### "It's freezing and snowing in New York – we need global warming!" - Donald Trump

## "Don't bring him to Dublin" - Me



Figurative language



**#AdolfHitler** is the **#EricCartman** of **#WorldWarll**: racist and prejudiced, yet strategic too.



#### A man was filing for divorce. Q: "Occupation"? A: "Marriage Counselor"



You know you love your work when you go there on your day off .. @

# Fracking Sarcasm using Neural network





# "I am not doing Sarcasm now!!!"



If I ever need a brain transplant, I'd choose yours because I'd want a brain that had never been used.

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### Doctor's appointments all day, how exciting <a> #not</a>

## Doctor's appointments all day, how exciting <a> #not</a>

- Riloff et al.(2013)
  - juxtaposition of positive sentiment contrasted with a negative situation or vice versa
- Gonzalez-Ibanez et al.(2011)
  - lexical and pragmatic factors such as emoticons and referred profile in social media
- Tsur et al.(2010)
  - Surface features about a product, frequent words, and punctuation marks





# **Bad Language**

- Feeling great right now #not
- i love it when people try 2 hurt my feelings bc i don't hve any lol..
- i love rting arguments



## How???

# Necessity is the mother of invention...

# Frustration Necessity is the mother of invention...

# **Deep Learning Winter School** (DL4MT) Thanks to EAMT, ADAPT, EXPERT, ICHEC & CNGL

# blessed are the forgetful

# Selective memory is surely one of nature's most effective ways of ensuring the survival of our species.~ Nigel Hamilton

# Long Short Term Memory

Sepp Hochreiter and Jürgen Schmidhuber

# How did you reach here?



Precision	Recall	F-score	
.869	.89	.879	



## **Convolutional Neural Network**



Doctor's appointments all day, how exciting Anot

### Layer 1



# **Deep Neural Network Layer**





## Dropping of dropout

#### I don't know about you man but I love the history homework.

Model	Feature/Hyper parameter	Precision	Recall	F-score
recursive SVM	BOW + POS	.719	.613	.663
recursive SVM	BOW + POS + Sentiment	.722	.661	.691
recursive SVM	BOW + POS + Sentiment + HT-splitter	.743	.721	.732
CNN + CNN	filter size = $64 + $ filter width = $2$	.838	.857	.847
	filter size = $128$ + filter width = $2$	.842	.86	.854
	filter size = $256 + $ filter width = $2$	.855	.879	.868
	filter size = $64 + $ filter width = $3$	.839	.854	.847
	filter size = $128$ + filter width = $3$	.856	.879	.868
	filter size = $256 + $ filter width = $3$	.861	.882	.872
LSTM + LSTM	hidden memory unit = 64	.849	.816	.832
	hidden memory unit = 128	.854	.871	.862
	hidden memory unit = 256	.868	.89	.879
CNN + LSTM + DNN (with dropout)	filter size = 256 + filter width = 2 + HMU = 256	.899	.91	.904
CNN + LSTM + DNN (without dropout)	filter size = 256 + filter width = 2 + HMU = 256	.912	.911	.912
CNN + LSTM + DNN (without dropout)	filter size = 256 + filter width = 3 + HMU = 256	.919	.923	.921

### **COSMIC FRANKENSTEIN TERRORIZES EARTH!**



Already one whole city has been devoured...and still it grows, minute by minute, reaching out with countless invisible mouths to swallow the earth!



The astounding story of the "thing" that came alive!

THE MAGNETIC MONSTER" storing RICHARD CARLSON Seatting King Discourse - Joint Byren - Jama Lossi - Screenplay by Carl Sanback and Dan Tars - Penkarana by DAN TORS - Dissolid by Curr Shohak and Dan Tars - Penkarana - Disbard Dan Charl Artin Number of layers and Hidden units

Source: Karpathy Char-rnn github

- Training loss << validation loss ⇒ Overfitting. Decrease network size/ to increase dropout.
- Training loss ≅ validation loss ⇒ Underfitting. Increase the

size of your model (number of layers/raw number of

neurons per layer)

### **Bidirectional LSTM**

No improvement has been noticed.

**Experiment to follow :** 

Sarcasm in Conversational environment.

**Man:** I want to sell my Encyclopedia and Britannica collections.

Seller: Wow. You just got married. Congratulation!!



### Why not Word2Vec?

I LOVE getting **paid** three days after my **payday**. Thanks USPS. **#sarcasm** 

- paid:
  - (u'pay', 0.739471971988678),
  - (u'paying', 0.7319362759590149),
  - (u'payed', 0.7023305892944336),
  - (u'pays', 0.6648199558258057),
  - (u'reimbursed', 0.6148985624313354),
  - (u'owed', 0.5781134366989136),
  - (u'refunded', 0.5441124439239502),
  - (u'Paying', 0.5398716926574707),
  - (u'repaid', 0.524738609790802),
  - (u'pocketed', 0.52121901512146),
  - (u'unpaid', 0.5103040337562561),
  - (u'compensated', 0.5092697143554688),
  - (u'overpaid', 0.50515216588974),
  - (u'forked', 0.4953409433364868),
  - (u'reimburse', 0.4884592592716217),
  - (u'payment', 0.48814657330513),
  - (u'topay', 0.48790520429611206),
  - (u'Paid', 0.48704037070274353),
  - (u'invoiced', 0.48614436388015747),
  - (u'contractually\_entitled', 0.4853956699371338)



**Fracking Sarcasm using Neural Network.** Aniruddha Ghosh and Tony Veale. 7th Workshop on Computational Approaches to Subjectivity, Sentiment and Social Media Analysis (WASSA 2016). NAACL-HLT. 16th June 2016, San Diego, California, U.S.A.