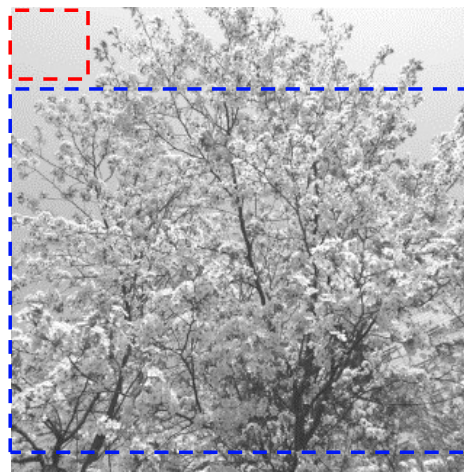
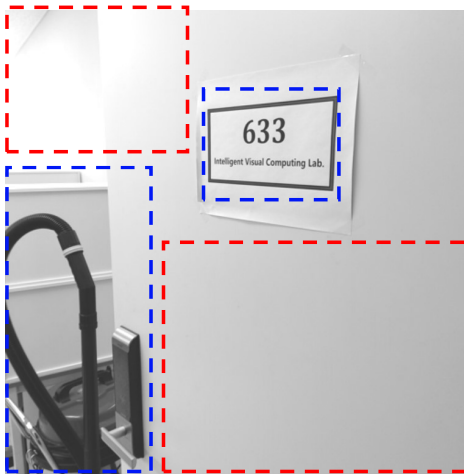


# Spatial Correlation

이진영

# Spatial Correlation

- Similarity of neighboring pixels
- Low correlation in object boundaries, but high correlation in background regions



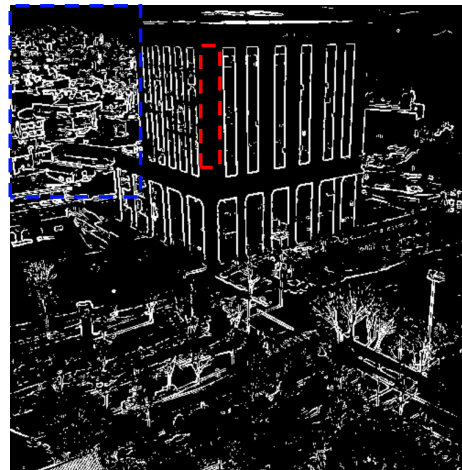
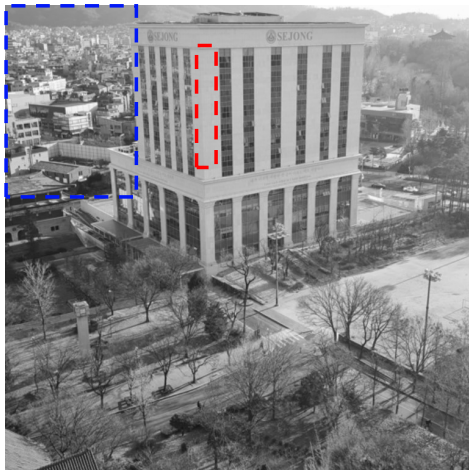
 High Correlation

 Low Correlation



# Measurement

- Low correlation in regions with edges, high difference between adjacent pixels, high variance, ...
- High correlation in regions with no edge, low difference between adjacent pixels, low variance, ...



