayer Nets

**Type** Journal Article

Author Rohith Kuditipudi

Author Xiang Wang

Author Holden Lee

Author Yi Zhang

Author Zhiyuan Li

Author Wei Hu

Author Sanjeev Arora

Author Rong Ge

URL http://arxiv.org/abs/1906.06247

**Publication** arXiv:1906.06247 [cs, stat]

**Date** 2019-06-14

**Extra** 00000 arXiv: 1906.06247 **Accessed** 6/21/2019, 5:06:10 PM

Library Catalog arXiv.org

Abstract Mode connectivity is a surprising phenomenon in the loss landscape of deep

nets. Optima---at least those discovered by gradient-based

optimization---turn out to be connected by simple paths on which the loss function is almost constant. Often, these paths can be chosen to be piece-wise linear, with as few as two segments. We give mathematical

explanations for this phenomenon, assuming generic properties (such as dropout stability and noise stability) of well-trained deep nets, which have previously been identified as part of understanding the generalization properties of deep nets. Our explanation holds for realistic multilayer nets,

and experiments are presented to verify the theory.

**Date Added** 6/21/2019, 5:06:10 PM **Modified** 6/21/2019, 5:06:30 PM

#### Tags:

Computer Science - Machine Learning, Statistics - Machine Learning

#### **Attachments**

- arXiv.org Snapshot
- Kuditipudi et al 2019 Explaining Landscape Connectivity of Low-cost Solutions for Multilayer Nets.pdf

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    - D.2.2 Interlayer cushion
    - D.2.3 Activation contraction
    - D.2.4 Interlayer smoothness

E Tools

# Expressiveness of Rectifier Networks

Type Journal Article

Author Xingyuan Pan

**Author** Vivek Srikumar

Pages 9

**Extra** 00022

Library Catalog Zotero

Language en

**Abstract** Rectified Linear Units (ReLUs) have been shown to ameliorate the vanishing gradient problem, allow for efficient backpropagation, and empirically promote sparsity in the learned parameters. They have led to state-of-the-art results in a variety of applications. However, unlike threshold and sigmoid networks, ReLU networks are less explored from the perspective of their

expressiveness. This paper studies the expressiveness of ReLU networks. We characterize the decision boundary of two-layer ReLU networks by constructing functionally equivalent threshold networks. We show that while the decision boundary of a two-layer ReLU network can be captured by a threshold network, the latter may require an exponentially larger number of hidden units. We also formulate sufficient conditions for a corresponding logarithmic reduction in the number of hidden units to represent a sign network as a ReLU network. Finally, we experimentally compare threshold networks and their much smaller ReLU counterparts with respect to their ability to learn from synthetically generated data.

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#### Tags:

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#### **Attachments**

• Pan and Srikumar - Expressiveness of Rectifier Networks.pdf

#### FCNN: Fourier Convolutional Neural Networks

Type Book Section

Editor Michelangelo Ceci

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Editor Ljupčo Todorovski

**Editor** Celine Vens

Editor Sašo Džeroski

**Author** Harry Pratt

**Author** Bryan Williams

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Library Catalog DOI.org (Crossref)

Language en

**Abstract** The Fourier domain is used in computer vision and machine learning as image analysis tasks in the Fourier domain are analogous to spatial domain methods but are achieved using different operations. Convolutional Neural Networks (CNNs) use machine learning to achieve state-of-the-art results with respect to many computer vision tasks. One of the main limiting aspects of CNNs is the computational cost of updating a large number of convolution parameters. Further, in the spatial domain, larger images take exponentially longer than smaller image to train on CNNs due to the operations involved in convolution methods. Consequently, CNNs are often not a viable solution for large image computer vision tasks. In this paper a Fourier Convolution Neural Network (FCNN) is proposed whereby training is conducted entirely within the Fourier domain. The advantage offered is that there is a significant speed up in training time without loss of effectiveness. Using the proposed approach larger images can therefore be processed within viable computation time. The FCNN is fully described and evaluated. The evaluation was conducted using the benchmark Cifar10 and MNIST datasets, and a bespoke fundus retina image dataset. The results demonstrate that convolution in the Fourier domain gives a significant speed up without adversely affecting accuracy. For simplicity the proposed FCNN concept is presented in the context of a basic CNN architecture, however, the FCNN concept has the potential to improve the speed of any neural network system involving convolution.

**Book Title** Machine Learning and Knowledge Discovery in Databases

**Short Title FCNN** 

**Date Added** 6/21/2019, 11:33:35 AM **Modified** 6/21/2019, 11:33:35 AM

#### **Attachments**

• Pratt et al. - 2017 - FCNN Fourier Convolutional Neural Networks.pdf

# Forgetting Memories and Their Attractiveness

**Type** Journal Article

Author Enzo Marinari

URL https://www.mitpressjournals.org/doi/10.1162/neco\_a\_01162

Volume 31

**Issue** 3

Pages 503-516

**Publication** Neural Computation

**ISSN** 0899-7667, 1530-888X

**Date** 03/2019

**Extra** 00001

Journal Abbr Neural Computation

**DOI** 10/gf35pq

**Accessed** 6/21/2019, 12:55:50 PM

Library Catalog DOI.org (Crossref)

Language en

**Abstract** We study numerically the memory that forgets, introduced in 1986 by Parisi

by bounding the synaptic strength, with a mechanism that avoids confusion;

allows remembering the pattern learned more recently; and has a

physiologically very well-defined meaning. We analyze a number of features of this learning for a finite number of neurons and finite number of patterns. We discuss how the system behaves in the large but finite [Formula: see text] limit. We analyze the basin of attraction of the patterns that have been

learned, and we show that it is exponentially small in the age of the pattern.

**Date Added** 6/21/2019, 12:55:50 PM

Modified 6/21/2019, 12:55:52 PM

#### **Attachments**

• Marinari - 2019 - Forgetting Memories and Their Attractiveness.pdf

## Generative Adversarial Networks

Type Journal Article

**Author** Ian J. Goodfellow

Author Jean Pouget-Abadie

Author Mehdi Mirza

Author Bing Xu

**Author** David Warde-Farley

**Author** Sherjil Ozair

**Author** Aaron Courville

Author Yoshua Bengio

URL https://arxiv.org/abs/1406.2661v1

**Date** 2014/06/10

Extra 00485

Accessed 6/21/2019, 11:55:55 AM

Library Catalog arxiv.org

Language en

.................

