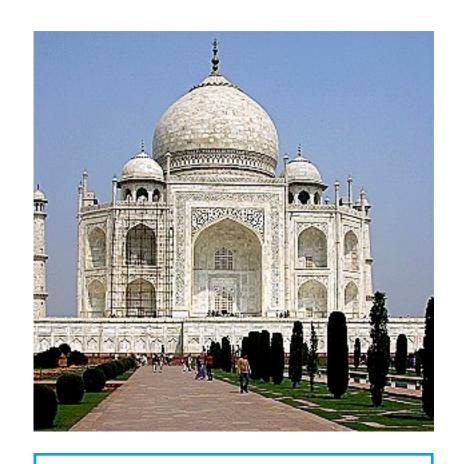
ICT이노베이션스퀘어 AI복합교육 고급 언어과정

자연어처리를 위한 CNN (Convolution Neural Network)

현청천

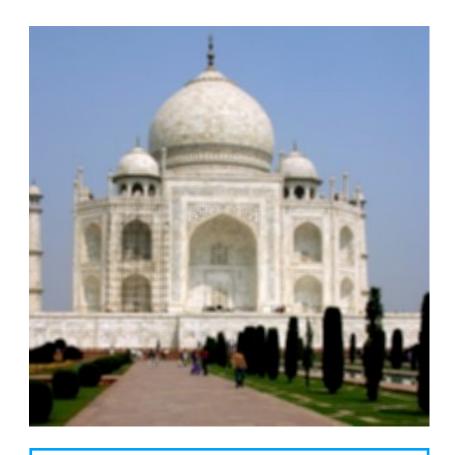
2021.04.19

Conv2D



Sharpen

0	0	0	0	0
0	0	-1	0	0
0	-1	5	-1	0
0	0	-1	0	0
0	0	0	0	0

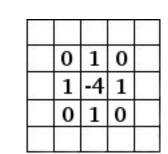


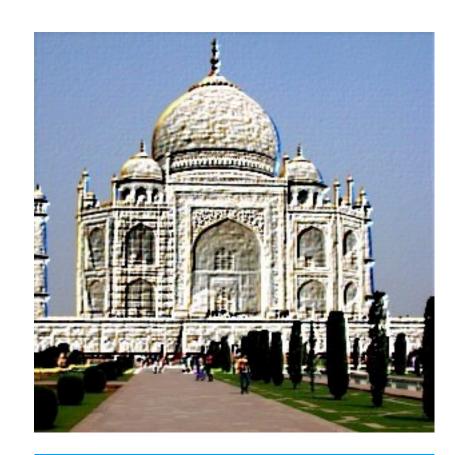
Blur

0	0	0	0	0
0	1	1	1	0
0	1	1	1	0
0	1	1	1	0
0	0	0	0	0



Edge Detect





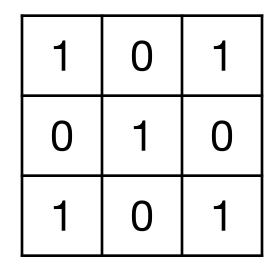
Emboss

3-3		2-1		
	-2	-1	0	
	-1	1	1	
	0	1	2	
3-3	-	2-3	-	

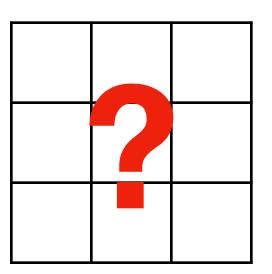
Convolution Filter를 이용하여 이미지의 특징을 다양하게 추출 가능

1	0	1	2	0
0	1	1	0	1
1	0	2	1	1
1	2	1	0	0
1	1	0	2	2

Image



Filter (3x3)