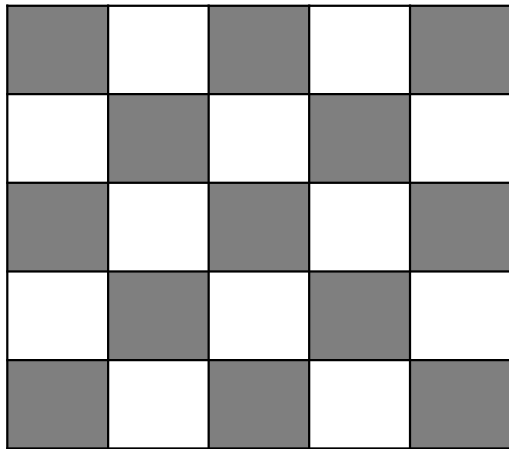
Edge Map

$$var = \frac{\sum_{i=1}^n (x_i - \mu)^2}{n}$$

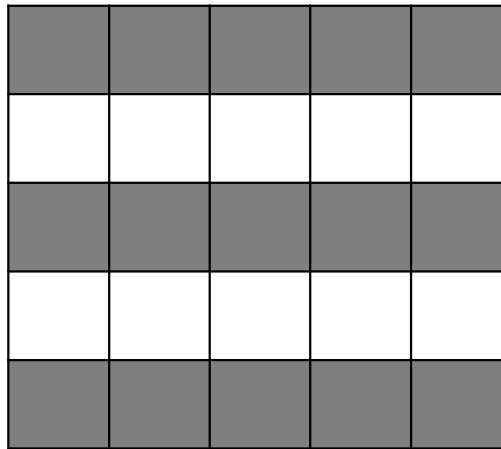


# Correlation Direction

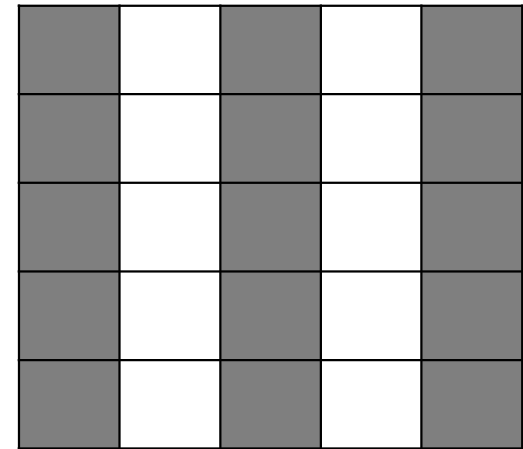
- Sometimes, horizontally or vertically high correlation depending on characteristics of an image
- Based on the correlation analysis, different compression, restoration, ... , upsampling strategies