**Abstract** We propose a new framework for estimating generative models via an adversarial process, in which we simultaneously train two models: a generative model G that captures the data distribution, and a discriminative model D that estimates the probability that a sample came from the training data rather than G. The training procedure for G is to maximize the

probability of D making a mistake. This framework corresponds to a minimax two-player game. In the space of arbitrary functions G and D, a

unique solution exists, with G recovering the training data distribution and D equal to 1/2 everywhere. In the case where G and D are defined by multilayer perceptrons, the entire system can be trained with backpropagation. There is no need for any Markov chains or unrolled approximate inference networks during either training or generation of samples. Experiments demonstrate the potential of the framework through qualitative and quantitative evaluation of the generated samples.

**Date Added** 6/21/2019, 11:55:55 AM **Modified** 6/21/2019, 12:05:26 PM

#### **Attachments**

• Goodfellow et al\_2014\_Generative Adversarial Networks.pdf

Snapshot

## Glove: Global Vectors for Word Representation

Type Conference Paper

**Author** Jeffrey Pennington

Author Richard Socher

**Author** Christopher Manning

URL http://aclweb.org/anthology/D14-1162

Place Doha, Qatar

**Publisher** Association for Computational Linguistics

Pages 1532-1543

**Date** 2014

Extra 08011

**DOI** 10/gfshwg

Accessed 6/21/2019, 11:34:26 AM

Library Catalog DOI.org (Crossref)

Conference Name Proceedings of the 2014 Conference on Empirical Methods in Natural

Language Processing (EMNLP)

Language en

Abstract Recent methods for learning vector space representations of words have

succeeded in capturing fine-grained semantic and syntactic regularities using vector arithmetic, but the origin of these regularities has remained opaque. We analyze and make explicit the model properties needed for such regularities to emerge in word vectors. The result is a new global logbilinear regression model that combines the advantages of the two major model families in the literature: global matrix factorization and local context window methods. Our model efficiently leverages statistical information by training only on the nonzero elements in a word-word cooccurrence matrix, rather than on the entire sparse matrix or on individual context windows in a large corpus. The model produces a vector

space with meaningful substructure, as evidenced by its performance of 75% on a recent word analogy task. It also outperforms related models on

similarity tasks and named entity recognition.

Proceedings Title Proceedings of the 2014 Conference on Empirical Methods in Natural

Language Processing (EMNLP)

Short Title Glove

**Date Added** 6/21/2019, 11:34:26 AM **Modified** 6/21/2019, 11:34:29 AM

#### **Attachments**

• Pennington et al. - 2014 - Glove Global Vectors for Word Representation.pdf

# Google's Neural Machine Translation System: Bridging the Gap between Human and Machine Translation

Type Journal Article

Author Yonghui Wu

**Author** Mike Schuster

Author Zhifeng Chen

Author Quoc V. Le

Author Mohammad Norouzi

**Author** Wolfgang Macherey

Author Maxim Krikun

Author Yuan Cao

Author Qin Gao

**Author** Klaus Macherey

**Author** Jeff Klingner

Author Apurva Shah

Author Melvin Johnson

Author Xiaobing Liu

Author Łukasz Kaiser

**Author** Stephan Gouws

**Author** Yoshikiyo Kato

Author Taku Kudo

Author Hideto Kazawa

Author Keith Stevens

Author George Kurian

**Author** Nishant Patil

**Author** Wei Wang

Author Cliff Young

Author Jason Smith

Author Jason Riesa

**Author** Alex Rudnick

**Author** Oriol Vinyals

Author Greg Corrado

Author Macduff Hughes

Author Jeffrey Dean

URL http://arxiv.org/abs/1609.08144

**Publication** arXiv:1609.08144 [cs]

**Date** 2016-09-26

**Extra** 01464 arXiv: 1609.08144

Accessed 6/21/2019, 5:03:58 PM

Library Catalog arXiv.org

**Abstract** Neural Machine Translation (NMT) is an end-to-end learning approach for automated translation, with the potential to overcome many of the weaknesses of conventional phrase-based translation systems. Unfortunately, NMT systems are known to be computationally expensive both in training and in translation inference. Also, most NMT systems have difficulty with rare words. These issues have hindered NMT's use in practical deployments and services, where both accuracy and speed are essential. In this work, we present GNMT, Google's Neural Machine Translation system, which attempts to address many of these issues. Our model consists of a deep LSTM network with 8 encoder and 8 decoder layers using attention and residual connections. To improve parallelism and therefore decrease training time, our attention mechanism connects the bottom layer of the decoder to the top layer of the encoder. To accelerate the final translation speed, we employ low-precision arithmetic during inference computations. To improve handling of rare words, we divide words into a limited set of common sub-word units ("wordpieces") for both input and output. This method provides a good balance between the flexibility of "character"-delimited models and the efficiency of "word"-delimited models, naturally handles translation of rare words, and ultimately improves the overall accuracy of the system. Our beam search technique employs a length-normalization procedure and uses a coverage penalty, which encourages generation of an output sentence that is most likely to cover all the words in the source sentence. On the WMT'14 English-to-French and English-to-German benchmarks, GNMT achieves competitive results to state-of-the-art. Using a human side-by-side evaluation on a set of isolated simple sentences, it reduces translation errors by an average of 60% compared to Google's phrase-based production system.

**Short Title** Google's Neural Machine Translation System

**Date Added** 6/21/2019, 5:03:58 PM **Modified** 6/21/2019, 5:04:17 PM

Tags:

Computer Science - Computation and Language, Computer Science - Machine Learning,

Computer Science - Artificial Intelligence

#### **Attachments**

- arXiv.org Snapshot
- Wu et al\_2016\_Google's Neural Machine Translation System.pdf

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  - 3.2 Bi-directional Encoder for First Layer
  - 3.3 Model Parallelism
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  - 4.1 Wordpiece Model
  - 4.2 Mixed Word/Character Model
- 5 Training Criteria
- 6 Quantizable Model and Quantized Inference
- 7 Decoder
- 8 Experiments and Results
  - 8.1 Datasets
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  - 8.3 Training Procedure
  - 8.4 Evaluation after Maximum Likelihood Training
  - 8.5 Evaluation of RL-refined Models
  - 8.6 Model Ensemble and Human Evaluation
  - 8.7 Results on Production Data
- 9 Conclusion