Feature

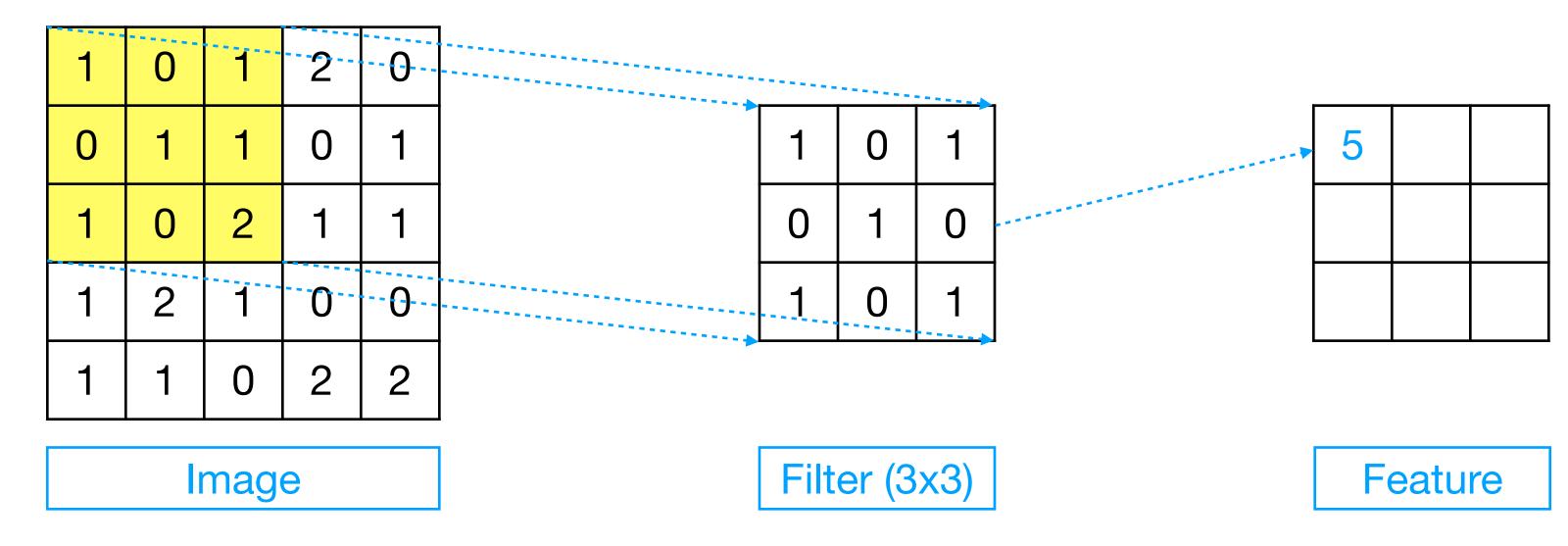
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$$(1 \times 1) + (0 \times 0) + (1 \times 1)$$

$$+(0 \times 0) + (1 \times 1) + (1 \times 0)$$

$$+(1 \times 1) + (0 \times 0) + (2 \times 1)$$

$$= 5$$



$$(2 \times 1) + (1 \times 0) + (1 \times 1)$$

$$+(1 \times 0) + (0 \times 1) + (0 \times 0)$$

$$+(0 \times 1) + (2 \times 0) + (2 \times 1)$$

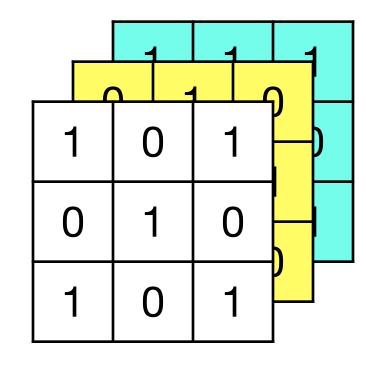
$$= 5$$

1	0	1	2	0						
0	1	1	0	1	 	0	1	5	4	3
1	0	2	1	1	0	1	0	 3	5	4
1	2	1	0	0	1	0	1	6	5	5
1	1	0	2	2	 					
	li	mag	е		Filt	er (3	x3)	F	eatu	re

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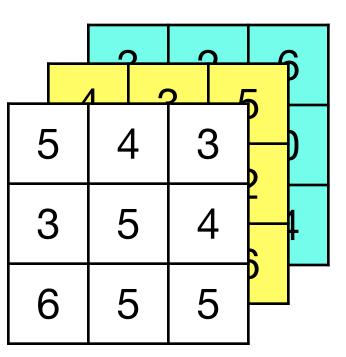
1	0	1	2	0
0	1	1	0	1
1	0	2	1	1
1	2	1	0	0
1	1	0	2	2

Image



Filter (3x3)

Filter 개수 3



Feature

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Conv2D (Max Pooling)

