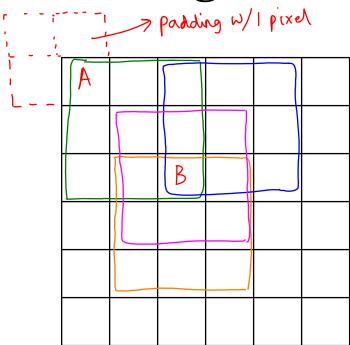


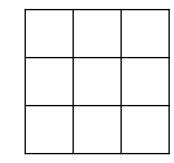
Convolutional Neural Networks

Padding

Padding

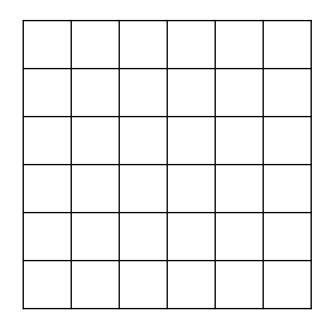


- 2 problems with convolution operations as we do it
- 1) If we have a NXN Image & a fxt filter, then resulting mage is (n-++1) x(n-++1) ie, (6x6) * (3x3) = (4x4)
 - If we do this again w/ the 3×3 filter, we get $(4\times4)\times(3\times3)=(2\times4)$ ie, (n-f+1) x(n-f+1), ie, our resulting Image in the layers Ahead will keep Shrinking, till we hit a Roadblock ie, (1×1) * (3×3) → Not



*

(v-t+1) = 0



2 Pixel A is only
part of 1 convolution,
while pixel B is part of many B, many more times than A In the Image Ahead

I way to some this is padding the Image with pixels or enample, p=1 gives $|p| \times (8 \times 8) \times (3 \times 3) = 6 \times 6$ padding \Rightarrow New Image becomes $(8 \times 8) \times (3 \times 3) = 6 \times 6$ (n+2p+1) $(n+2p \times n+2p) \times (f \times f) = 6$ Andrew For example, P=1 gives 1 pixel

Andrew Ng

Valid and Same convolutions

"Valid":
$$\Rightarrow (n-f+1) \times (n-f+1)$$

Pad so that output size is the same "Same": as the input size.

$$\Rightarrow x \times n = n + 2p - f + 1$$

$$\Rightarrow x + 2p - f + 1 = p$$

$$\Rightarrow f - 1 = p$$

$$\Rightarrow f - 1 = p$$

$$\Rightarrow x + 2p - f + 1 = p$$

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