# Graphical Models, Exponential Families, and Variational Inference

Type Journal Article

Author Martin J. Wainwright

Author Michael I. Jordan

URL http://www.nowpublishers.com/article/Details/MAL-001

Volume 1

Issue 1–2

Pages 1-305

Publication Foundations and Trends® in Machine Learning

**ISSN** 1935-8237, 1935-8245

**Date** 2007

**Extra** 03181

Journal Abbr FNT in Machine Learning

**DOI** 10/bpnwrm

**Accessed** 6/21/2019, 6:23:56 PM

Library Catalog DOI.org (Crossref)

Language en

**Date Added** 6/21/2019, 6:23:56 PM **Modified** 6/21/2019, 6:23:58 PM

#### **Attachments**

• Wainwright and Jordan - 2007 - Graphical Models, Exponential Families, and Variat.pdf

## Introduction to Information Retrieval

Type Journal Article

**Author** Christopher Manning

Author Prabhakar Raghavan

Author Hinrich Schuetze

Pages 581

**Date** 2009

**Extra** 16180

Library Catalog Zotero

Language en

**Date Added** 6/21/2019, 2:01:47 PM

**Modified** 6/21/2019, 2:01:50 PM

#### Tags:

● No DOI found

## **Attachments**

• Manning et al. - 2009 - Introduction to Information Retrieval.pdf

# lecun-89.pdf

Type Attachment

**Date Added** 6/21/2019, 11:45:20 AM **Modified** 6/21/2019, 11:45:20 AM

## Long Short-Term Memory

Type Journal Article

**Author** Sepp Hochreiter

Author Schmidhuber, Jurgen

Volume 9

Pages 1735-1780

**Publication** Neural Computation

Extra 19087

DOI 10/bxd65w

**Date Added** 6/21/2019, 12:51:09 PM **Modified** 6/21/2019, 12:53:23 PM

#### **Attachments**

• Hochreiter and Schmidhuber, Jurgen - Long Short-Term Memory.pdf

#### Maxout Networks

**Type** Journal Article

**Author** Ian J. Goodfellow

Author David Warde-Farley

Author Mehdi Mirza

**Author** Aaron Courville

Author Yoshua Bengio

URL http://arxiv.org/abs/1302.4389

**Publication** arXiv:1302.4389 [cs, stat]

**Date** 2013-02-18

**Extra** 01610 arXiv: 1302.4389

Accessed 6/21/2019, 11:53:02 AM

Library Catalog arXiv.org

**Abstract** We consider the problem of designing models to leverage a recently

introduced approximate model averaging technique called dropout. We define a simple new model called maxout (so named because its output is the max of a set of inputs, and because it is a natural companion to dropout) designed to both facilitate optimization by dropout and improve the accuracy of dropout's fast approximate model averaging technique. We empirically verify that the model successfully accomplishes both of these

tasks. We use maxout and dropout to demonstrate state of the art classification performance on four benchmark datasets: MNIST, CIFAR-10, CIFAR-100, and SVHN.

**Date Added** 6/21/2019, 11:53:02 AM **Modified** 6/21/2019, 11:54:10 AM

#### Tags:

Computer Science - Machine Learning, Statistics - Machine Learning

#### **Notes:**

Comment: This is the version of the paper that appears in ICML 2013

#### **Attachments**

• Goodfellow et al\_2013\_Maxout Networks.pdf

# Neocognitron: A hierarchical neural network capable of visual pattern recognition

Type Journal Article

Author Kunihiko Fukushima

URL https://linkinghub.elsevier.com/retrieve/pii/0893608088900147

Volume 1

Issue 2

Pages 119-130

**Publication** Neural Networks

ISSN 08936080

**Date** 1/1988

Extra 00924

Journal Abbr Neural Networks

**DOI** 10/bw8fwp

Accessed 6/21/2019, 11:33:40 AM

Library Catalog DOI.org (Crossref)

Language en

Abstract A neural network model for visual pattern recognition, called the

"neocognitron, "' was previously proposed by the author In this paper, we discuss the mechanism of the model in detail. In order to demonstrate the ability of the neocognitron, we also discuss a pattern-recognition system

which works with the mechanism of the neocognitron.

Short Title Neocognitron

**Date Added** 6/21/2019, 11:33:40 AM **Modified** 6/21/2019, 11:33:42 AM

#### **Attachments**

• Fukushima - 1988 - Neocognitron A hierarchical neural network capabl.pdf

Neocognitron: A self-organizing neural network model for a mechanism of pattern recognition unaffected by shift in position

Type Journal Article

Author Kunihiko Fukushima

URL http://link.springer.com/10.1007/BF00344251

Volume 36

Issue 4

Pages 193-202

**Publication** Biological Cybernetics

ISSN 0340-1200, 1432-0770

**Date** 4/1980

**Extra** 03322

Journal Abbr Biol. Cybernetics

**DOI** 10/fhrjjv

Accessed 6/21/2019, 11:33:47 AM

**Library Catalog** DOI.org (Crossref)

Language en

**Abstract** A neural network model for a mechanism of visual pattern recognition is proposed in this paper. The network is self-organized by "learning without a teacher", and acquires an ability to recognize stimulus patterns based on the geometrical similarity (Gestalt) of their shapes without affected by their positions. This network is given a nickname "neocognitron". After completion of self-organization, the network has a structure similar to the hierarchy model of the visual nervous system proposed by Hubel and Wiesel. The network consists of an input layer (photoreceptor array) followed by a cascade connection of a number of modular structures, each of which is composed of two layers of cells connected in a cascade. The first layer of each module consists of "S-cells', which show characteristics similar to simple cells or lower order hypercomplex cells, and the second layer consists of "C-cells" similar to complex cells or higher order hypercomplex cells. The afferent synapses to each S-cell have plasticity and are modifiable. The network has an ability of unsupervised learning: We do not need any "teacher" during the process of selforganization, and it is only needed to present a set of stimulus patterns repeatedly to the input layer of the network. The network has been simulated on a digital computer. After repetitive presentation of a set of stimulus patterns, each stimulus pattern

has become to elicit an output only from one of the C-cells of the last layer, and conversely, this C-cell has become selectively responsive only to that stimulus pattern. That is, none of the C-cells of the last layer responds to more than one stimulus pattern. The response of the C-cells of the last layer is not affected by the pattern's position at all. Neither is it affected by a small change in shape nor in size of the stimulus pattern.

