

# Redes Neurais e Aprendizagem Profunda

## REDES NEURAIS CONVOLUCIONAIS

### CAMADA CONVOLUCIONAL

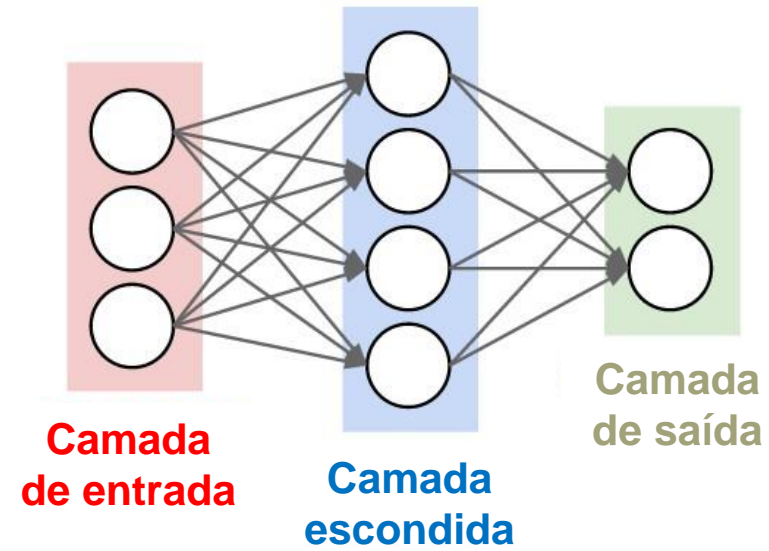
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# Camada Convolutucional

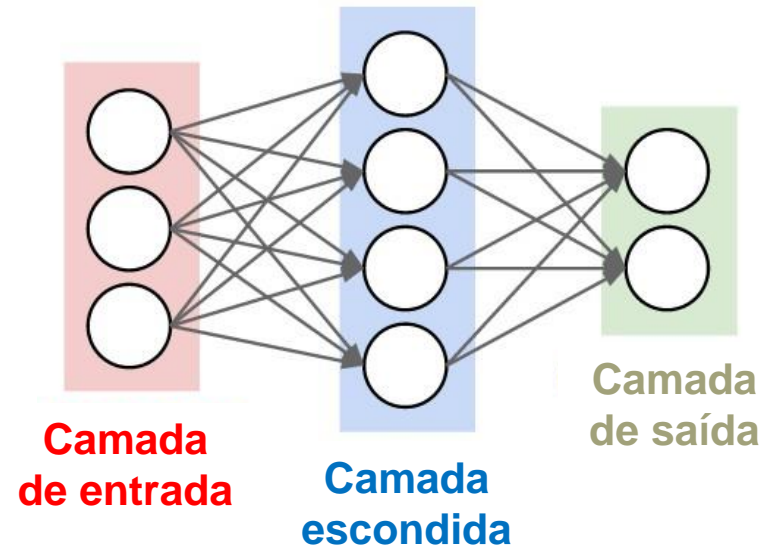
Antes:



Todos os filtros na mesma camada são os mesmos

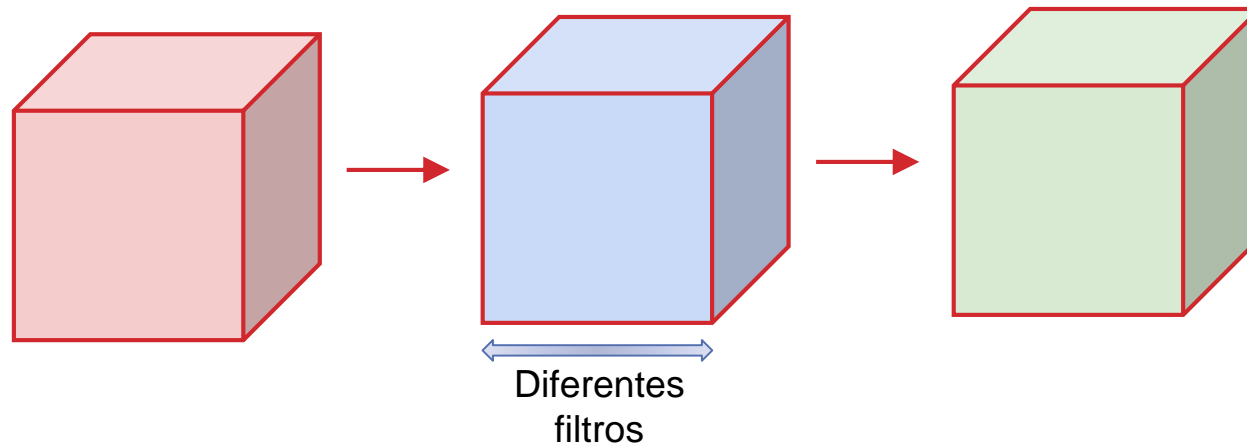
# Camada Convolutucional

Antes:



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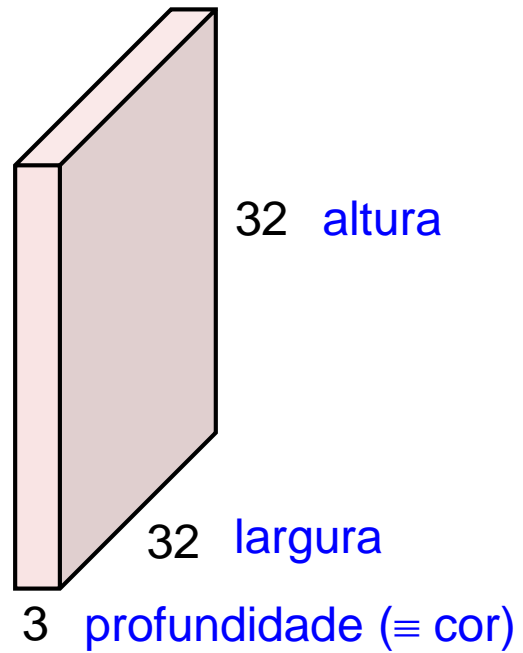
Agora:



A dimensão da profundidade representa filtros diferentes

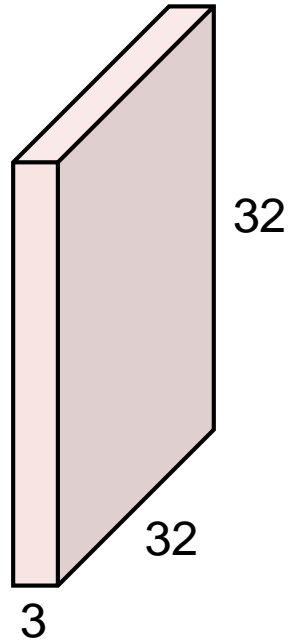
# Camada Convolutacional

Imagem  $32 \times 32 \times 3$



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Imagem  $32 \times 32 \times 3$

