# Distributed word representations: word-sense disambiguation

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CS 244U: Natural language understanding





## The challenge

- $d_1$  The crane is a bird.
- $d_2$  The crane is a bird that can fly.
- $d_3$  The crane is a tall bird that can fly.
- d<sub>4</sub> The crane is a tall piece of equipment that can hoist.
- d<sub>5</sub> The crane is equipment that can hoist tall things.
- d<sub>6</sub> The crane is equipment

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	$d_1$	$d_2$	<b>d</b> <sub>3</sub>	$d_4$	$d_5$	$d_6$
crane	1	1	1	1	1	1
bird	1	1	1	0	0	0
fly	0	1	1	0	0	0
equipment	0	0	0	1	1	1
hoist	0	0	0	1	1	0
tall	0	0	1	1	1	0

## The method

	$d_1$	$d_2$	$d_3$	$d_4$	$d_5$	$d_6$
crane	1	1	1	1	1	1
bird	1	1	1	0	0	C
fly	0	1	1	0	0	C
equipment	0	0	0	1	1	1
hoist	0	0	0	1	1	C
tall	0	0	1	1	1	C

	$d_1$	$d_2$	$d_3$	$d_4$	$d_5$	$d_6$
crane	1	1	1	1	1	1
bird	1	1	1	0	0	0
fly	0	1	1	0	0	0
equipment	0	0	0	1	1	1
hoist	0	0	0	1	1	0
tall	0	0	1	1	1	0

	$d_1$	d <sub>2</sub>	d <sub>3</sub>	d <sub>4</sub>	$d_5$	<i>d</i> <sub>6</sub>
crane	1	1	1	1	1	1
bird	1	1	1	0	0	0
fly	0	1	1	0	0	0
equipment	0	0	0	1	1	1
hoist	0	0	0	1	1	0
tall	0	0	1	1	1	0
	$d_1$	$d_2$	d <sub>3</sub>	$d_4$	d <sub>5</sub>	<b>d</b> 6
crane	. 1	1	1	0	0	0
crane <sub>1</sub>		0	0	1	1	1
crane <sub>1</sub> bird <sub>0</sub>	0	0	-		-	

	d <sub>1</sub>	d <sub>2</sub>	d <sub>3</sub>	d <sub>4</sub>	<b>d</b> 5	d <sub>6</sub>
crane	1	1	1	1	1	1
bird	1	1	1	0	0	0
fly	0	1	1	0	0	0
equipment	0	0	0	1	1	1
hoist	0	0	0	1	1	0
tall	0	0	1	1	1	0
	d <sub>1</sub>	d	2 d3	3 d <sub>4</sub>	. d <sub>5</sub>	$d_6$
crane	, 1	1	1	C	0	0
crane <sub>1</sub>	0	(	) (	) 1	1	1
birdo	, 1	(	) (	) (	0	0
bird <sub>1</sub>	0	) 1	1	0	0	0
flyo	0	) 1		) (	0	0
fly <sub>1</sub>		(	) 1	0	0	0
equipment <sub>0</sub>	0	(	) (	) 1	1	0
equipment <sub>1</sub>	0	(	) (	) (	0	1

hoist<sub>0</sub> hoist<sub>1</sub>

 $tall_0$  0  $tall_1$  0  $tall_2$  0

crane <sub>0</sub>	
bird <sub>1</sub>	0.18
bird <sub>0</sub>	0.42
$fly_0$	0.42
fly <sub>1</sub>	0.42
tall <sub>0</sub>	0.42
crane <sub>1</sub> equipment <sub>0</sub> equipment <sub>1</sub> hoist <sub>0</sub> hoist <sub>1</sub> tall <sub>1</sub>	1.0 1.0 1.0 1.0 1.0
tall <sub>2</sub>	1.0

equipment<sub>1</sub> hoist<sub>0</sub>

hoist<sub>1</sub>

 $tall_1$  $tall_2$ 

 $tall_0$  0

	~ 1		~3		<u>~</u> 5	
crane	1	1	1	1	1	1
bird	1	1	1	0	0	0
fly	0	1	1	0	0	0
equipment	0	0	0	1	1	1
hoist	0	0	0	1	1	0
tall	0	0	1	1	1	0
	d <sub>1</sub>	d <sub>2</sub>	d;	3 d.	4 d	<sub>5</sub> d <sub>6</sub>
crane <sub>0</sub>	, 1	1	-	1 (	) C	0 0
crane <sub>1</sub>	0	(	) (	) .	1 '	1 1
bird <sub>0</sub>	, 1	C	) (	) (	) (	0 0
bird <sub>1</sub>	0	1	-	1 (	) (	0 0
flyo	0	1	(	) (	) (	0 0
fly <sub>1</sub>	0	(	) -	1 (	) (	0 0
equipment <sub>0</sub>	, 0	(	) (	) .	1 '	1 0

d1 d2 d3 d4 d5 d6

0

0

0

crane <sub>0</sub>	
bird <sub>1</sub>	0.18
bird <sub>0</sub>	0.42
$fly_0$	0.42
fly <sub>1</sub>	0.42
tall <sub>0</sub>	0.42
crane <sub>1</sub>	1.0
equipment <sub>0</sub>	1.0
equipment <sub>1</sub>	1.0
hoist <sub>0</sub>	1.0
hoist <sub>1</sub>	1.0
tall <sub>1</sub>	1.0
tall <sub>2</sub>	1.0

crane <sub>1</sub>	
equipment <sub>0</sub>	0.18
equipment <sub>1</sub>	0.42
hoist <sub>0</sub>	0.42
hoist <sub>1</sub>	0.42
tall <sub>1</sub>	0.42
tall <sub>2</sub>	0.42
bird <sub>0</sub>	1.0
bird <sub>1</sub>	1.0
crane <sub>0</sub>	1.0
fly <sub>0</sub>	1.0
fly <sub>1</sub>	1.0
tall <sub>0</sub>	1.0

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- The clustering algorithm
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- Huang, Eric; Richard Socher; Christopher D. Manning, and Andrew Y. Ng. 2012. Improving word representations via global context and multiple word prototypes. *Proceedings of ACL*, 873–882.