Short Title Neocognitron

**Date Added** 6/21/2019, 11:33:47 AM **Modified** 6/21/2019, 11:33:48 AM

#### **Attachments**

• Fukushima - 1980 - Neocognitron A self-organizing neural network mod.pdf

# Neural Machine Translation by Jointly Learning to Align and Translate

Type Journal Article

Author Dzmitry Bahdanau

Author Kyunghyun Cho

Author Yoshua Bengio

URL http://arxiv.org/abs/1409.0473

**Publication** arXiv:1409.0473 [cs, stat]

**Date** 2014-09-01

**Extra** 07290 arXiv: 1409.0473

Accessed 6/21/2019, 5:03:31 PM

Library Catalog arXiv.org

**Abstract** Neural machine translation is a recently proposed approach to machine translation. Unlike the traditional statistical machine translation, the neural machine translation aims at building a single neural network that can be jointly tuned to maximize the translation performance. The models proposed recently for neural machine translation often belong to a family of encoder-decoders and consists of an encoder that encodes a source sentence into a fixed-length vector from which a decoder generates a translation. In this paper, we conjecture that the use of a fixed-length vector is a bottleneck in improving the performance of this basic encoder-decoder architecture, and propose to extend this by allowing a model to automatically (soft-)search for parts of a source sentence that are relevant to predicting a target word, without having to form these parts as a hard segment explicitly. With this new approach, we achieve a translation performance comparable to the existing state-of-the-art phrase-based system on the task of Englishto-French translation. Furthermore, qualitative analysis reveals that the (soft-)alignments found by the model agree well with our intuition.

**Date Added** 6/21/2019, 5:03:31 PM **Modified** 6/21/2019, 5:03:52 PM

## Tags:

Computer Science - Computation and Language, Computer Science - Neural and Evolutionary Computing, Computer Science - Machine Learning, Statistics - Machine Learning

## **Notes:**

Comment: Accepted at ICLR 2015 as oral presentation

## **Attachments**

- o arXiv.org Snapshot
- Bahdanau et al\_2014\_Neural Machine Translation by Jointly Learning to Align and Translate.pdf

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  - 3.2 Encoder: Bidirectional RNN for Annotating Sequences
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    - A.1.1 Recurrent Neural Network
    - A.1.2 Alignment Model
  - A.2 Detailed Description of the Model
    - A.2.1 Encoder
    - A.2.2 Decoder
    - A.2.3 Model Size
- **B** Training Procedure
  - **B.1** Parameter Initialization
  - **B.2** Training
- C Translations of Long Sentences

Neural Transfer Learning for Natural Language Processing

Type Journal Article

Author Sebastian Ruder

Pages 329

**Extra** 00002

Library Catalog Zotero

Language en

**Date Added** 6/21/2019, 11:34:13 AM **Modified** 6/21/2019, 11:34:18 AM

#### Tags:

■ No DOI found

#### **Attachments**

• Ruder - Neural Transfer Learning for Natural Language Proc.pdf

# Pattern recognition and machine learning

Type Book

Author Christopher M. Bishop

**Series** Information science and statistics

Place New York

Publisher Springer

**ISBN** 978-0-387-31073-2

**Date** 2006

**Call Number** Q327 .B52 2006

**Extra** 36259

Library Catalog Library of Congress ISBN

**Language** en # of Pages 738

**Date Added** 6/21/2019, 2:08:42 PM **Modified** 6/21/2019, 2:08:43 PM

### Tags:

Machine learning, Pattern perception

#### **Attachments**

• Bishop - 2006 - Pattern recognition and machine learning.pdf

## Random Search for Hyper-Parameter Optimization

Type Journal Article **Author** James Bergstra Author Yoshua Bengio

Pages 25

**Extra** 02538

Library Catalog Zotero

Language en

**Abstract** Grid search and manual search are the most widely used strategies for hyperparameter optimization. This paper shows empirically and theoretically that randomly chosen trials are more efficient for hyper-parameter optimization than trials on a grid. Empirical evidence comes from a comparison with a large previous study that used grid search and manual search to configure neural networks and deep belief networks. Compared with neural networks configured by a pure grid search, we find that random search over the same domain is able to find models that are as good or better within a small fraction of the computation time. Granting random search the same computational budget, random search finds better models by effectively searching a larger, less promising configuration space. Compared with deep belief networks configured by a thoughtful combination of manual search and grid search, purely random search over the same 32-dimensional configuration space found statistically equal performance on four of seven data sets, and superior performance on one of seven. A Gaussian process analysis of the function from hyper-parameters to validation set performance reveals that for most data sets only a few of the hyper-parameters really matter, but that different hyper-parameters are important on different data sets. This phenomenon makes grid search a poor choice for configuring algorithms for new data sets. Our analysis casts some light on why recent "High Throughput" methods achieve surprising success—they appear to search through a large number of hyper-parameters because most hyperparameters do not matter much. We anticipate that growing interest in large hierarchical models will place an increasing burden on techniques for hyperparameter optimization; this work shows that random search is a natural baseline against which to judge progress in the development of adaptive (sequential) hyper-parameter optimization algorithms.

**Date Added** 6/21/2019, 11:30:14 AM **Modified** 6/21/2019, 11:31:18 AM

#### Tags:

■ No DOI found

#### **Attachments**

• Bergstra and Bengio - Random Search for Hyper-Parameter Optimization.pdf

# Real-Time Single Image and Video Super-Resolution Using an Efficient Sub-Pixel Convolutional Neural Network

Type Journal Article

Author Wenzhe Shi

Author Jose Caballero

Author Ferenc Huszár

**Author** Johannes Totz

**Author** Andrew P. Aitken

**Author** Rob Bishop

Author Daniel Rueckert

Author Zehan Wang

URL http://arxiv.org/abs/1609.05158

**Publication** arXiv:1609.05158 [cs, stat]

Date 2016-09-16

**Extra** 00751 arXiv: 1609.05158

Accessed 6/21/2019, 4:49:34 PM

Library Catalog arXiv.org

Abstract Recently, several models based on deep neural networks have achieved great

success in terms of both reconstruction accuracy and computational performance for single image super-resolution. In these methods, the low resolution (LR) input image is upscaled to the high resolution (HR) space using a single filter, commonly bicubic interpolation, before reconstruction. This means that the super-resolution (SR) operation is performed in HR space. We demonstrate that this is sub-optimal and adds computational complexity. In this paper, we present the first convolutional neural network (CNN) capable of real-time SR of 1080p videos on a single K2 GPU. To achieve this, we propose a novel CNN architecture where the feature maps are extracted in the LR space. In addition, we introduce an efficient sub-pixel convolution layer which learns an array of upscaling filters to upscale the final LR feature maps into the HR output. By doing so, we effectively replace the handcrafted bicubic filter in the SR pipeline with more complex upscaling filters specifically trained for each feature map, whilst also reducing the computational complexity of the overall SR operation. We evaluate the proposed approach using images and videos from publicly available datasets and show that it performs significantly better (+0.15dB on Images and +0.39dB on Videos) and is an order of magnitude faster than previous CNN-based methods.