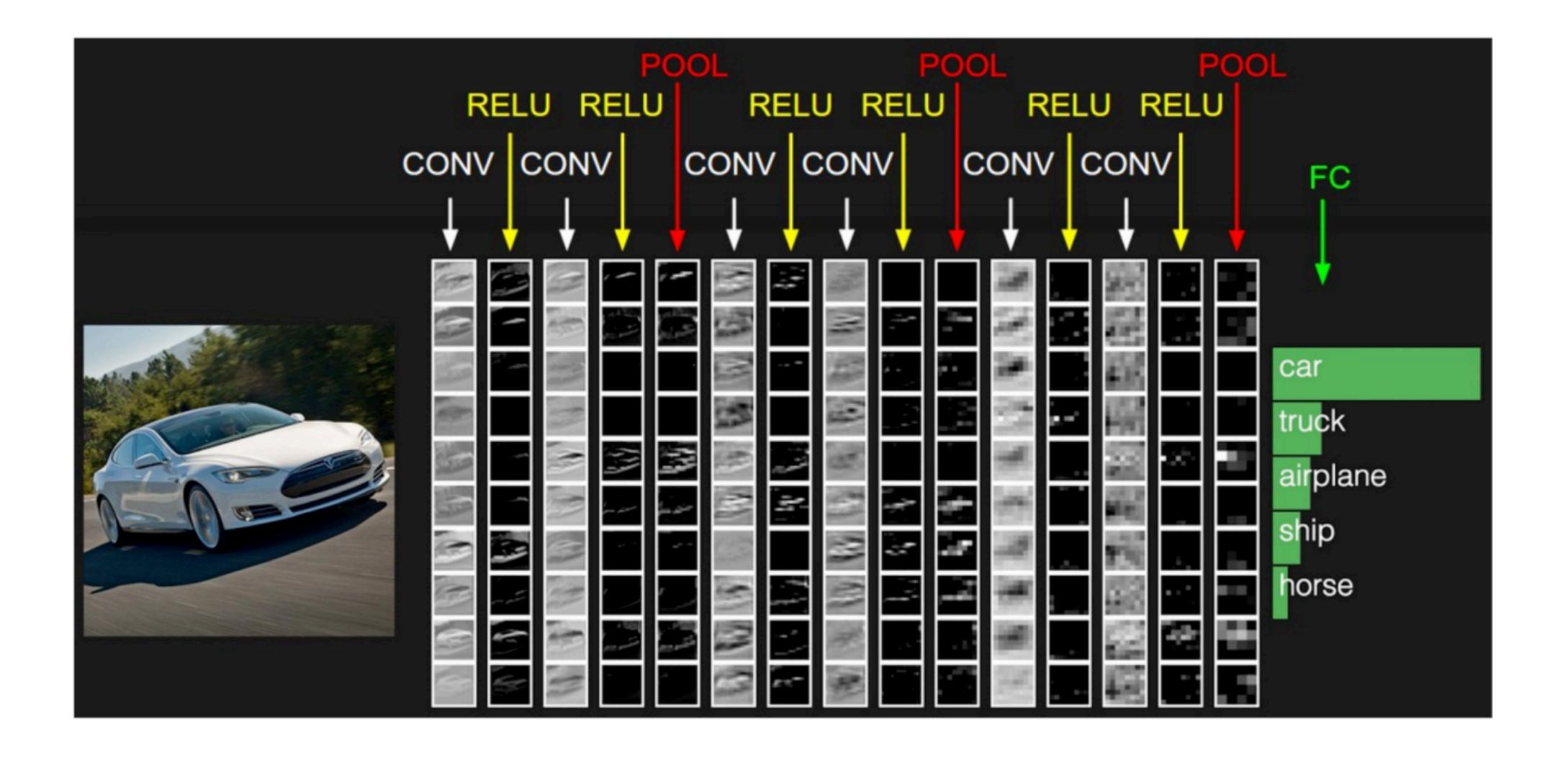
1	1	2	5
7	6	3	2
3	4	1	0
1	2	2	6

Filter (2x2) Stride 2

7	5
4	6

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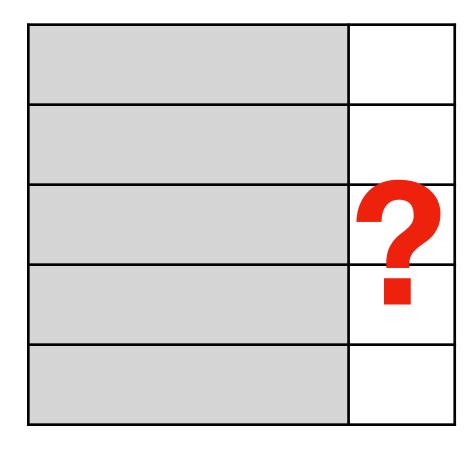
Conv2D (Inference)



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이순신은	0.2	0.1	-0.3	0.4
16세기	0.5	0.2	-0.3	-0.1
무신으로	-0.1	-0.3	-0.2	0.4
임진왜란	0.3	-0.3	0.1	0.1
당시	0.2	-0.3	0.4	0.2
조선	0.1	0.2	-0.1	-0.1
수군을	-0.4	-0.4	0.2	0.3