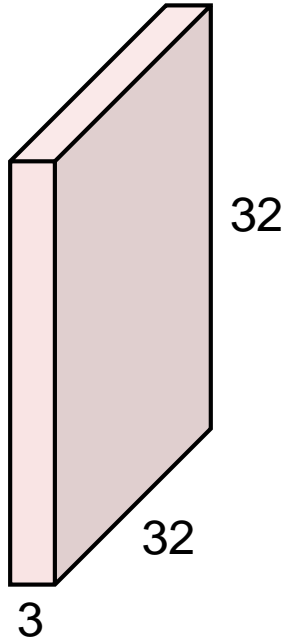


Filtro  $5 \times 5 \times 3$



# Camada Convolutacional

Imagem  $32 \times 32 \times 3$

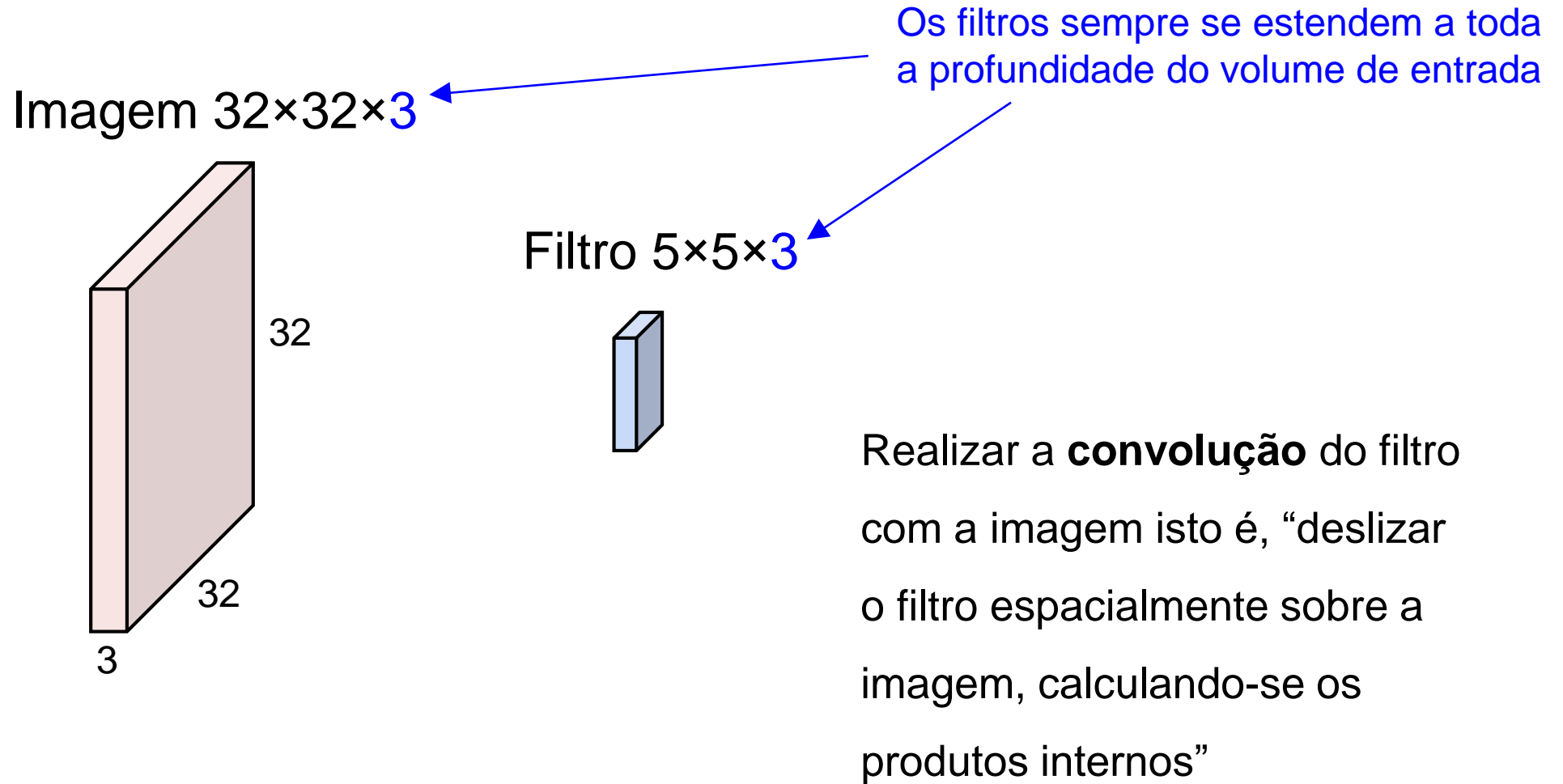


Filtro  $5 \times 5 \times 3$

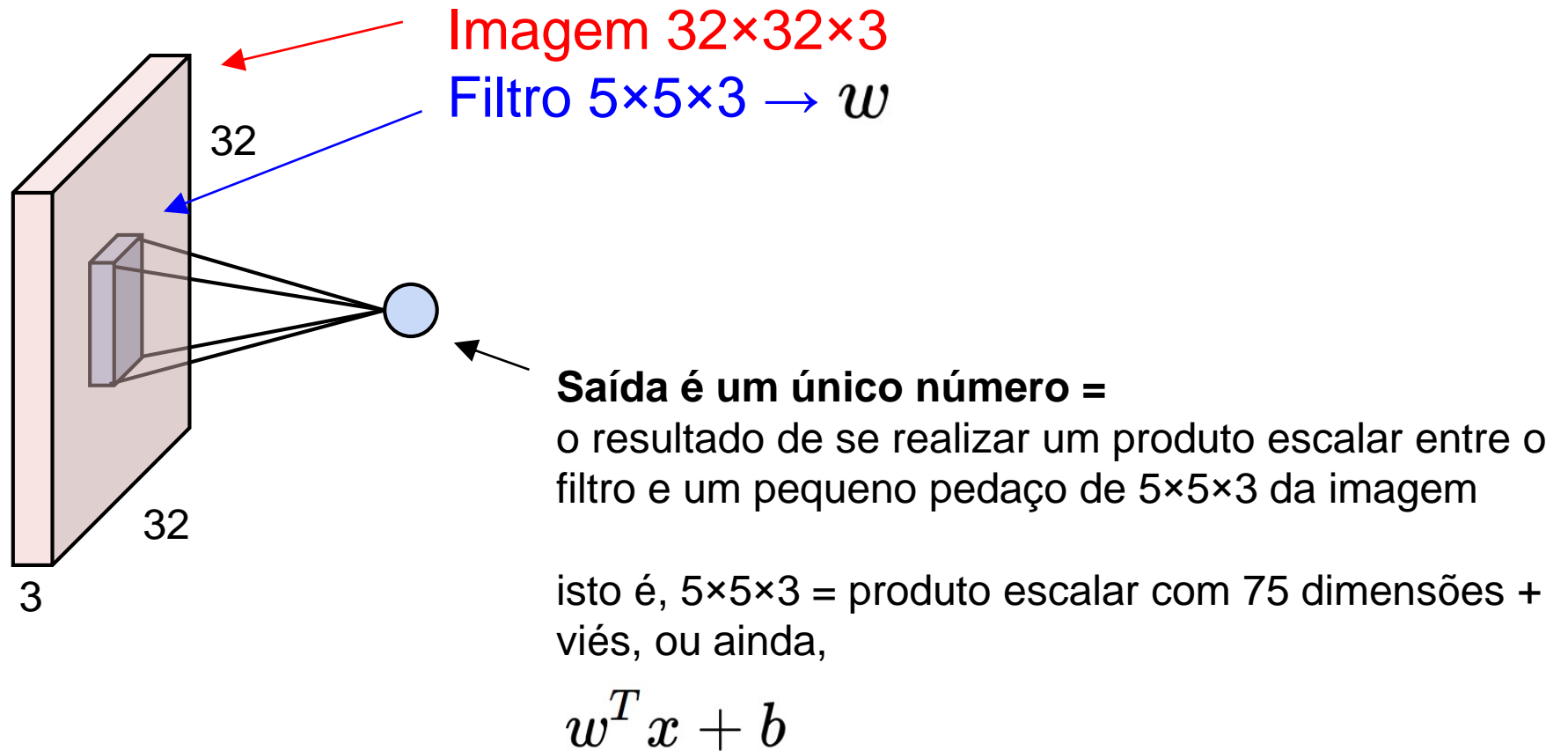


Realizar a **convolução** do filtro com a imagem isto é, “deslizar o filtro espacialmente sobre a imagem, calculando-se os produtos internos”