Low Correlation



Horizontally High Correlation

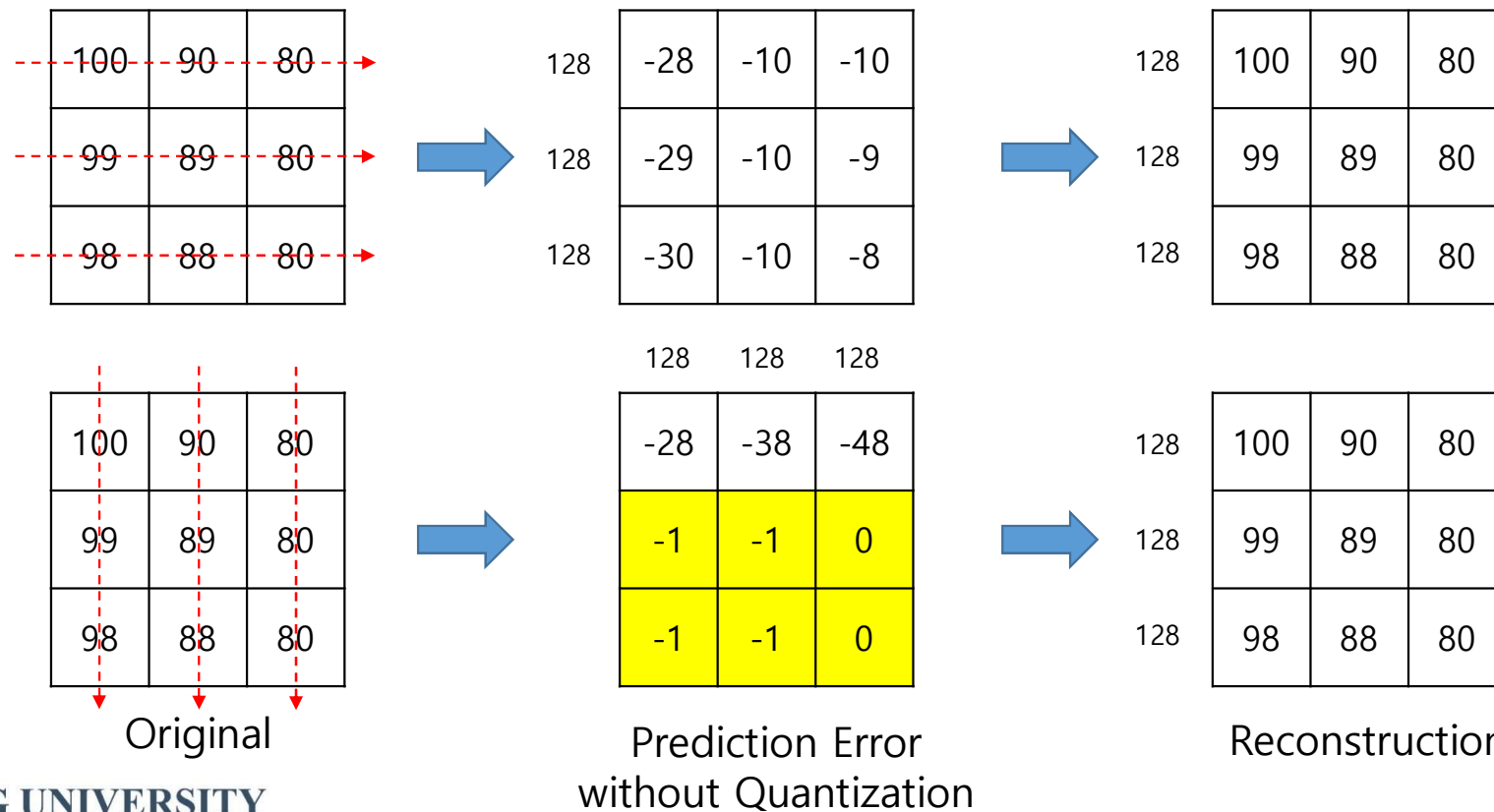


Vertically High Correlation



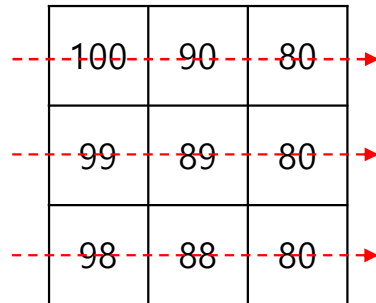
# Spatial Prediction

- Prediction based on correlation direction, for example, horizontal or vertical direction

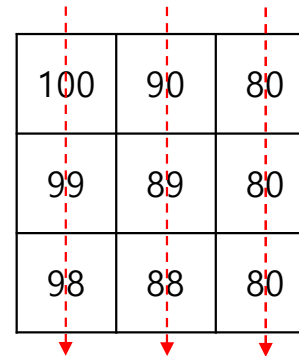


# Prediction Information

- Transmission of prediction error and direction information in an encoder
- Reconstruction based on the prediction direction in a decoder
- Explicit signaling of the prediction direction, for example, 0 for horizontal prediction and 1 for vertical prediction



100	90	80
99	89	80
98	88	80



100	90	80
99	89	80
98	88	80



# Example of Horizontal Prediction

First	<table><tr><td>100</td><td>90</td><td>80</td></tr><tr><td>99</td><td>89</td><td>80</td></tr><tr><td>98</td><td>88</td><td>80</td></tr></table>	100	90	80	99	89	80	98	88	80	<table><tr><td>-28</td><td></td><td></td></tr><tr><td>-29</td><td></td><td></td></tr><tr><td>-30</td><td></td><td></td></tr></table>	-28			-29			-30			<table><tr><td>-5</td><td></td><td></td></tr><tr><td>-5</td><td></td><td></td></tr><tr><td>-6</td><td></td><td></td></tr></table>	-5			-5			-6			<table><tr><td>-25</td><td></td><td></td></tr><tr><td>-25</td><td></td><td></td></tr><tr><td>-30</td><td></td><td></td></tr></table>	-25			-25			-30			<table><tr><td>103</td><td></td><td></td></tr><tr><td>103</td><td></td><td></td></tr><tr><td>98</td><td></td><td></td></tr></table>	103			103			98		
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	Encoder				Decoder																																													