1	0	1	0
0	1	0	1
1	0	1	0



Word Embedding

Filter (3)

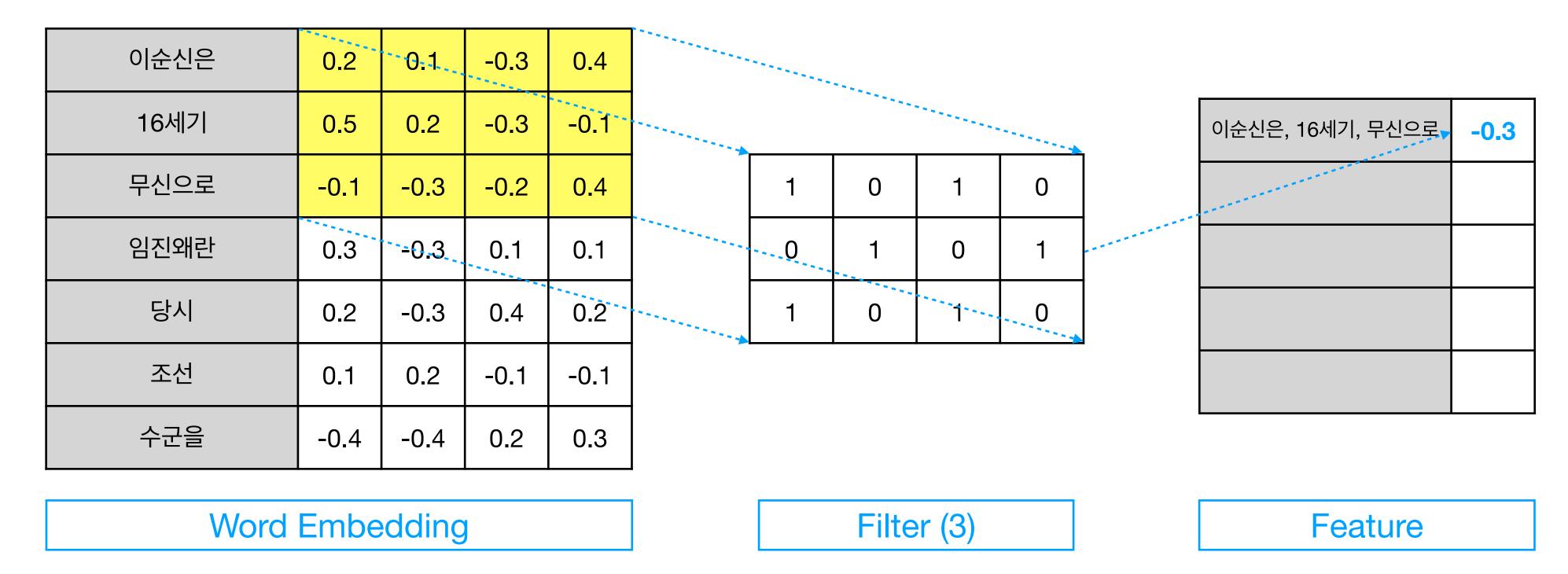
Feature

$$(0.2 \times 1) + (0.1 \times 0) + (-0.3 \times 1) + (0.4 \times 0)$$

$$+(0.5 \times 0) + (0.2 \times 1) + (-0.3 \times 0) + (-0.1 \times 1)$$

$$+(-0.1 \times 1) + (-0.3 \times 0) + (-0.2 \times 1) + (0.4 \times 0)$$

$$= -0.3$$



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$$(0.2 \times 1) + (-0.3 \times 0) + (0.4 \times 1) + (0.2 \times 0)$$

$$+(0.1 \times 0) + (0.2 \times 1) + (-0.1 \times 1) + (-0.1 \times 0)$$

$$+(-0.4 \times 1) + (-0.4 \times 0) + (0.2 \times 1) + (0.3 \times 0)$$

$$= 0.5$$

이순신은	0.2	0.1	-0.3	0.4
16세기	0.5	0.2	-0.3	-0.1
무신으로	-0.1	-0.3	-0.2	0.4
임진왜란	0.3	0.3	0.1	0.1
당시	0.2	-0.3	0.4	0.2
조선	0.1	0.2	-0.1	-0.1
수군을	-0.4	0.4	0.2	0.3

1	0	1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1	0
 0	1	0	1
1	0	1	0

이순신은, 16세기, 무신으로	-0.3
16세기, 무신으로, 임진왜란	0.7
무신으로, 임진왜란, 당시	0.1
임진왜란, 당시, 조선	0.3
당시, 조선, 수군을	0.5

