

# Raghav Goyal

## Contact Information

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## Work Experience

**Twenty Billion Neurons, Berlin, Germany** - a video understanding startup Oct 2016 - Present  
*AI Engineer* (with Roland Memisevic, PhD)

- Research in describing actions in video sequences from real-life crowdsourced datasets, containing fine-grained concepts with an aim to extract *common sense*
- Placed 3<sup>rd</sup> in Kinetics Video Recognition challenge among 16 teams with best top-5 performance, hosted by DeepMind as a part of ActivityNet workshop at CVPR'17 [[summary](#)]
- Placed 3<sup>rd</sup> in Visual Dialog challenge among 11 teams, hosted as a part of Workshop on Shortcomings in Vision and Language at ECCV'18, outranking Microsoft's submission [[rankings](#)]
- Prototyped and benchmarked an open-source binary data format - *GulpIO*, for faster read access to high volume datasets with upto 8x speed-up on magnetic disks [[PyPI](#)][[blog](#)]

## Education

**Indian Institute of Technology (IIT) Delhi, New Delhi, India** 2010 - 2015  
Integrated M.Tech. in Mathematics & Computing. CGPA: 7.69/10

**Grenoble INP, Grenoble, France** 2015 - 2016  
Masters by Research in Statistics (in collaboration with Xerox). GPA: 15.24/20

## Publications

1. R Goyal, Farzaneh Mahdisoltani, Guillaume Berger, Waseem Gharbieh, Ingo Bax, Roland Memisevic. “*Evaluating visual ‘common sense’ using fine-grained classification and captioning tasks*”. In ICLR Workshop. Vancouver, Canada. May 2018. ([pdf](#))
2. R Goyal, S Kahou, V Michalski, J Materzynska, S Westphal, \*, I Bax, R Memisevic. “*The ‘something something’ video database for learning and evaluating visual common sense*”. In ICCV. Venice, Italy. Oct 2017. ([pdf](#)) [Acceptance Rate: 28.9%]
3. Raghav Goyal, Marc Dymetman, Eric Gaussier. “*Natural Language Generation through character-based RNNs with finite-state prior knowledge*”. In Proceedings of 26th International Conference on Computational Linguistics (COLING). Japan. Dec 2016. ([pdf](#))[[slides](#)] [Acceptance Rate: 32%]

## Blog posts

1. “Visual Explanation for video recognition”. Understanding what neural networks see when classifying videos. [[Link](#)]
2. “Recognizing human actions in videos”. How we placed third in the 2017 ActivityNet challenge. [[Link](#)]
3. “Modelling audio signal using visual features”. On partially reconstructing audio waveform that captures distinct motion patterns occurring in a video such as hits, collision, etc. [[Link](#)]

## Internships

**Recurrent Neural Networks for Natural Language Generation** Spring, 2016  
*Xerox Research Centre Europe, Meylan, France* (Dr. Marc Dymetman)

- Developed an attention-based sequence-to-sequence model for generating natural language utterance from a given semantic representation of information
- Used a character-level model which unlike the word-level model is able to “copy” information from the input representation without any pre-processing
- Imposed a weak prior in the form of a finite state machine which constrains the generation task to avoid inventing information and generating non-words

	<b>Personalized Messaging Engine</b> <span style="float: right;">Summers, 2014</span> <i>Xerox Research Centre India, Bangalore, India</i> <span style="float: right;">(Dr. Koustuv Dasgupta)</span> <ul style="list-style-type: none"> <li>Developed prioritization module which fires relevant messages for employees based on their feed-back &amp; employer's priority</li> <li>Used Collective Matrix Factorization to build recommender system which combines multiple information sources such as message attributes and user demography</li> </ul>
<b>Patents</b>	<ol style="list-style-type: none"> <li>Goyal, Raghav, and Marc Dymetman. "Natural language generation through character-based recurrent neural networks with finite-state prior knowledge." U.S. Patent Application No. US10049106B2. 2018. Granted.</li> <li>Sharma, Avinash, et al. "Methods and systems for transmitting prioritized messages to employees." U.S. Patent Application No. US10089605B2. 2016. Granted.</li> </ol>
<b>Projects</b>	<b>Classifying images using Deep Learning Architecture</b> [ <a href="#">Thesis</a>   <a href="#">Code</a> ] <span style="float: right;">Aug, 2014 - July, 2015</span> <i>M.Tech. Thesis, Department of Mathematics, IIT Delhi</i> <span style="float: right;">(Dr. B. Chandra)</span> <ul style="list-style-type: none"> <li>Inspected gradient based learning algorithm for maximizing joint likelihood of input data &amp; class labels in Classification Restricted Boltzmann Machine (ClassRBM)</li> <li>Formulated an extension of ClassRBM - a Convolutional ClassRBM, to efficiently use spatial properties of images. Subsequently, obtained better accuracy over its one-dimensional counterpart, ClassRBM</li> </ul> <b>Sentiment Mining over Twitter Feeds</b> [ <a href="#">Code</a>   <a href="#">Writeup</a> ] <span style="float: right;">Fall, 2014</span> <i>Department of Computer Science &amp; Engineering, IIT Delhi</i> <span style="float: right;">(Dr. Mausam)</span> <ul style="list-style-type: none"> <li>Developed sentiment categorization system trained over 1.6 million tweets of Sent140 dataset to predict positive or negative sentiment</li> <li>Implemented and analysed performance of Naive Bayes, SVM &amp; Max Ent models</li> <li>Improved precision by using tweet normalization, stop words, lemmatization, negation &amp; part of speech tagging</li> </ul> <b>Trading Forex via Recurrent Reinforcement Learning</b> [ <a href="#">Report</a>   <a href="#">Slides</a> ] <span style="float: right;">Fall, 2013</span> <i>Department of Computer Science &amp; Engineering, IIT Delhi</i> <span style="float: right;">(Dr. Parag Singla)</span> <ul style="list-style-type: none"> <li>Implemented algorithmic trading strategy for USD-EUR exchange rate to predict future buy or sell position in a high frequency setup</li> <li>Trained feedback neural network using Differential Sharpe Ratio as performance measure</li> <li>Compared and established higher cumulative returns over Buy &amp; Hold and Random Monkey strategy</li> </ul>
<b>Awards &amp; Honours</b>	<ul style="list-style-type: none"> <li>All India Rank 652 in IIT-Joint Entrance Examination 2010 over ~0.5 mil candidates</li> <li>All India Rank 1003 in All India Engineering Entrance Examination 2010 over ~1 mil candidates</li> <li>Awarded Grenoble INP foundation scholarship worth €5000 <span style="float: right;">Fall, 2015</span></li> <li>Teaching assistant for MAL 390: Statistical Methods &amp; Algorithms <span style="float: right;">Spring, 2015</span></li> <li>Awarded MHRD scholarship for securing All India Rank 84 in Graduate Aptitude Test for Engineering (GATE) 2014 <span style="float: right;">2014-15</span></li> </ul>
<b>Relevant Courses</b>	Data Structures, Analysis & Design of Algorithms, Multivariate Statistics, Graph Algorithms, Theory of Automata, Optimization Methods, Data Mining, Software Engineering, Machine Learning, Natural Language Processing
<b>Technical Skills</b>	Languages: C, C++, Java, Python Softwares/Tools: R, MATLAB, L <sup>A</sup> T <sub>E</sub> X, TensorFlow, PyTorch