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<td>Center Weighted Median Filter</td>
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<tr>
<td>DBA</td>
<td>Decision Based Algorithm</td>
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<td>Edge Preserving Regularization</td>
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<td>Fuzzy Adaptive Decision Based Median Filter</td>
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<td>Pixel-Wise Median Absolute Deviation</td>
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<tr>
<td>ROM</td>
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