Word Embedding

Filter (3)

Feature

이순신은	0.2	0.1	-0.3	0.4
16세기	0.5	0.2	-0.3	-0.1
무신으로	-0.1	-0.3	-0.2	0.4
임진왜란	0.3	-0.3	0.1	0.1
당시	0.2	-0.3	0.4	0.2
조선	0.1	0.2	-0.1	-0.1
수군을	-0.4	-0.4	0.2	0.3

이순신은, 16세기, 무신으로	-0.3	1.6	-1.0
16세기, 무신으로, 임진왜란	0.7	-0.1	0.8
무신으로, 임진왜란, 당시	0.1	0.3	0.3
임진왜란, 당시, 조선	0.3	0.1	1.2
당시, 조선, 수군을	0.5	0.6	0.9

Word Embedding

Filter (3)

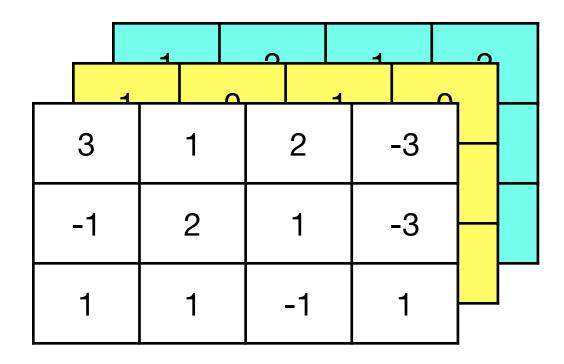
Filter 개수 3

Feature

Conv1D (Max Pooling)

이순신은	0.2	0.1	-0.3	0.4
16세기	0.5	0.2	-0.3	-0.1
무신으로	-0.1	-0.3	-0.2	0.4
임진왜란	0.3	-0.3	0.1	0.1
당시	0.2	-0.3	0.4	0.2
조선	0.1	0.2	-0.1	-0.1
수군을	-0.4	-0.4	0.2	0.3

Word Embedding



Filter (3)

Filter 개수 3

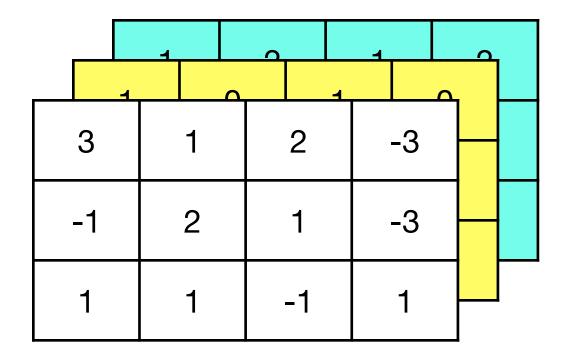
이순신은, 16세기, 무신으로	-0.3	1.6	-1.0	
16세기, 무신으로, 임진왜란	0.7	-0.1	0.8	
무신으로, 임진왜란, 당시	0.1	0.3	0.3	
임진왜란, 당시, 조선	0.3	0.1	1.2	
당시, 조선, 수군을	0.5	0.6	0.9	
Max Pooling	0.7	1.6	1.2	4

Feature max pooling

Conv1D (Avg Pooling)

이순신은	0.2	0.1	-0.3	0.4
16세기	0.5	0.2	-0.3	-0.1
무신으로	-0.1	-0.3	-0.2	0.4
임진왜란	0.3	-0.3	0.1	0.1
당시	0.2	-0.3	0.4	0.2
조선	0.1	0.2	-0.1	-0.1
수군을	-0.4	-0.4	0.2	0.3

Word Embedding



Filter (3)

Filter 개수 3

이순신은, 16세기, 무신으로	-0.3	1.6	-1.0	
16세기, 무신으로, 임진왜란	0.7	-0.1	0.8	
무신으로, 임진왜란, 당시	0.1	0.3	0.3	
임진왜란, 당시, 조선	0.3	0.1	1.2	
당시, 조선, 수군을	0.5	0.6	0.9	
Max Pooling	-1.0	0.5	-0.6	4

