



# U-RME: Underwater Refined Motion Estimation in hazy, cluttered and dynamic environments

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## Introduction

- Optical Flow is a popular method of computer vision for motion estimation.
- Motion estimation in marine videos is a challenging task due to complex underwater environment.
- In this paper, we present a refined optical flow estimation method.
- Our approach is exploiting contour information as most of the motion lies on the edges.
- Further, we have formulated it as sparse to dense motion estimation.
- Proposed method has been evaluated on real life image sequences of Fish4Knowledge database.

## Methodology

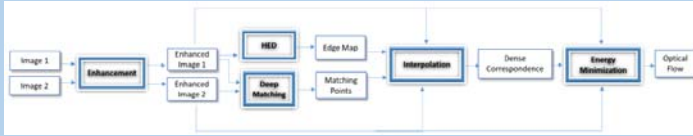


Fig. 1. Flow Chart

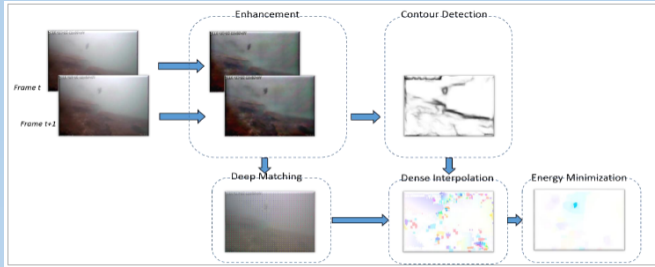


Fig. 2. Pipeline of the proposed flow method

### Image Enhancement

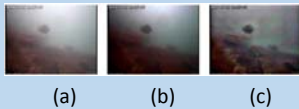


Fig. 3. (a) Original Image.

Enhanced image by (b) DehazeNet and (c) Light Scattering Model

### Contour Detection

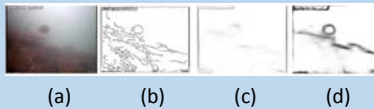


Fig. 4. (a) Original Image.

Edges detected by (b) Canny, (c) SED and (d) HED

### Energy Minimization

$$E(\mathbf{u}, \mathbf{v}) = \rho_D E_D + \lambda_1 \rho_s E_S + \lambda_2 E_C + \lambda_3 E_{med}$$

$$E_D = \sum_{i,j} (F_1(i, j) - F_2(i + u_{i,j}, j + v_{i,j}))$$

$$E_S = \sum_{i,j} ((u_{i,j} - u_{i+1,j}) + (u_{i,j} - u_{i,j+1}) + (v_{i,j} - v_{i+1,j}) + (v_{i,j} - v_{i,j+1}))$$

$$E_C = (\|\mathbf{u} - \hat{\mathbf{u}}\|^2 + \|\mathbf{v} - \hat{\mathbf{v}}\|^2)$$

$$E_{med} = \sum_{i,j} \sum_{(i',j') \in N_{i,j}} (\|\hat{u}_{i,j} - \hat{u}_{i',j'}\| + \|\hat{v}_{i,j} - \hat{v}_{i',j'}\|)$$

## Results

### Success Cases:

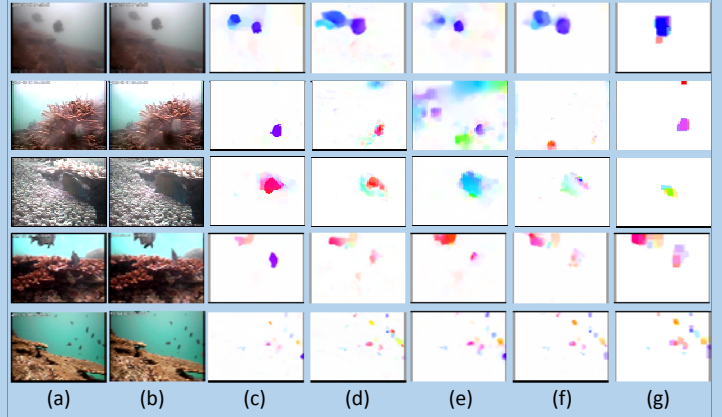


Fig. 5. (a) Frame t (b) Frame t+1 (c) Proposed (d) DD Flow (e) EPIC Flow (f) LDOF (g) SIFT Flow

### Failure Cases:

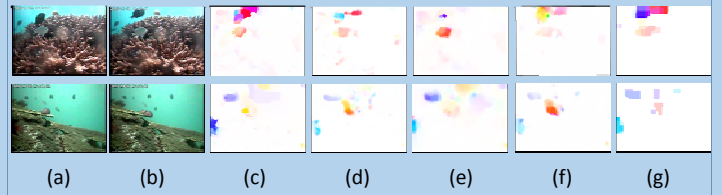


Fig. 6. (a) Frame t (b) Frame t+1 (c) Proposed (d) DD Flow (e) EPIC Flow (f) LDOF (g) SIFT Flow

## Conclusion

- Motion information of objects is crucial for such low quality videos.
- We have shown significant improvement for underwater videos and comparative results for complex scenarios
- The proposed flow estimation technique can be further extended to segment and track the objects in hazy, cluttered and dynamic environments.

## References

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