**Date Added** 6/21/2019, 4:49:34 PM

**Modified** 6/21/2019, 4:49:40 PM

#### Tags:

Computer Science - Computer Vision and Pattern Recognition, Statistics - Machine Learning

#### **Notes:**

Comment: CVPR 2016 paper with updated affiliations and supplemental material, fixed typo in equation 4

#### **Attachments**

- arXiv.org Snapshot
- Shi et al\_2016\_Real-Time Single Image and Video Super-Resolution Using an Efficient Sub-Pixel.pdf

## Realistic Evaluation of Deep Semi-Supervised Learning Algorithms

Type Journal Article

**Author** Avital Oliver

Author Augustus Odena

Author Colin Raffel

Author Ekin D. Cubuk

Author Ian J. Goodfellow

**URL** http://arxiv.org/abs/1804.09170

**Publication** arXiv:1804.09170 [cs, stat]

**Date** 2018-04-24

**Extra** 00063 arXiv: 1804.09170

Accessed 6/21/2019, 11:55:34 AM

Library Catalog arXiv.org

**Abstract** Semi-supervised learning (SSL) provides a powerful framework for

leveraging unlabeled data when labels are limited or expensive to obtain. SSL algorithms based on deep neural networks have recently proven successful on standard benchmark tasks. However, we argue that these benchmarks fail to address many issues that these algorithms would face in real-world applications. After creating a unified reimplementation of various widely-used SSL techniques, we test them in a suite of experiments designed to address these issues. We find that the performance of simple baselines which do not use unlabeled data is often underreported, that SSL methods differ in sensitivity to the amount of labeled and unlabeled data, and that performance can degrade substantially when the unlabeled dataset contains out-of-class examples. To help guide SSL research towards real-world applicability, we make our unified reimplemention and evaluation platform publicly available.

**Date Added** 6/21/2019, 11:55:34 AM

**Modified** 6/21/2019, 11:56:14 AM

#### Tags:

◆ No DOI found, Computer Science - Machine Learning, Statistics - Machine Learning

#### **Attachments**

• Oliver et al\_2018\_Realistic Evaluation of Deep Semi-Supervised Learning Algorithms.pdf

## Recurrent Convolutional Neural Networks for Scene Labeling

Type Journal Article

Author Pedro O Pinheiro

Author Ronan Collobert

Pages 9

Extra 00563

Library Catalog Zotero

Language en

**Abstract** The goal of the scene labeling task is to assign a class label to each pixel in an image. To ensure a good visual coherence and a high class accuracy, it is essential for a model to capture long range (pixel) label dependencies in images. In a feed-forward architecture, this can be achieved simply by considering a sufficiently large input context patch, around each pixel to be labeled. We propose an approach that consists of a recurrent convolutional neural network which allows us to consider a large input context while limiting the capacity of the model. Contrary to most standard approaches, our method does not rely on any segmentation technique nor any taskspecific features. The system is trained in an end-to-end manner over raw pixels, and models complex spatial dependencies with low inference cost. As the context size increases with the built-in recurrence, the system identifies and corrects its own errors. Our approach yields state-ofthe-art performance on both the Stanford Background Dataset and the SIFT Flow Dataset, while remaining very fast at test time.

**Date Added** 6/21/2019, 11:45:24 AM

**Modified** 6/21/2019, 11:45:30 AM

#### Tags:

♠ No DOI found

#### **Attachments**

• Pinheiro and Collobert - Recurrent Convolutional Neural Networks for Scene .pdf

## Show and Tell: A Neural Image Caption Generator

Type Journal Article

**Author** Oriol Vinyals

**Author** Alexander Toshev

Author Samy Bengio

Author Dumitru Erhan

URL http://arxiv.org/abs/1411.4555

**Publication** arXiv:1411.4555 [cs]

**Date** 2014-11-17

**Extra** 02562 arXiv: 1411.4555

Accessed 6/21/2019, 12:44:10 PM

Library Catalog arXiv.org

**Abstract** Automatically describing the content of an image is a fundamental problem

in artificial intelligence that connects computer vision and natural language processing. In this paper, we present a generative model based on a deep recurrent architecture that combines recent advances in computer vision and machine translation and that can be used to generate natural sentences describing an image. The model is trained to maximize the likelihood of the target description sentence given the training image. Experiments on several datasets show the accuracy of the model and the fluency of the language it learns solely from image descriptions. Our model is often quite accurate, which we verify both qualitatively and quantitatively. For instance, while the current state-of-the-art BLEU-1 score (the higher the better) on the Pascal dataset is 25, our approach yields 59, to be compared to human performance around 69. We also show BLEU-1 score improvements on Flickr30k, from 56 to 66, and on SBU, from 19 to 28. Lastly, on the newly released COCO dataset, we achieve a BLEU-4 of 27.7, which is the current state-of-the-art.

**Short Title** Show and Tell

**Date Added** 6/21/2019, 12:44:10 PM

**Modified** 6/21/2019, 12:44:24 PM

#### Tags:

Computer Science - Computer Vision and Pattern Recognition

#### **Attachments**

- o arXiv.org Snapshot
- Vinyals et al\_2014\_Show and Tell.pdf

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  - 4.2 . Datasets
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    - 4.3.5 Ranking Results
    - 4.3.6 Human Evaluation
    - 4.3.7 Analysis of Embeddings
- 5. Conclusion

# Show and Tell: Lessons learned from the 2015 MSCOCO Image Captioning Challenge

Type Journal Article

**Author** Oriol Vinyals

**Author** Alexander Toshev

Author Samy Bengio

**Author** Dumitru Erhan

URL http://arxiv.org/abs/1609.06647

Volume 39

Issue 4

Pages 652-663

Publication IEEE Transactions on Pattern Analysis and Machine Intelligence

ISSN 0162-8828, 2160-9292

**Date** 2017-4-1

**Extra** 00281 arXiv: 1609.06647

Journal Abbr IEEE Trans. Pattern Anal. Mach. Intell.