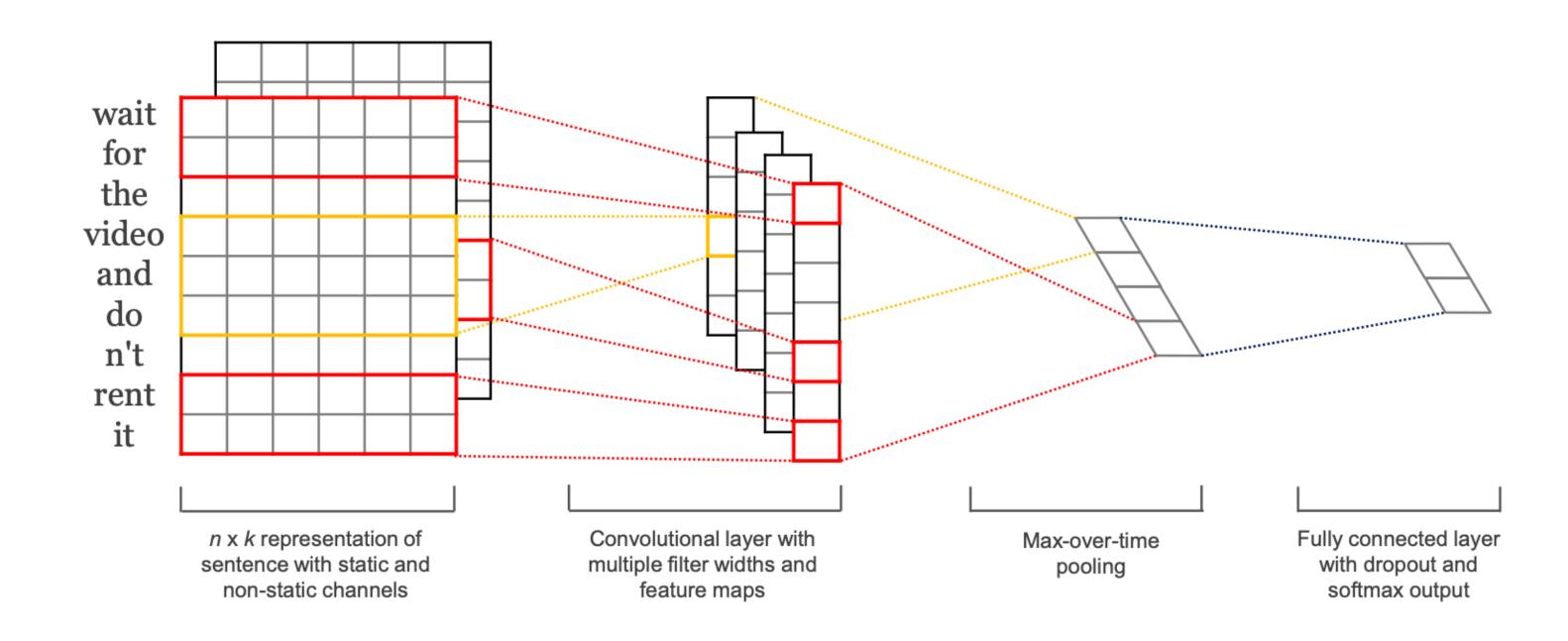
Feature avg pooling

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Conv1D

Convolutional Neural Networks for Sentence Classification

- Yoon kim (2014)
- CNN을 이용한 classification 모델
- 간단한 모델이면서도 좋은 성능을 냄



