Network Analysis for Explanation

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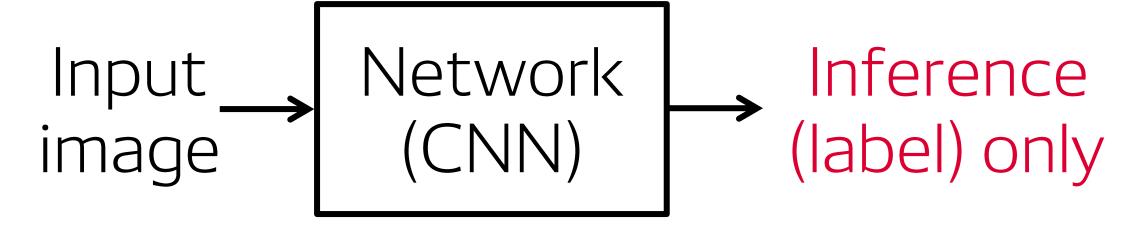
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Abstract

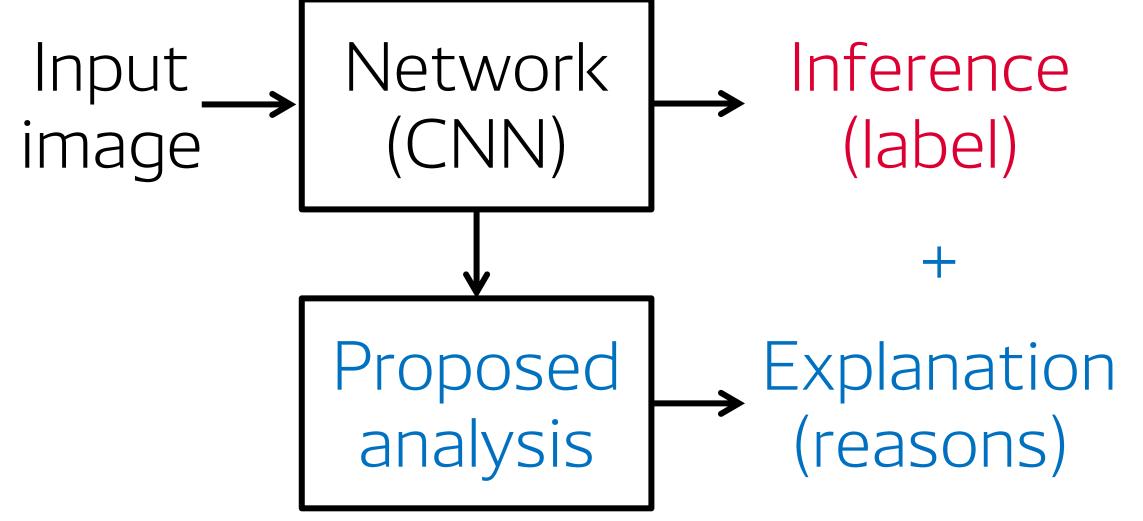
We analyzed a trained network to extract features which mainly contribute the inference. Based on the analysis, we developed a simple solution to generate explanations of the inference processes.

Network inference only

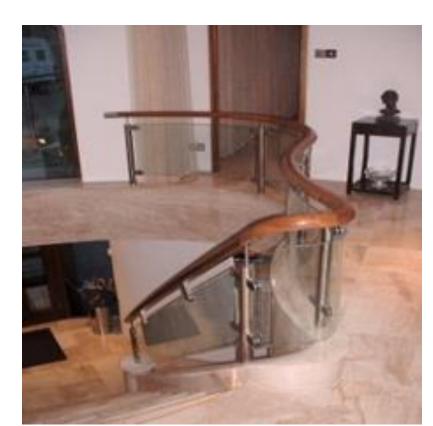


Network inference

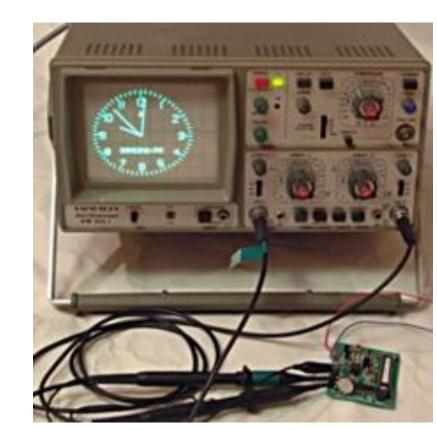
with proposed analysis



Results



This is bannister (obstruction), because 1) it has fine lattice patterns, thin rods, fine horizontal / vertical lines or rectangle lattice patterns; 2) it has fine lines; 3) it has square or square windows.