DOI 10/f9xnjx

Accessed 6/21/2019, 11:30:39 AM

Library Catalog arXiv.org

Language en

Abstract Automatically describing the content of an image is a fundamental problem

in artificial intelligence that connects computer vision and natural language processing. In this paper, we present a generative model based on a deep recurrent architecture that combines recent advances in computer vision and machine translation and that can be used to generate natural sentences describing an image. The model is trained to maximize the likelihood of the target description sentence given the training image. Experiments on several datasets show the accuracy of the model and the fluency of the language it learns solely from image descriptions. Our model is often quite accurate, which we verify both qualitatively and quantitatively. Finally, given the recent surge of interest in this task, a competition was organized in 2015 using the newly released COCO dataset. We describe and analyze the various improvements we applied to our own baseline and show the resulting performance in the competition, which we won ex-aequo with a team from Microsoft Research, and provide an open source implementation in TensorFlow.

**Short Title** Show and Tell

**Date Added** 6/21/2019, 11:30:39 AM **Modified** 6/21/2019, 11:30:43 AM

#### Tags:

Computer Science - Computer Vision and Pattern Recognition

#### **Notes:**

Comment: arXiv admin note: substantial text overlap with arXiv:1411.4555

#### **Attachments**

• Vinyals et al. - 2017 - Show and Tell Lessons learned from the 2015 MSCOC.pdf

## State-Space Representations of Deep Neural Networks

**Type** Journal Article

**Author** Michael Hauser

Author Sean Gunn

Author Samer Saab

**Author** Asok Ray

URL https://www.mitpressjournals.org/doi/10.1162/neco\_a\_01165

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**Extra** 00001

Journal Abbr Neural Computation

DOI 10/gf35pr

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Library Catalog DOI.org (Crossref)

Language en

**Abstract** This letter deals with neural networks as dynamical systems governed by finite difference equations. It shows that the introduction of [Formula: see textl-many skip connections into network architectures, such as residual networks and additive dense networks, defines [Formula: see text]th order dynamical equations on the layer-wise transformations. Closed-form solutions for the state-space representations of general [Formula: see text]th order additive dense networks, where the concatenation operation is replaced by addition, as well as [Formula: see text]th order smooth networks, are found. The developed provision endows deep neural networks with an algebraic structure. Furthermore, it is shown that imposing [Formula: see text]th order smoothness on network architectures with [Formula: see text]-many nodes per layer increases the state-space dimension by a multiple of [Formula: see text], and so the effective embedding dimension of the data manifold by the neural network is [Formula: see text]-many dimensions. It follows that network architectures of these types reduce the number of parameters needed to maintain the same embedding dimension by a factor of [Formula: see text] when compared to an equivalent first-order, residual network. Numerical simulations and experiments on CIFAR10, SVHN, and MNIST have been conducted to help understand the developed theory and efficacy of the proposed concepts.

**Date Added** 6/21/2019, 12:55:58 PM

Modified 6/21/2019, 12:55:59 PM

#### **Attachments**

• Hauser et al. - 2019 - State-Space Representations of Deep Neural Network.pdf

## Statistical learning with sparsity: the lasso and generalizations

Type Book

**Author** Trevor Hastie

Author Robert Tibshirani

**Author** Martin Wainwright

**Series** Monographs on statistics and applied probability

Place Boca Raton

Publisher CRC Press, Taylor & Francis Group

**ISBN** 978-1-4987-1216-3

**Date** 2015

**Call Number** QA275 .H38 2015

Extra 00982

Series Number 143

**Library Catalog** Library of Congress ISBN

Short Title Statistical learning with sparsity

# of Pages 351

**Date Added** 6/21/2019, 6:33:56 PM **Modified** 6/21/2019, 6:33:58 PM

#### Tags:

Least squares, Linear models (Statistics), Mathematical statistics, Proof theory

#### **Notes:**

"A Chapman & Hall book."

#### **Attachments**

• Hastie et al. - 2015 - Statistical learning with sparsity the lasso and .pdf

## T-CGAN: Conditional Generative Adversarial Network for Data Augmentation in Noisy Time Series with Irregular Sampling

Type Journal Article

Author Giorgia Ramponi

**Author** Pavlos Protopapas

Author Marco Brambilla

Author Ryan Janssen

URL http://arxiv.org/abs/1811.08295

Publication arXiv:1811.08295 [cs, stat]

**Date** 2018-11-20

**Extra** 00001 arXiv: 1811.08295

**Accessed** 6/21/2019, 11:44:10 AM

Library Catalog arXiv.org

Language en

**Abstract** In this paper we propose a data augmentation method for time series with

irregular sampling, Time-Conditional Generative Adversarial Network (T-CGAN). Our approach is based on Conditional Generative Adversarial Networks (CGAN), where the generative step is implemented by a deconvolutional NN and the discriminative step by a convolutional NN. Both the generator and the discriminator are conditioned on the sampling timestamps, to learn the hidden relationship between data and timestamps,

and consequently to generate new time series.

**Short Title** T-CGAN

**Date Added** 6/21/2019, 11:44:10 AM **Modified** 6/21/2019, 11:44:12 AM

### Tags:

◆ No DOI found, Computer Science - Machine Learning, Statistics - Machine Learning

#### **Attachments**

• Ramponi et al. - 2018 - T-CGAN Conditional Generative Adversarial Network.pdf

## The elements of statistical learning: data mining, inference, and prediction

Type Book

**Author** Trevor Hastie

Author Robert Tibshirani

Author J. H. Friedman

**Series** Springer series in statistics

Edition 2nd ed

Place New York, NY

Publisher Springer

ISBN 978-0-387-84857-0 978-0-387-84858-7

**Date** 2009

Call Number Q325.5 .H39 2009

**Extra** 00355

Library Catalog Library of Congress ISBN

**Short Title** The elements of statistical learning

# of Pages 745

**Date Added** 6/21/2019, 6:37:21 PM **Modified** 6/21/2019, 6:37:24 PM

#### Tags:

Machine learning, Bioinformatics, Computational intelligence, Data mining, Forecasting, Inference, Methodology, Statistics

#### **Attachments**

• Hastie et al. - 2009 - The elements of statistical learning data mining, pdf

The great time series classification bake off: a review and experimental evaluation of recent algorithmic advances