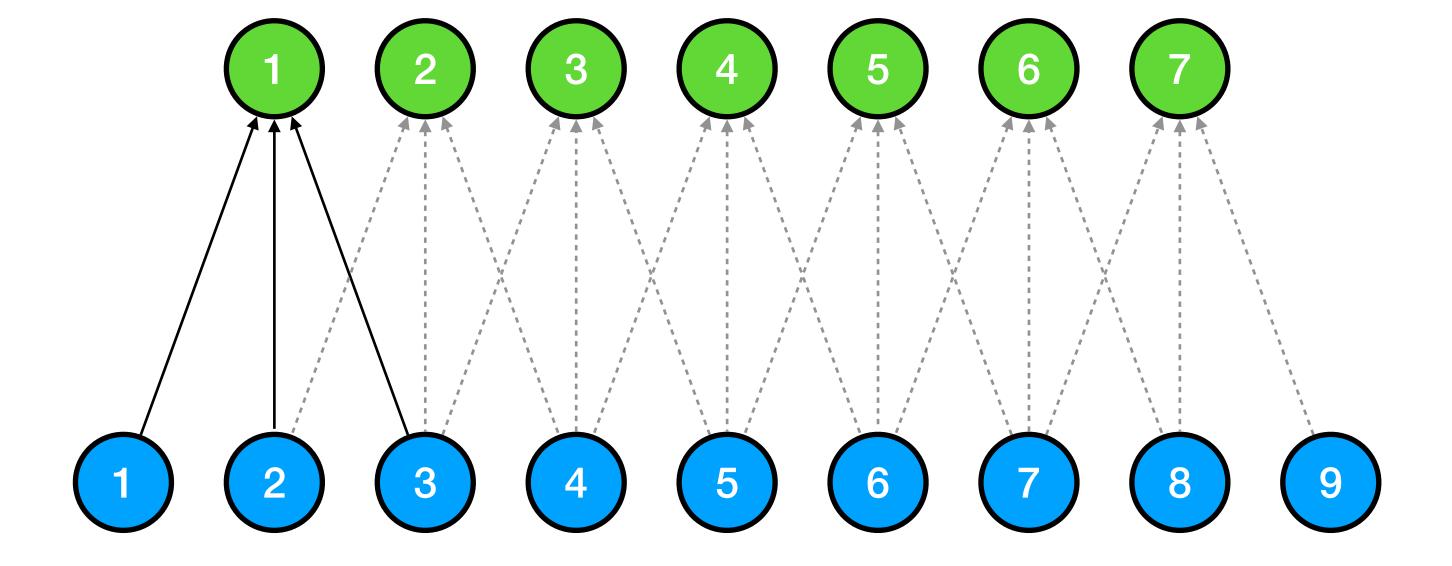
$$window = filter$$

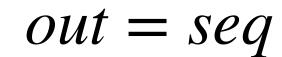
$$out = seq - window + 1$$

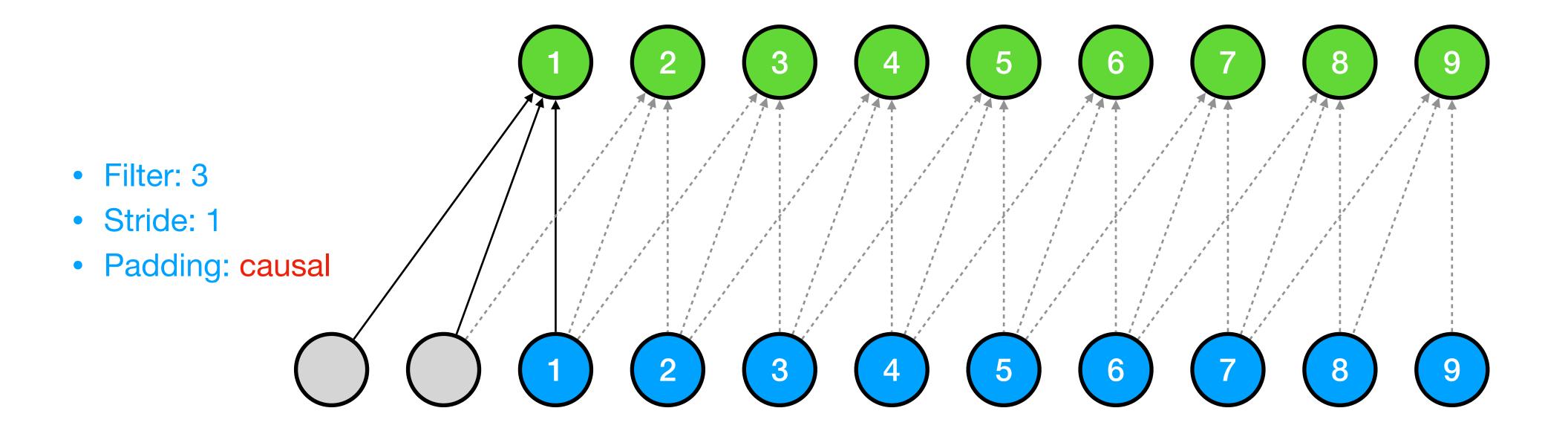
• Filter: 3

• Stride: 1

Padding: valid





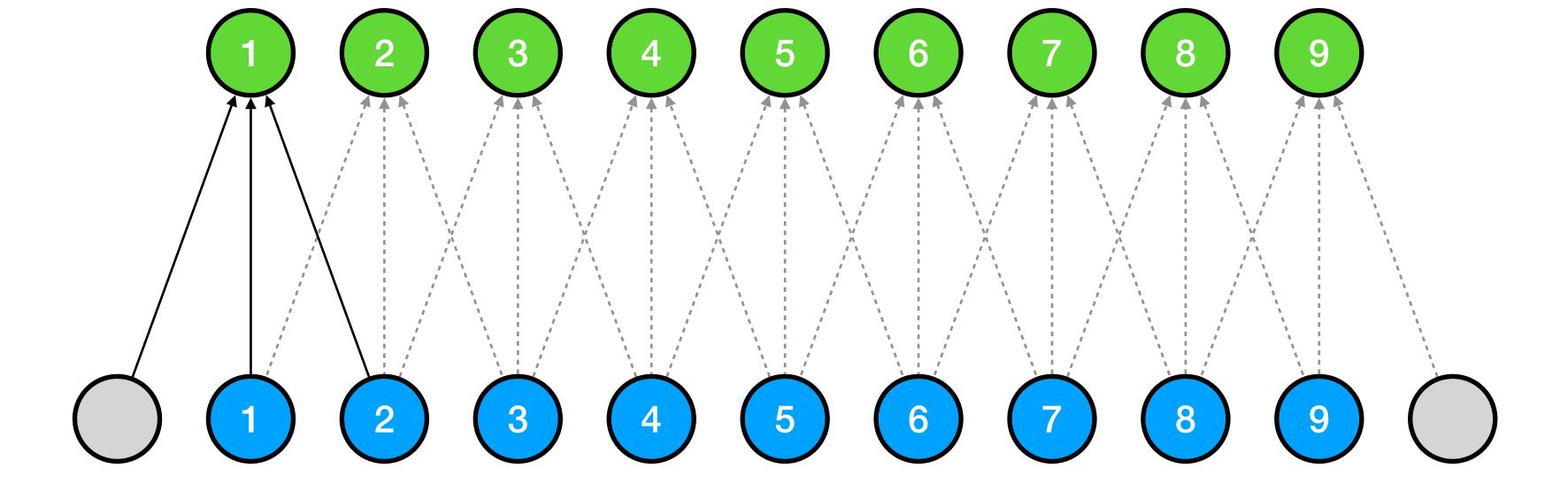