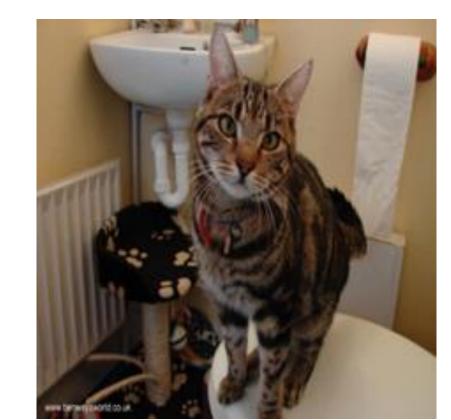
This is cassette player 1) it has rounded; 2) it has accumulated fine boxes/circles or rubber tires; 3) it has rubber tires or square windows.



This is ambulance (motor vehicle), because 1) it has rubber tires or heads of birds; 2) it has accumulated fine boxes/circles, large characters or two-tone red/white; 3) it has faces of black dogs or black square windows.



This is cassette player (electronic equipment), because (electronic equipment), because 1) it has rubber tires or rounded; 2) it has faces of small rounded or green. animals or fine square patterns; 3) it has rounded.



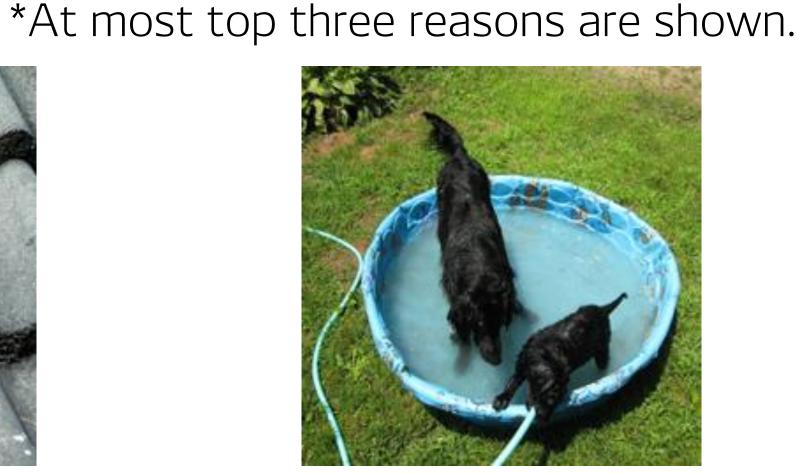
This is tabby (feline), because 1) it has leopard patterns, faces of small animals, furs or twotone brown/white; 2) it has animals, furs or two-tone black/brown; 3) it has furs or two-tone black/gray.



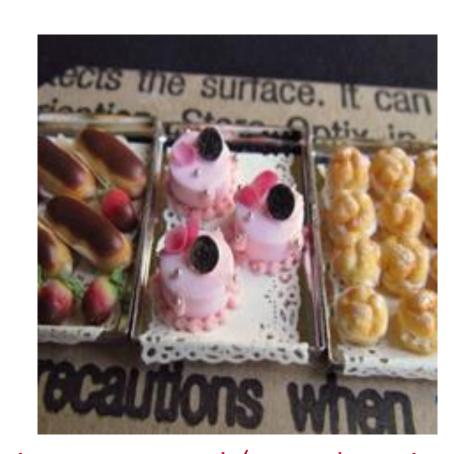
This is Granny Smith (natural object), because 1) it has rounded or green; 2) it has



This is thunder snake (snake), because 1) it has squiggle; 2) it has squiggle or standing ears of dogs and cats.