**Type** Journal Article

**Author** Anthony Bagnall

**Author** Jason Lines

**Author** Aaron Bostrom

Author James Large

Author Eamonn Keogh

**URL** http://link.springer.com/10.1007/s10618-016-0483-9

Volume 31

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**Publication** Data Mining and Knowledge Discovery

**ISSN** 1384-5810, 1573-756X

**Date** 5/2017

Journal Abbr Data Min Knowl Disc

**DOI** 10/f9586n

**Accessed** 6/21/2019, 11:44:25 AM

Library Catalog DOI.org (Crossref)

Language en

**Abstract** In the last 5 years there have been a large number of new time series classification algorithms proposed in the literature. These algorithms have been evaluated on subsets of the 47 data sets in the University of California, Riverside time series classification archive. The archive has recently been expanded to 85 data sets, over half of which have been donated by researchers at the University of East Anglia. Aspects of previous evaluations have made comparisons between algorithms difficult. For example, several different programming languages have been used, experiments involved a single train/test split and some used normalised data whilst others did not. The relaunch of the archive provides a timely opportunity to thoroughly evaluate algorithms on a larger number of datasets. We have implemented 18 recently proposed algorithms in a common Java framework and compared them against two standard benchmark classifiers (and each other) by performing 100 resampling experiments on each of the 85 datasets. We use these results to test several hypotheses relating to whether the algorithms

are significantly more accurate than the benchmarks and each other. Our results indicate that only nine of these algorithms are significantly more accurate than both benchmarks and that one classifier, the collective of transformation ensembles, is significantly more accurate than all of the others. All of our experiments and results are reproducible: we release all of our code, results and experimental details and we hope these experiments form the basis for more robust testing of new algorithms in the future.

**Short Title** The great time series classification bake off

**Date Added** 6/21/2019, 11:44:25 AM **Modified** 6/21/2019, 11:44:28 AM

#### **Attachments**

• Bagnall et al. - 2017 - The great time series classification bake off a r.pdf

## U-Net: Convolutional Networks for Biomedical Image Segmentation

Type Journal Article

Author Olaf Ronneberger

**Author** Philipp Fischer

**Author** Thomas Brox

URL http://arxiv.org/abs/1505.04597

**Publication** arXiv:1505.04597 [cs]

**Date** 2015-05-18

**Extra** 06228 arXiv: 1505.04597

**Accessed** 6/21/2019, 4:42:59 PM

Library Catalog arXiv.org

**Abstract** There is large consent that successful training of deep networks requires

many thousand annotated training samples. In this paper, we present a network and training strategy that relies on the strong use of data augmentation to use the available annotated samples more efficiently. The architecture consists of a contracting path to capture context and a symmetric expanding path that enables precise localization. We show that such a network can be trained end-to-end from very few images and outperforms the prior best method (a sliding-window convolutional network) on the ISBI challenge for segmentation of neuronal structures in electron microscopic stacks. Using the same network trained on transmitted light microscopy images (phase contrast and DIC) we won the ISBI cell tracking challenge 2015 in these categories by a large margin. Moreover, the network is fast. Segmentation of a 512x512 image takes less than a second on a recent GPU. The full implementation (based on Caffe) and the trained networks are available at http://lmb.informatik.uni-freiburg.de/people/ronneber/u-net.

**Short Title** U-Net

**Date Added** 6/21/2019, 4:42:59 PM

#### **Modified** 6/21/2019, 4:43:04 PM

#### Tags:

Computer Science - Computer Vision and Pattern Recognition

#### **Notes:**

Comment: conditionally accepted at MICCAI 2015

#### **Attachments**

- arXiv.org Snapshot
- Ronneberger et al\_2015\_U-Net.pdf

#### **Contents**

U-Net: Convolutional Networks for Biomedical Image Segmentation

## Very Deep Convolutional Networks for Large-Scale Image Recognition

Type Journal Article

Author Karen Simonyan

Author Andrew Zisserman

URL http://arxiv.org/abs/1409.1556

**Publication** arXiv:1409.1556 [cs]

**Date** 2014-09-04

Extra 23902 arXiv: 1409.1556

Accessed 6/21/2019, 11:33:56 AM

Library Catalog arXiv.org

Language en

Abstract In this work we investigate the effect of the convolutional network depth on its accuracy in the large-scale image recognition setting. Our main contribution is a thorough evaluation of networks of increasing depth using an architecture with very small (3 × 3) convolution filters, which shows that a significant improvement on the prior-art configurations can be achieved by pushing the depth to 16–19 weight layers. These findings were the basis of our ImageNet Challenge 2014 submission, where our team secured the first and the second places in the localisation and classification tracks respectively. We also show that our representations generalise well to other datasets, where they achieve state-of-the-art results. We have made our two best-performing ConvNet models publicly available to facilitate further research on the use of deep visual representations in computer vision.

**Date Added** 6/21/2019, 11:33:56 AM

#### Modified 6/21/2019, 11:34:01 AM

#### Tags:

◆ No DOI found, Computer Science - Computer Vision and Pattern Recognition

#### **Attachments**

• Simonyan and Zisserman - 2014 - Very Deep Convolutional Networks for Large-Scale

## Visualizing and Understanding Convolutional Networks

Type Book Section

**Editor** David Fleet

Editor Tomas Pajdla

Editor Bernt Schiele

**Editor** Tinne Tuytelaars

Author Matthew D. Zeiler

**Author** Rob Fergus

URL http://link.springer.com/10.1007/978-3-319-10590-1\_53

**Volume** 8689

Place Cham

**Publisher** Springer International Publishing

Pages 818-833

ISBN 978-3-319-10589-5 978-3-319-10590-1

**Date** 2014

Extra 00000 DOI: 10.1007/978-3-319-10590-1 53

Accessed 6/21/2019, 11:34:07 AM

Library Catalog DOI.org (Crossref)

Language en

**Abstract** Large Convolutional Network models have recently demonstrated impressive classification performance on the ImageNet benchmark Krizhevsky et al. [18]. However there is no clear understanding of why they perform so well, or how they might be improved. In this paper we explore both issues. We introduce a novel visualization technique that gives insight into the function of intermediate feature layers and the operation of the classifier. Used in a diagnostic role, these visualizations allow us to find model architectures that outperform Krizhevsky et al. on the ImageNet classification benchmark. We also perform an ablation study to discover the performance contribution from different model layers. We show our ImageNet model generalizes well to other datasets: when the softmax classifier is retrained, it convincingly beats the current state-ofthe-art results on Caltech-101 and Caltech-256 datasets.