$$out = seq$$

• Filter: 3

• Stride: 1

Padding: same



$$window = filter + (filter - 1) \times (dilation - 1)$$

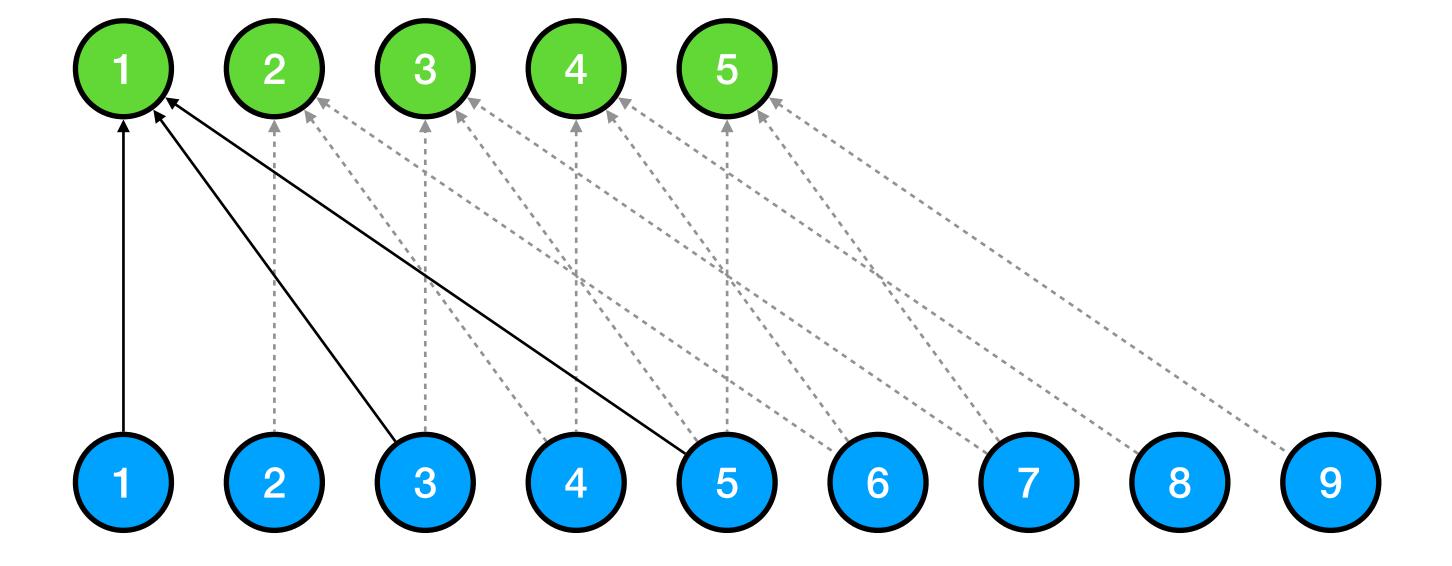
$$out = seq - window + 1$$

• Filter: 3

• Stride: 1

Padding: valid

• Dilation: 2



감사합니다.