# Camada Convolutiva

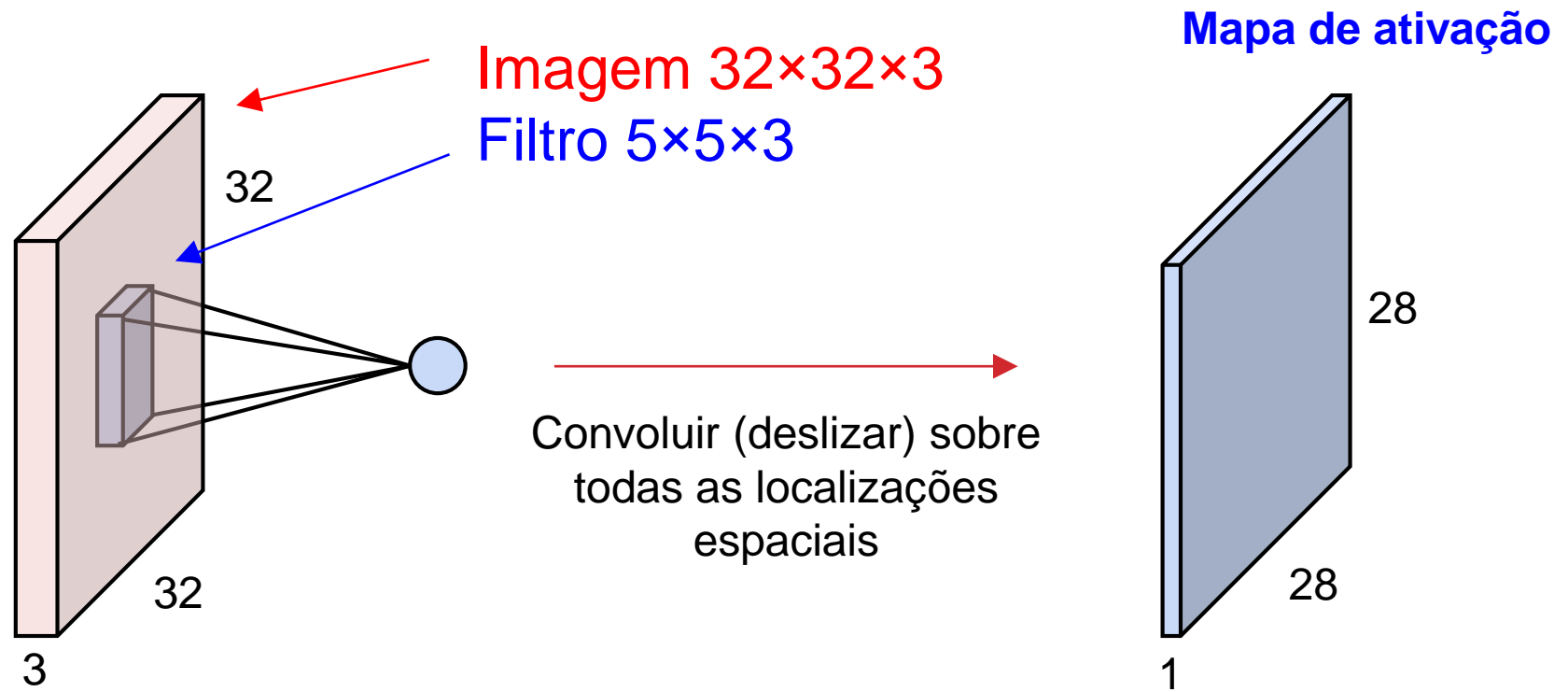


# Camada Convolutiva



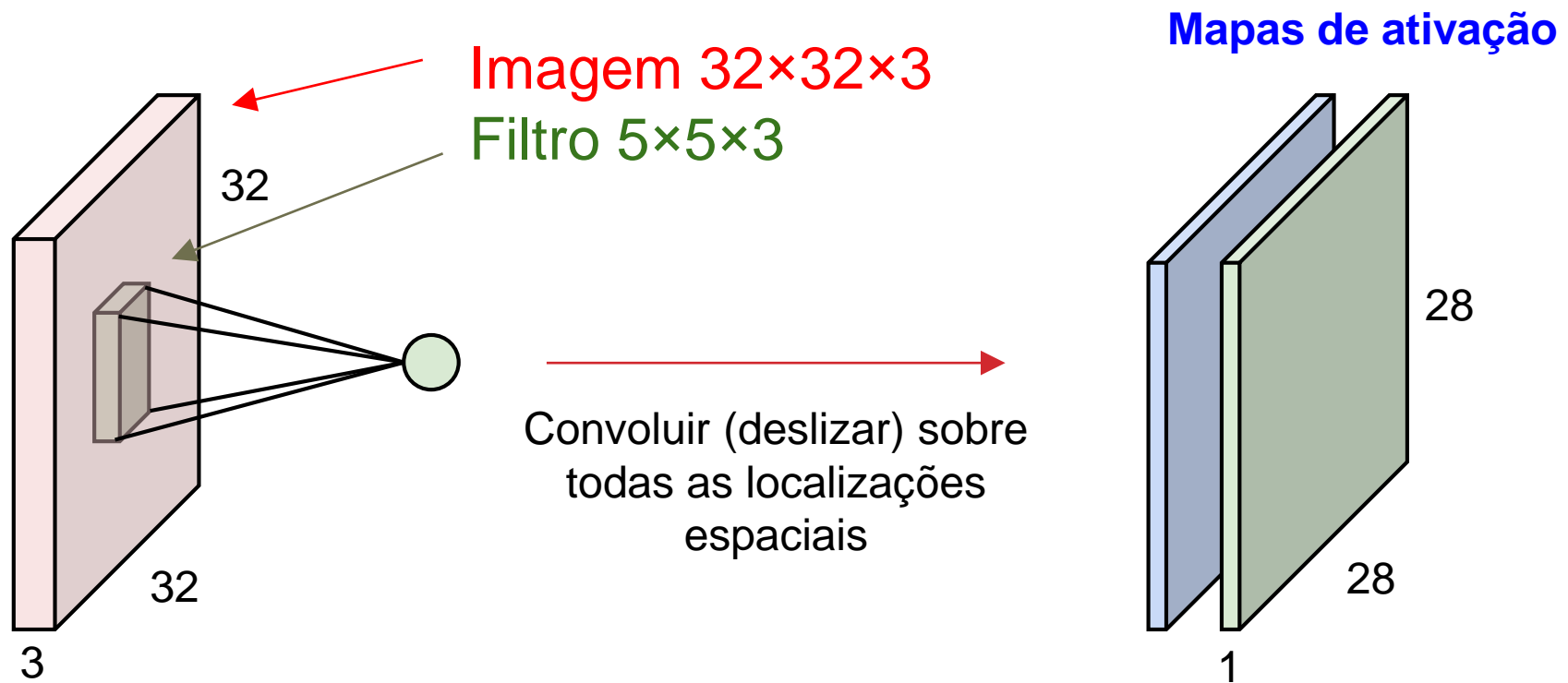


# Camada Convolutiva



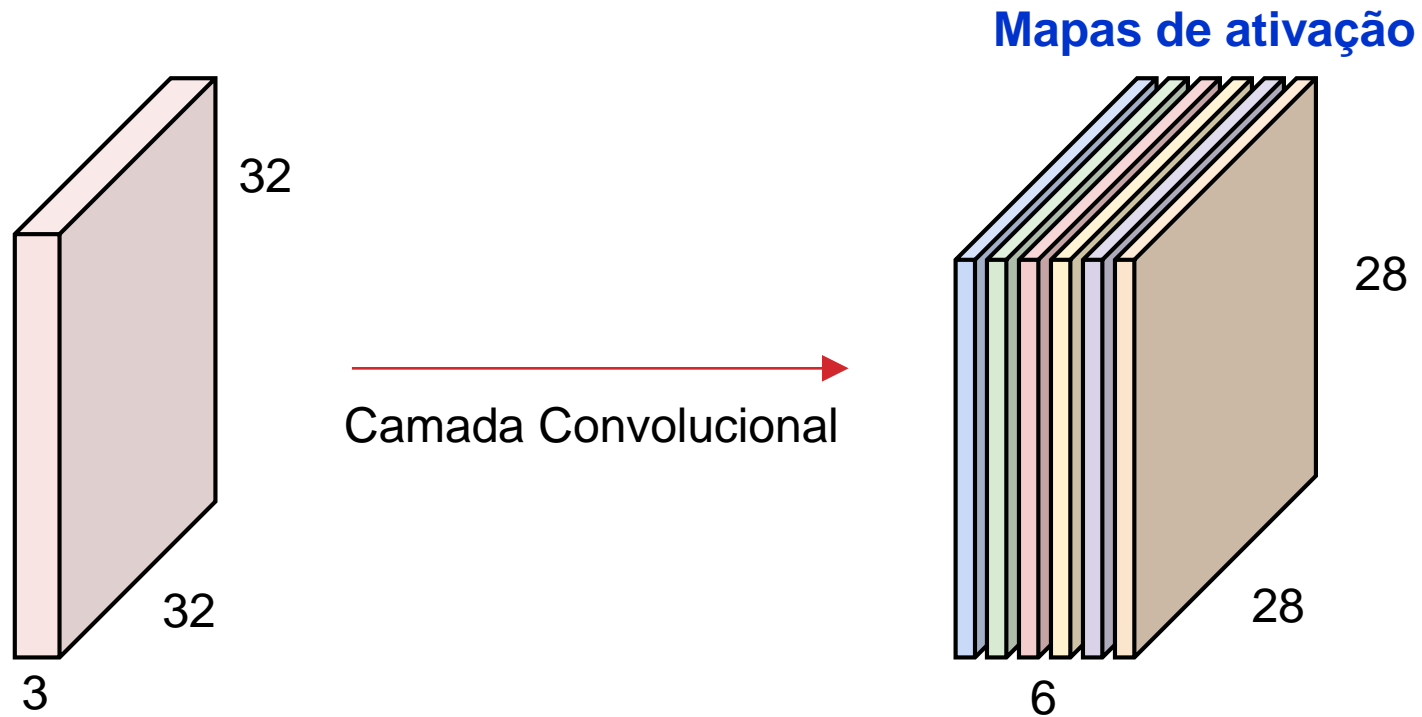
# Camada Convolucional

Considere um segundo filtro (em verde)



