Applications

He sat on a chair.

Language Modeling

- ► Mikolov et al. (2010)
- ▶ Li et al. (2015)
- ► Kiros et al. (2015)
- ► Kim et al. (2015)



Speech Recognition

- ► Hinton et al. (2012)
- Graves et al. (2013)
- Chorowski et al. (2015)
- ► Sak et al. (2015)



Machine Translation

- ► Kalchbrenner et al. (2013)
- ► Cho et al. (2014)
- ► Bahdanau et al. (2015)
- ▶ Jean et al. (2015)
- ▶ Gulcehre et al. (2015)
- Sutskever et al. (2014)
- ▶ Luong et al. (2015)

Time	User	Utterance
03:44	Old	I dont run graphical ubuntu,
		I run ubuntu server.
03:45	kuja	Taru: Haha sucker.
03:45	Taru	Kuja: ?
03:45	bur[n]er	Old: you can use "ps ax"
		and "kill (PID#)"
03:45	kuja	Taru: Anyways, you made
		the changes right?
03:45	Taru	Kuja: Yes.
03:45	LiveCD	or killall speedlink
03:45	kuja	Taru: Then from the terminal
		type: sudo apt-get update
03:46	_pm	if i install the beta version,
		how can i update it when
		the final version comes out?
03:46	Taru	Kuja: I did.

Sender	Recipient	Utterance
Old		I dont run graphical ubuntu,
		I run ubuntu server.
bur[n]er	Old	you can use "ps ax" and
		"kill (PID#)"
kuja	Taru	Haha sucker.
Taru	Kuja	?
kuja	Taru	Anyways, you made the
		changes right?
Taru	Kuja	Yes.
kuja	Taru	Then from the terminal type:
		sudo apt-get update
Taru	Kuja	I did.

Conversation Modeling

- ► Shang et al. (2015)
- ▶ Vinyals et al. (2015)
- ► Lowe et al. (2015)
- ▶ Dodge et al. (2015)
- ▶ Weston et al. (2016)

Task 1: Single Supporting Fact

Mary went to the bathroom. John moved to the hallway. Mary travelled to the office. Where is Mary? A:office

Task 3: Three Supporting Facts

John picked up the apple.
John went to the office.
John went to the kitchen.
John dropped the apple.
Where was the apple before the kitchen? A:office

Task 2: Two Supporting Facts

John is in the playground. John picked up the football. Bob went to the kitchen. Where is the football? A:playground

Task 4: Two Argument Relations

The office is north of the bedroom.

The bedroom is north of the bathroom.

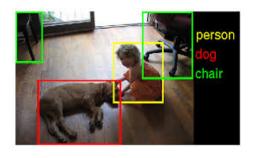
The kitchen is west of the garden.

What is north of the bedroom? A: office

What is the bedroom north of? A: bathroom

Question Answering

- ▶ Weston et al. (2015)
- ▶ Bordes et al. (2015)
- ► Hill et al. (2016)
- ► Hermann et al. (2015)
- Kumar et al. (2016)



Object Recognition

- ▶ Pinheiro et al. (2015)
- ▶ Liang et al. (2015)
- ▶ Byeon et al. (2015)
- ► Serban et al. (2015)
- ► Zheng et al. (2015)
- ▶ Liang et al. (2015)
- ▶ Bell et al. (2015)



Visual Tracking

- ► Gan et al. (2015)
- ► Gregor et al. (2015)
- Lazaridou et al. (2015)
- ► Theis et al. (2015)
- ▶ Van et al. (2016)

Video Analysis

- ► Srivastava et al. (2015)
- ▶ and many more



 Top view of the lights of a city at night, with a well-illuminated square in front of a church in the foreground;
 People on the stairs in front of an illuminated cathedral with two towers at night:

A square with burning street lamps and a street in the foreground;



1. Tourists are sitting at a long table with beer bottles on it in a rather dark restaurant and are raising their bierglaeser; 2. Tourists are sitting at a long table with a

white table-cloth in a somewhat dark restaurant;

Tourists are sitting at a long table with a white table cloth and are eating:

Image Captioning

- ► Mao et al. (2014)
- Mao at al. (2015)
- Kiros et al. (2015)
- Donahue et al. (2015)
- Vinyals et al. (2015)
- Karpathy et al. (2015)
- ► Fang et al. (2015)
- ► Chen et al. (2015)

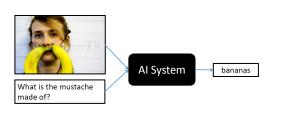
A group of young men playing a game of soccer



A man riding a wave on top of a surfboard.

Video Captioning

- Donahue et al. (2014)
- Venugopalan at al. (2014)
- ▶ Pan et al. (2015)
- ▶ Yao et al. (2015)
- Rohrbach et al. (2015)
- ► Zhu et al. (2015)
- ► Cho et al. (2015)



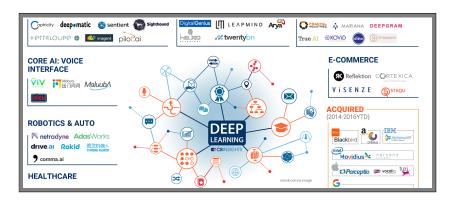
Visual Question Answering

- ► Antol et al. (2014)
- ► Malinowski at al. (2015)
- ► Ren et al. (2015)
- ► Gao et al. (2015)
- ▶ Kim et al. (2016)
- ► Fukui et al. (2016)
- ▶ Noh et al. (2016)
- ► Tapaswi et al. (2015)

Neural Turing Machines

- ► Graves et al. (2014)
- ► Joulin at al. (2015)
- Sukhbaatar et al. (2015)
- Zaremba et al. (2015)
- ► Kurach et al. (2015)
- ► Caballero et al. (2015)
- ▶ Mei et al. (2015)
- ► Zhang et al. (2015)

Startups



The Deep Learning Market Map