This is drake (aquatic bird), because 1) it has accumulated fine boxes/circles, green or blue; 2) It has rounded or green; 3) It has colorful colors or blue.



This is carousel (mechanism), because 1) it has accumulated fine boxes / circles or green; 2) it has fine spots or foods; 3) it has fine lines.

Generation of

inference

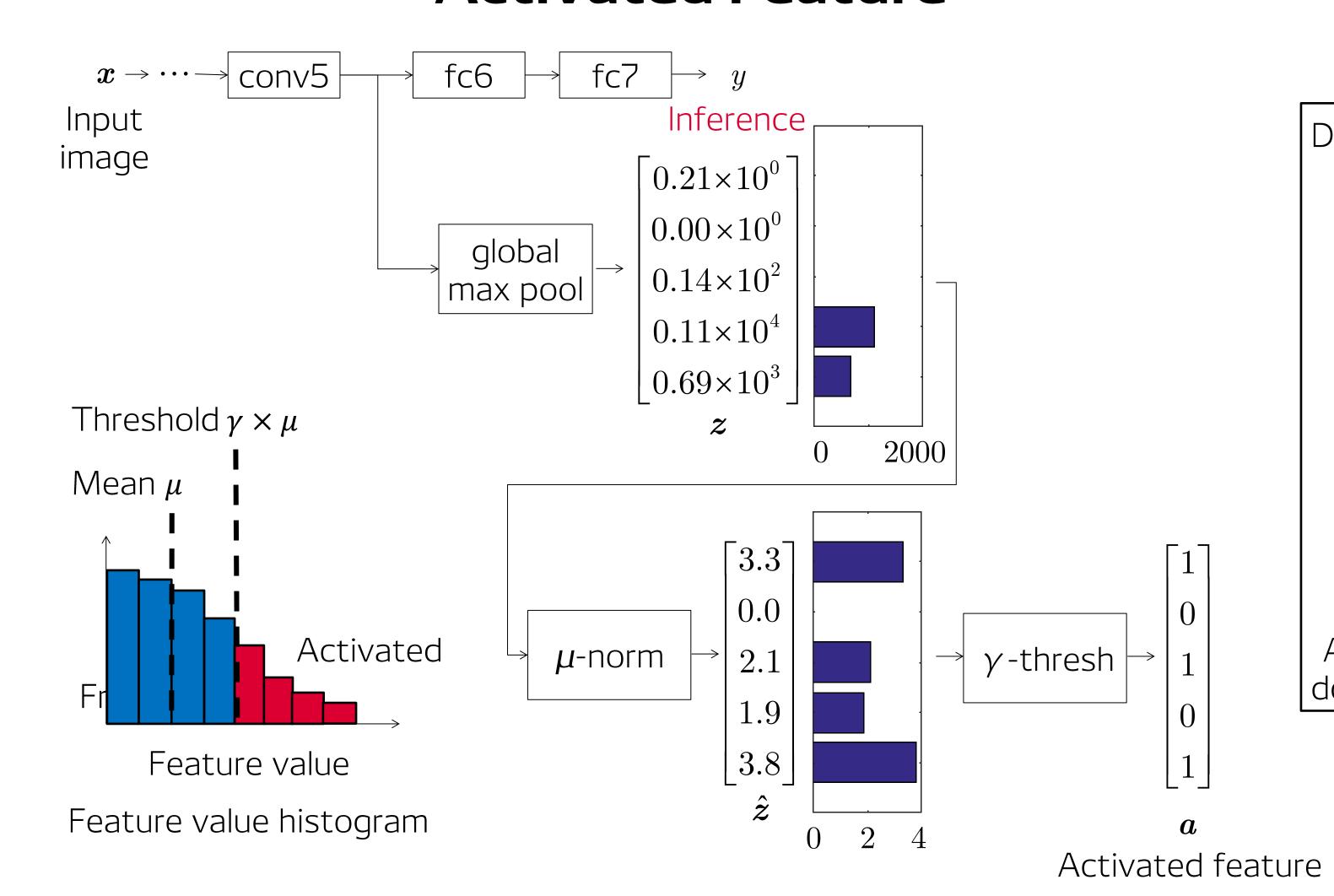
explanations



This is Granny Smith (natural object), because 1) it has rounded or green; 2) it has rounded or green; 3) it has rounded, fruits or yellow.