# Camada Convolutacional

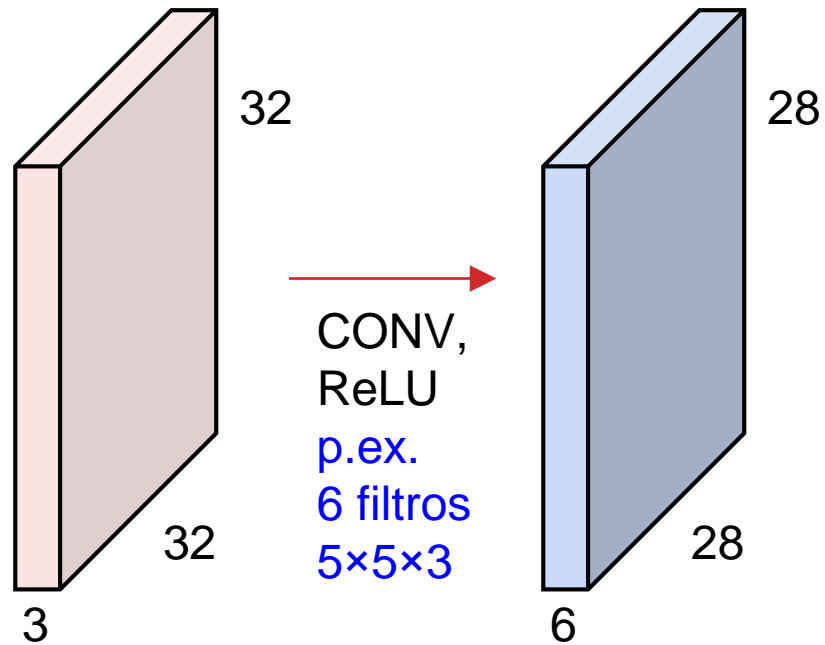
Por exemplo, se tivermos 6 filtros  $5 \times 5$ , obtém-se 6 mapas de ativação distintos



Esses mapas podem ser agrupados (ou empilhados) de forma a produzir uma “nova imagem” de tamanho  $28 \times 28 \times 6$ !