**Book Title** Computer Vision – ECCV 2014

**Date Added** 6/21/2019, 11:34:07 AM **Modified** 6/21/2019, 11:34:09 AM

#### **Attachments**

• Zeiler and Fergus - 2014 - Visualizing and Understanding Convolutional Networ.pdf

### Visualizing the Loss Landscape of Neural Nets

Type Journal Article

Author Hao Li

Author Zheng Xu

**Author** Gavin Taylor

**Author** Christoph Studer

Author Tom Goldstein

URL http://arxiv.org/abs/1712.09913

**Publication** arXiv:1712.09913 [cs, stat]

**Date** 2017-12-28

**Extra** 00129 arXiv: 1712.09913

Accessed 6/21/2019, 1:05:39 PM

Library Catalog arXiv.org

**Abstract** Neural network training relies on our ability to find "good" minimizers of

highly non-convex loss functions. It is well-known that certain network architecture designs (e.g., skip connections) produce loss functions that train easier, and well-chosen training parameters (batch size, learning rate, optimizer) produce minimizers that generalize better. However, the reasons for these differences, and their effects on the underlying loss landscape, are not well understood. In this paper, we explore the structure of neural loss functions, and the effect of loss landscapes on generalization, using a range of visualization methods. First, we introduce a simple "filter normalization" method that helps us visualize loss function curvature and make meaningful side-by-side comparisons between loss functions. Then, using a variety of visualizations, we explore how network architecture affects the loss landscape, and how training parameters affect the shape of minimizers.

**Date Added** 6/21/2019, 1:05:39 PM

**Modified** 6/21/2019, 1:06:23 PM

#### Tags:

Computer Science - Computer Vision and Pattern Recognition, Computer Science - Machine

Learning, Statistics - Machine Learning

#### **Notes:**

Comment: NIPS 2018 (extended version, 10.5 pages), code is available at https://github.com/tomgoldstein/loss-landscape

#### **Attachments**

- arXiv.org Snapshot
- Li et al\_2017\_Visualizing the Loss Landscape of Neural Nets.pdf

#### **Contents**

- 1 Introduction
  - 1.1 Contributions
- 2 Theoretical Background
- 3 The Basics of Loss Function Visualization
- 4 Proposed Visualization: Filter-Wise Normalization
- 5 The Sharp vs Flat Dilemma
- 6 What Makes Neural Networks Trainable? Insights on the (Non)Convexity Structure of Loss Surfaces
- 7 Visualizing Optimization Paths
  - 7.1 Why Random Directions Fail: Low-Dimensional Optimization Trajectories
  - 7.2 Effective Trajectory Plotting using PCA Directions
- 8 Conclusion
- A Comparison of Loss Surfaces
  - A.1 The Change of Weights Norm during Training
  - A.2 Comparision of Normalization Methods
  - A.3 Small-Batch vs Large-Batch for ResNet-56
  - A.4 Repeatability of the Loss Surface Visualization
  - A.5 Implementation Details
  - A.6 Training Curves for VGG-9 and ResNets

# What is the Role of Recurrent Neural Networks (RNNs) in an Image Caption Generator?

Type Journal Article

Author Marc Tanti

Author Albert Gatt

**Author** Kenneth P. Camilleri

URL http://arxiv.org/abs/1708.02043

**Publication** arXiv:1708.02043 [cs]

**Date** 2017-08-07

**Extra** 00005 arXiv: 1708.02043 **Accessed** 6/21/2019, 12:44:55 PM

Library Catalog arXiv.org

**Abstract** In neural image captioning systems, a recurrent neural network (RNN) is

typically viewed as the primary `generation' component. This view suggests that the image features should be `injected' into the RNN. This is in fact the dominant view in the literature. Alternatively, the RNN can instead be viewed as only encoding the previously generated words. This view suggests that the RNN should only be used to encode linguistic features and that only the final representation should be `merged' with the image features at a later stage. This paper compares these two architectures. We find that, in general, late merging outperforms injection, suggesting that RNNs are better viewed

as encoders, rather than generators.

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### Tags:

Computer Science - Computation and Language, Computer Science - Neural and Evolutionary Computing, Computer Science - Computer Vision and Pattern Recognition

#### **Notes:**

Comment: Appears in: Proceedings of the 10th International Conference on Natural Language Generation (INLG'17)

#### **Attachments**

- arXiv.org Snapshot
- Tanti et al\_2017\_What is the Role of Recurrent Neural Networks (RNNs) in an Image Caption.pdf

## Where to put the Image in an Image Caption Generator

Type Journal Article

Author Marc Tanti

Author Albert Gatt

Author Kenneth P. Camilleri

URL http://arxiv.org/abs/1703.09137

Volume 24

Issue 3

Pages 467-489

**Publication** Natural Language Engineering

ISSN 1351-3249, 1469-8110

**Date** 05/2018

**Extra** 00015 arXiv: 1703.09137

Journal Abbr Nat. Lang. Eng.

**DOI** 10/gf35pm

**Accessed** 6/21/2019, 12:42:39 PM

Library Catalog arXiv.org

**Abstract** When a recurrent neural network language model is used for caption generation, the image information can be fed to the neural network either by directly incorporating it in the RNN -- conditioning the language model by `injecting' image features -- or in a layer following the RNN -- conditioning the language model by 'merging' image features. While both options are attested in the literature, there is as yet no systematic comparison between the two. In this paper we empirically show that it is not especially detrimental to performance whether one architecture is used or another. The merge architecture does have practical advantages, as conditioning by merging allows the RNN's hidden state vector to shrink in size by up to four times. Our results suggest that the visual and linguistic modalities for caption generation need not be jointly encoded by the RNN as that yields large, memory-intensive models with few tangible advantages in performance; rather, the multimodal integration should be delayed to a subsequent stage.

**Date Added** 6/21/2019, 12:42:39 PM **Modified** 6/21/2019, 12:42:42 PM

#### Tags:

Computer Science - Computation and Language, Computer Science - Neural and Evolutionary Computing, Computer Science - Computer Vision and Pattern Recognition

#### **Notes:**

Comment: Accepted in JNLE Special Issue: Language for Images (24.3) (expanded with content that was removed from journal paper in order to reduce number of pages), 28 pages, 5 figures, 6 tables

#### **Attachments**

- arXiv.org Snapshot
- Tanti et al\_2018\_Where to put the Image in an Image Caption Generator.pdf