Explaining Inference Process

Activated Feature

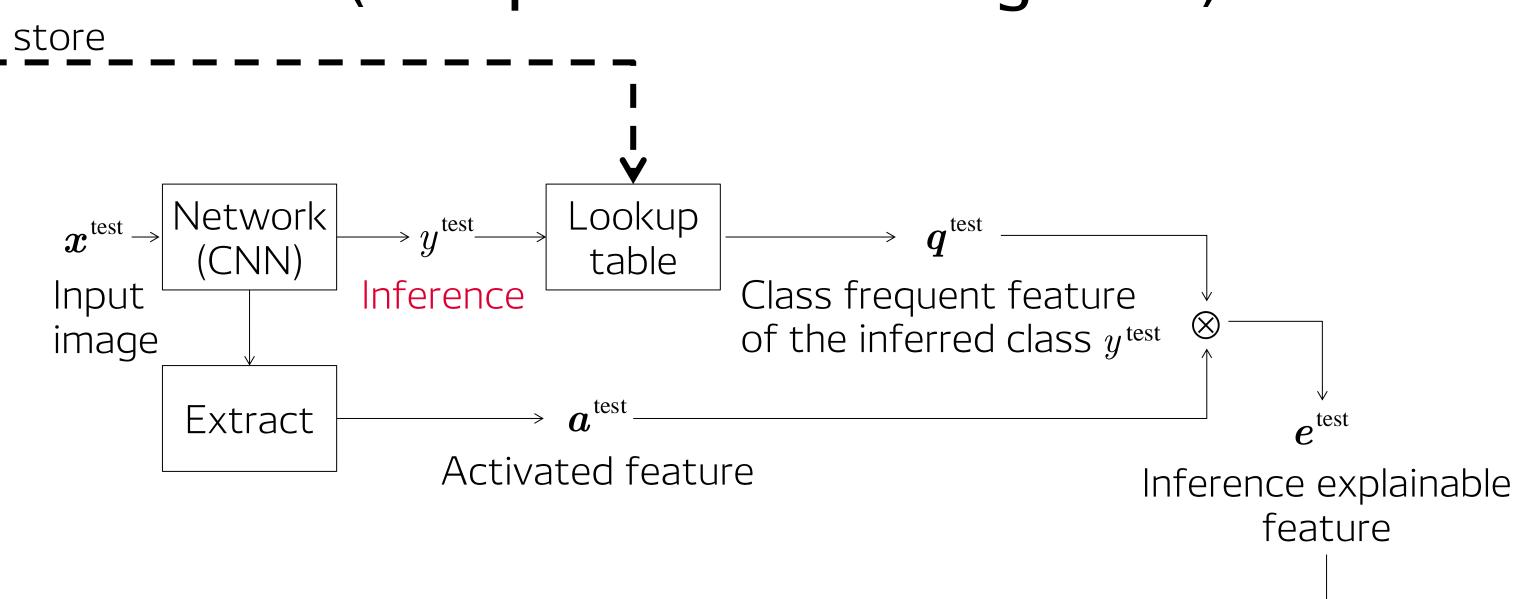


Class Frequent Feature

(computed at the end of training)

Dog class training data $|+|1|+|1|+\cdots=|86|$ top-k q(dog)0 50 100 Activated feature of Class frequent dog class training data |q(cat)|feature Activated feature of Class frequent q(bird)cat class training data feature Activated feature of Class frequent bird class training data feature

Inference Explainable Feature (computed at testing time)



This is ambulance (motor vehicle), because 1) it has rubber tires or heads of birds; 2) it has accumulated fine boxes/circles, large characters or twotone red/white; 3) it has faces of black dogs or black square windows.