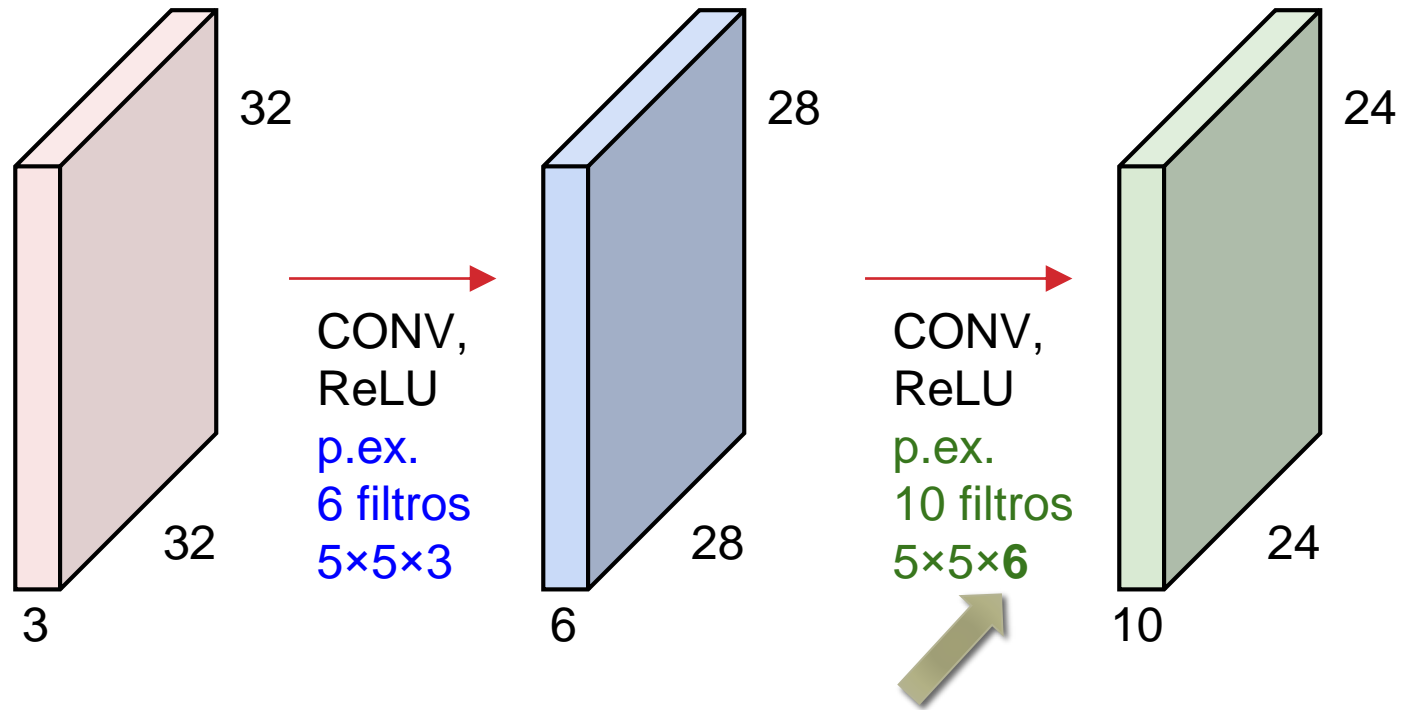
# Camada Convolutiva

Uma rede convolutiva (ConvNet) representa uma sequência de camadas convolucionais intercaladas com funções de ativação



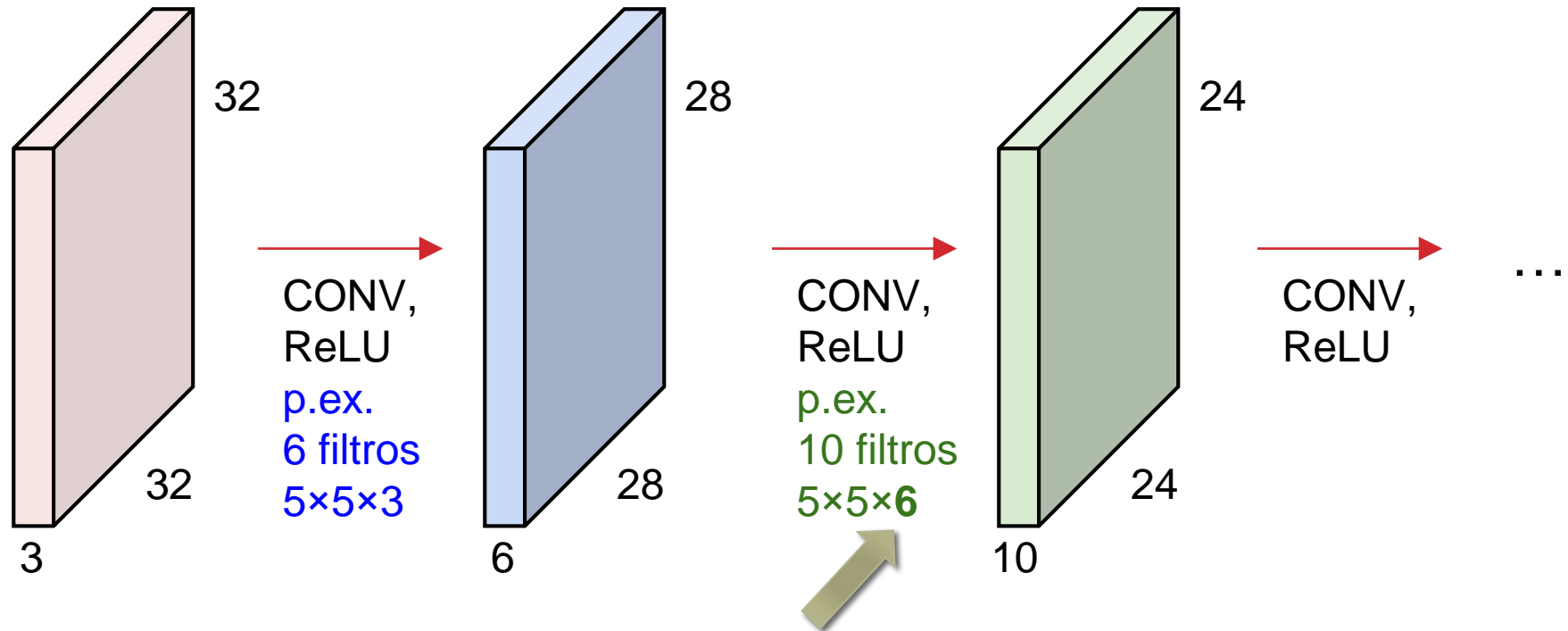
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# Camada Convolutiva

Uma rede convolucional (ConvNet) representa uma sequência de camadas convolucionais intercaladas com funções de ativação



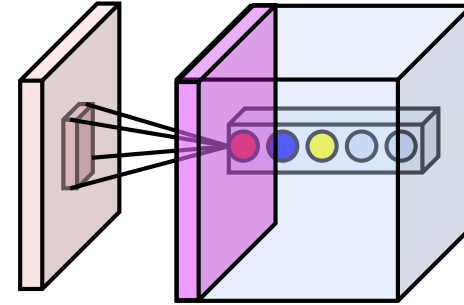
# Camada Convolutiva

Entrada:



# Camada Convolutiva

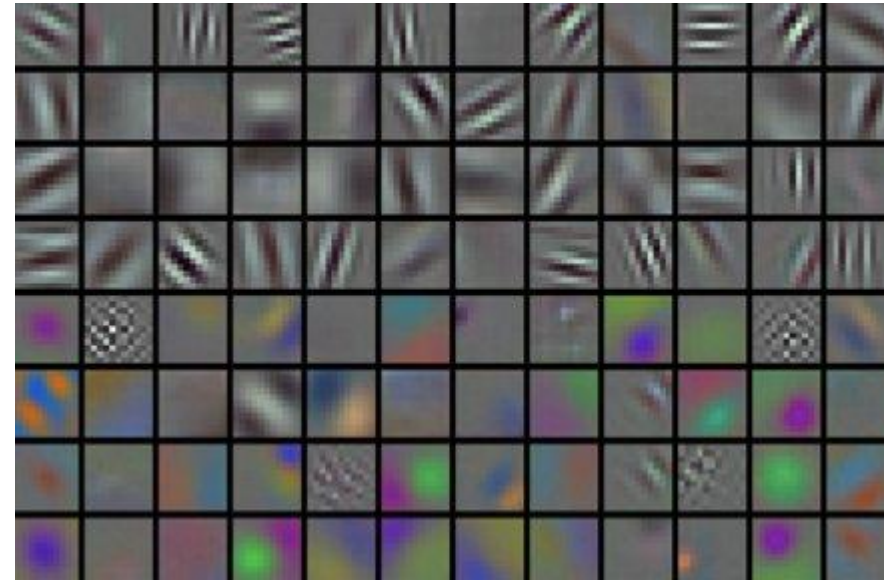
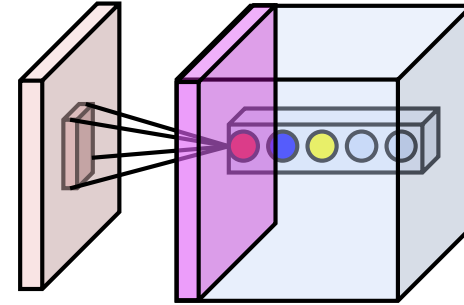
Entrada:





# Camada Convolutucional

Entrada:

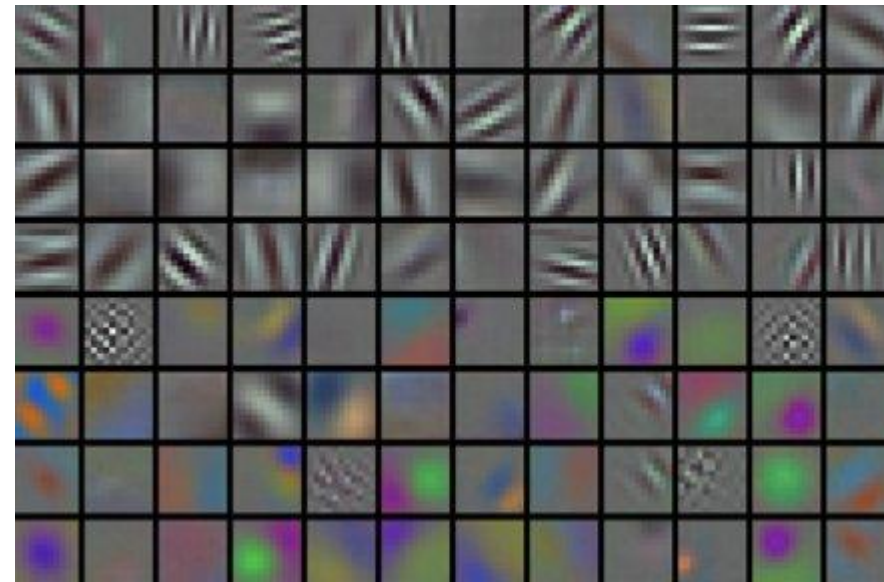
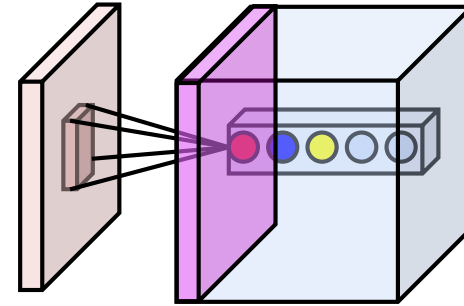
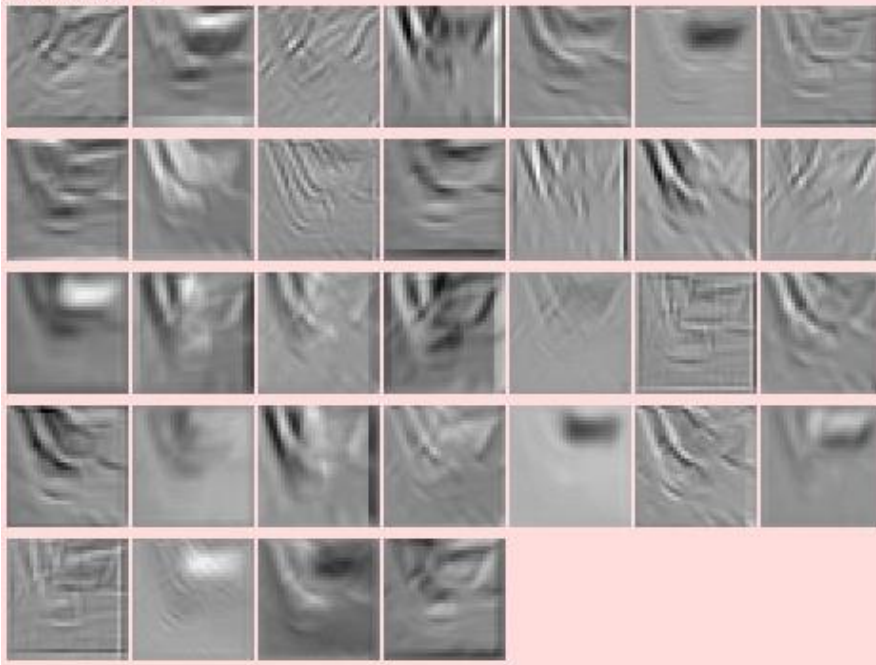


# Camada Convolutucional

Entrada:



Ativações:

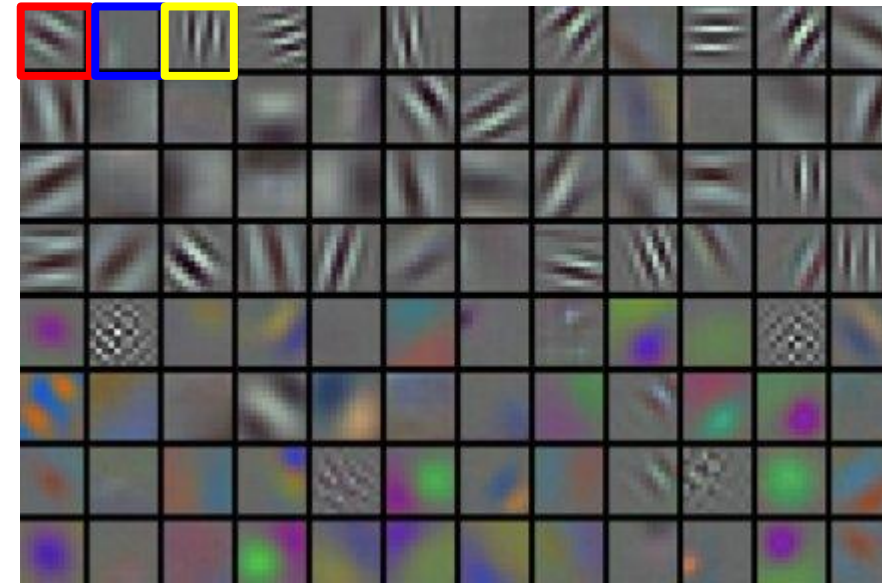
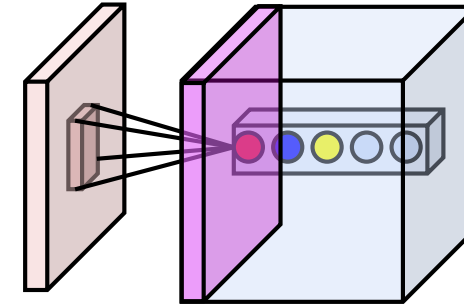
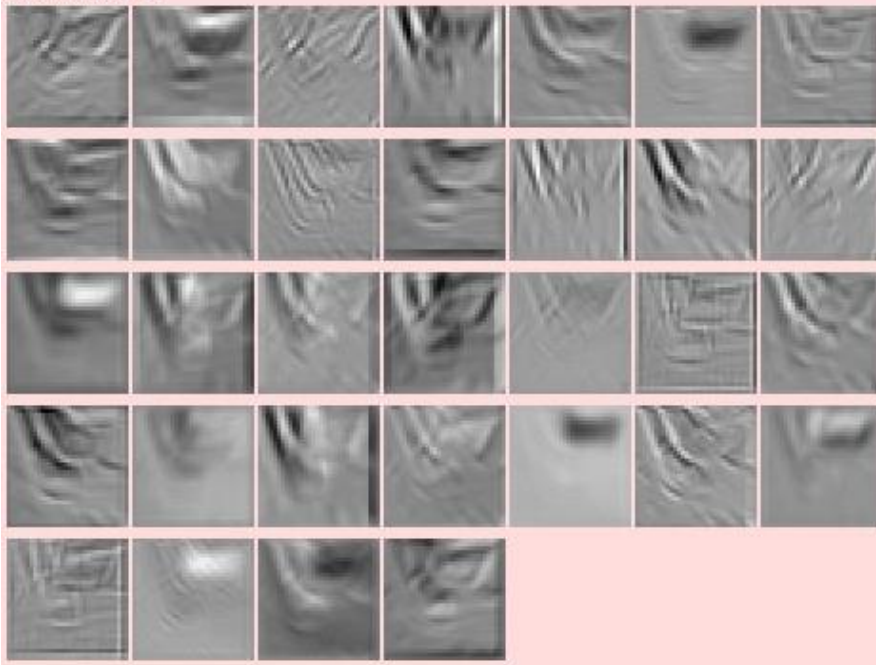


# Camada Convolutucional

Entrada:



Ativações:

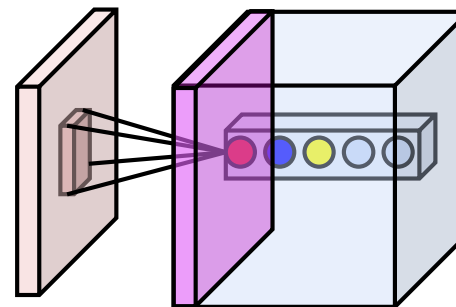


# Camada Convolutucional

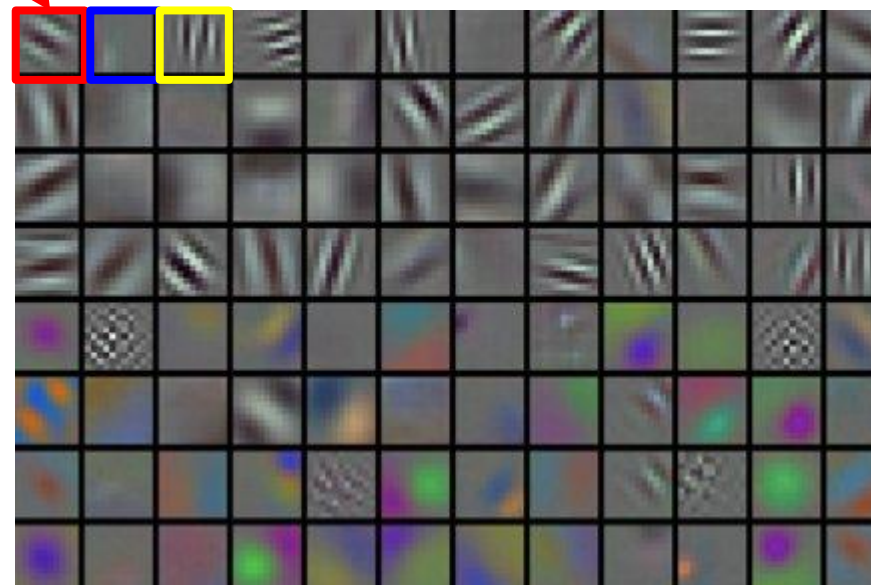
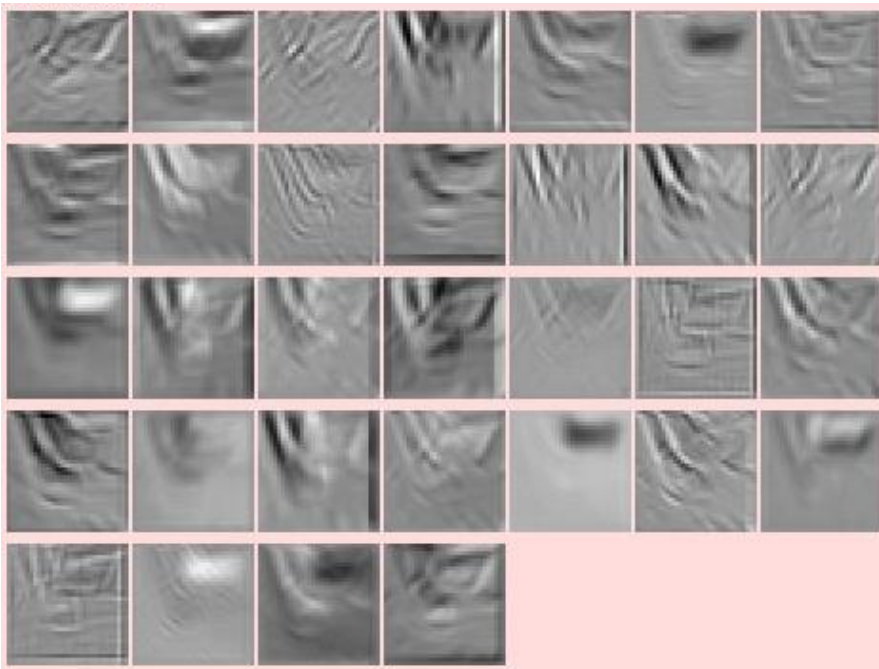
Entrada:



convoluir o primeiro **filtro** na entrada resulta na primeira fatia do volume de saída