# Example of Vertical Prediction

First	<table><tr><td>100</td><td>90</td><td>80</td></tr><tr><td>99</td><td>89</td><td>80</td></tr><tr><td>98</td><td>88</td><td>80</td></tr></table>	100	90	80	99	89	80	98	88	80	<table><tr><td>-28</td><td>-38</td><td>-48</td></tr><tr><td></td><td></td><td></td></tr><tr><td></td><td></td><td></td></tr></table>	-28	-38	-48							<table><tr><td>-5</td><td>-7</td><td>-9</td></tr><tr><td></td><td></td><td></td></tr><tr><td></td><td></td><td></td></tr></table>	-5	-7	-9							<table><tr><td>-25</td><td>-35</td><td>-45</td></tr><tr><td></td><td></td><td></td></tr><tr><td></td><td></td><td></td></tr></table>	-25	-35	-45							<table><tr><td>103</td><td>93</td><td>83</td></tr><tr><td></td><td></td><td></td></tr><tr><td></td><td></td><td></td></tr></table>	103	93	83						
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	Encoder				Decoder																																													





# Compression Result

- Please choose the best prediction in horizontal and vertical prediction methods

100	90	80
99	89	80
98	88	80

Original

-5	-2	-2
-5	-2	-2
-6	-2	-1

Quantization  
( $e \div 5$ )

103	93	83
103	93	83
98	88	83

Reconstruction  
(38.81dB)

Horizontal Prediction

-5	-7	-9
0	0	0
-1	-1	0

Quantization  
( $e \div 5$ )

103	93	83
103	93	83
98	88	83

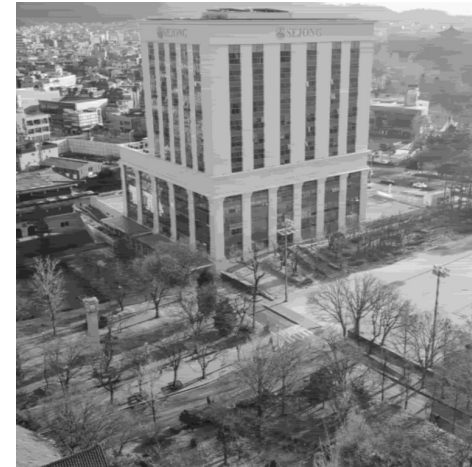
Reconstruction  
(38.81dB)

Vertical Prediction

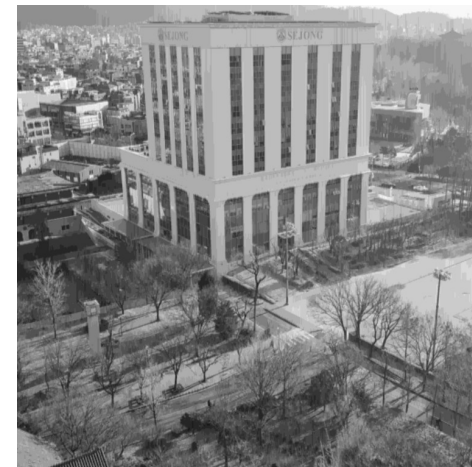


# Experiment

- DPCM-based compression using horizontal and vertical predictions
- $e \div q$  for quantization
- Generation of bitstream with fixed-length or unary code (bitstream.txt)
- Binarization for the quantized prediction error, for example,  $<-3(000)$ ,  $-3(001)$ ,  $-2(010)$ ,  $-1(011)$ ,  $0(100)$ ,  $1(101)$ ,  $2(110)$ ,  $>2(111)$ , and then Inverse binarization with  $000(-4)$ ,  $001(-3)$ ,  $010(-2)$ ,  $011(-1)$ ,  $100(0)$ ,  $101(1)$ ,  $110(2)$ ,  $111(3)$



Horizontal Prediction



Vertical Prediction