Ativações:



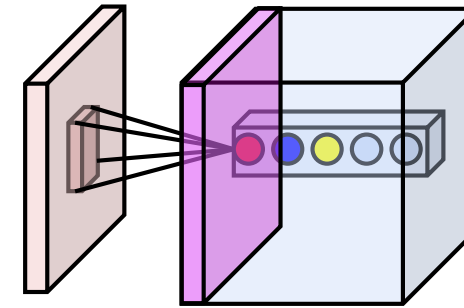


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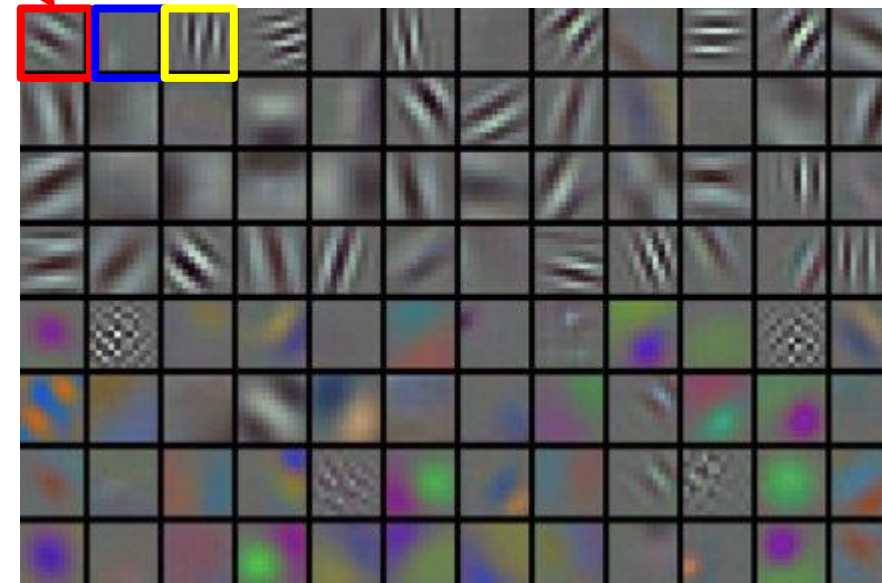
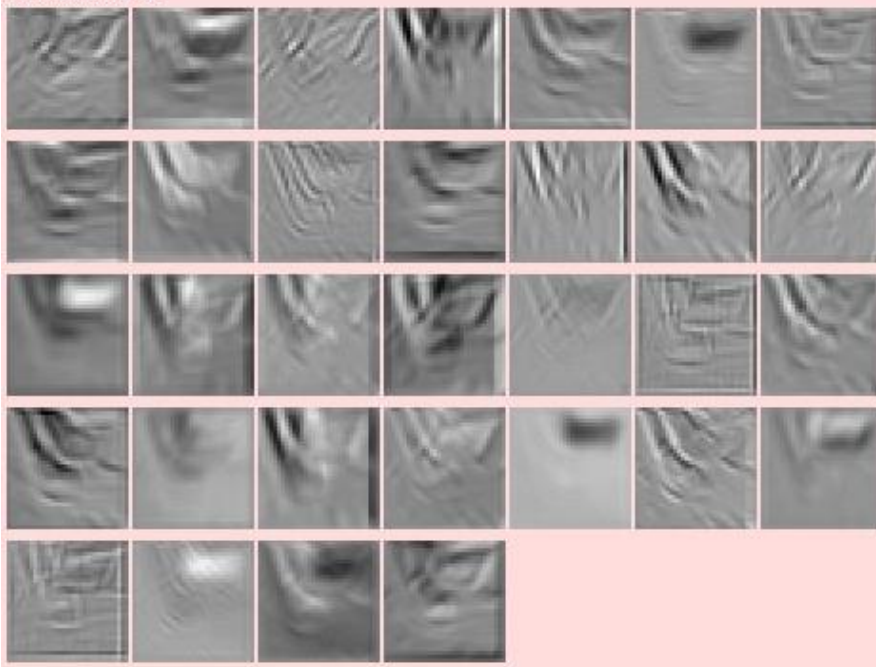
Entrada:



convoluir o primeiro **filtro** na **entrada** resulta na primeira fatia do volume de saída



Ativações:

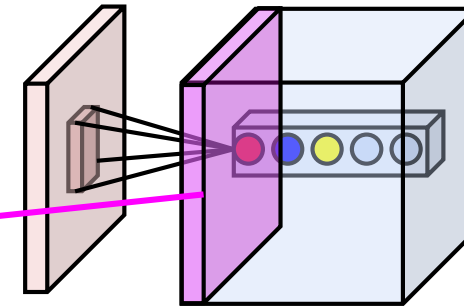


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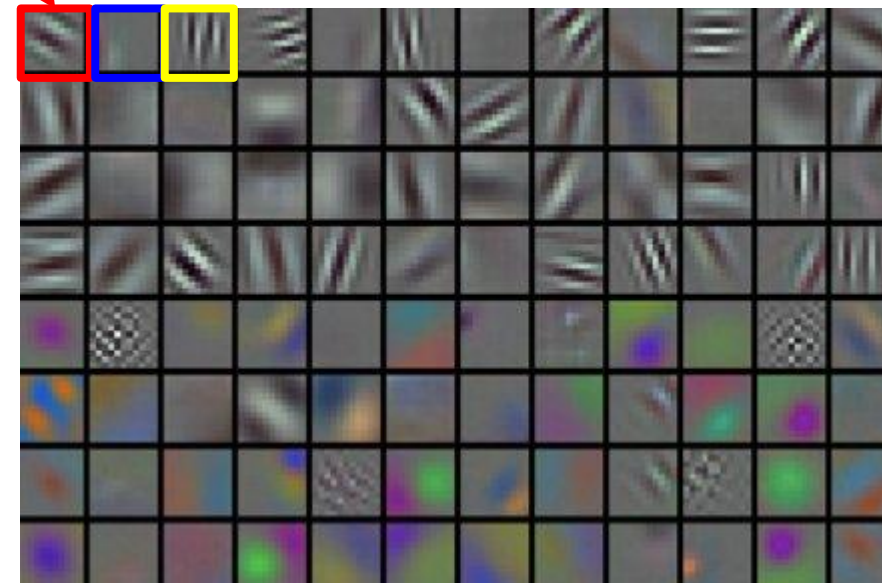
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convoluir o primeiro filtro na entrada resulta na primeira fatia do volume de saída



Ativações:



# Camada Convolutucional

