

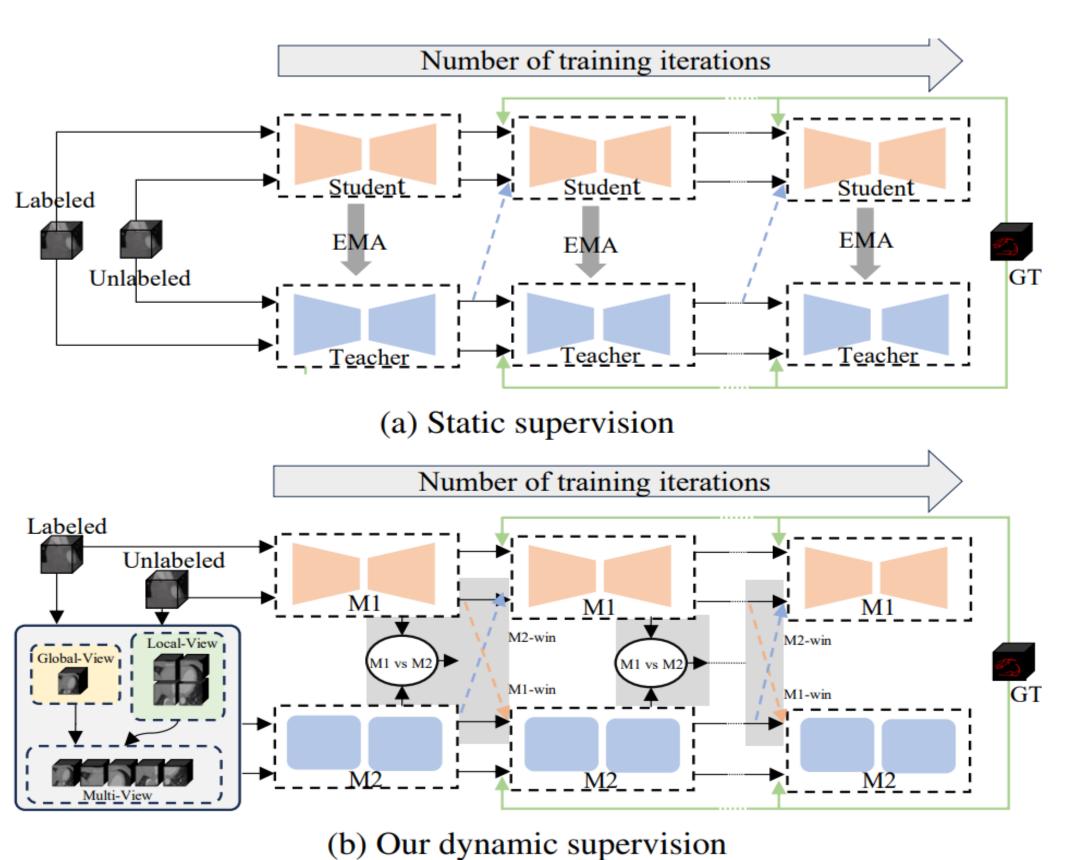
### Learning Dynamic Collaborative Network for Semi-supervised 3D Vessel Segmentation

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# Motivation: Explore a simple and effective semi-supervised framework

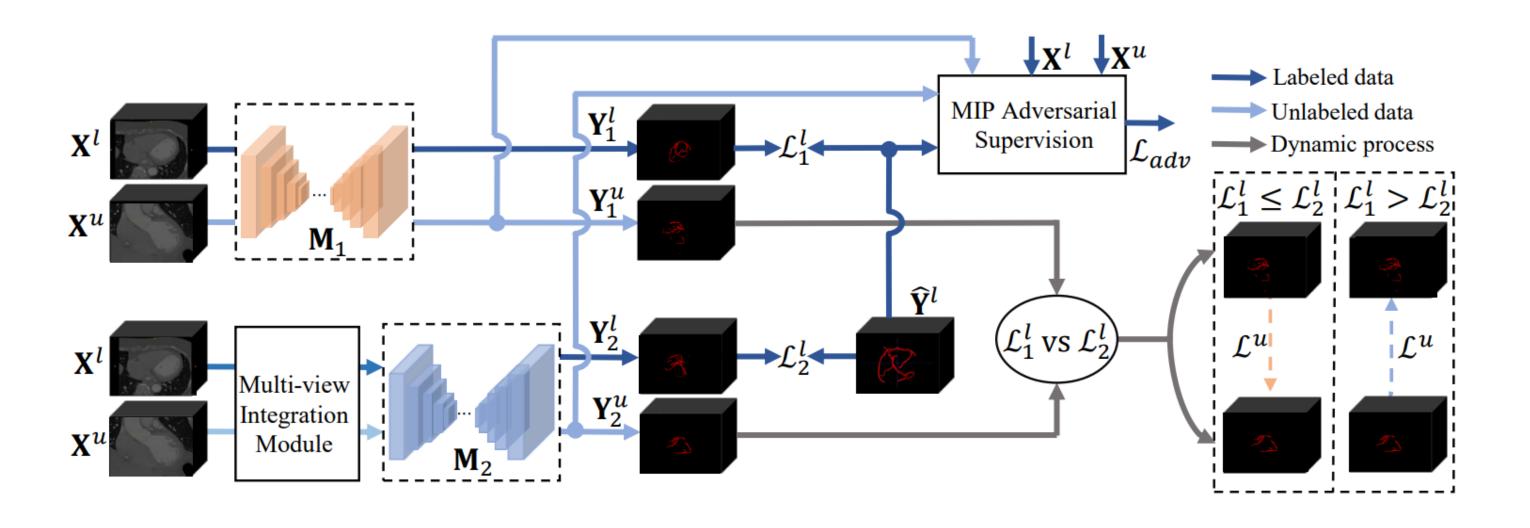


- Problems with existing vessel segmentation:
- a) Scarcity of labeled data
- b) Complex appearance
- Intuition: It is necessary to explore a simple semi-supervised vessel segmentation framework.
- A simple solution: Improving the cognitive bias of the basic MT network to facilitate the learning of unsupervised data.
- MV vs DiCO

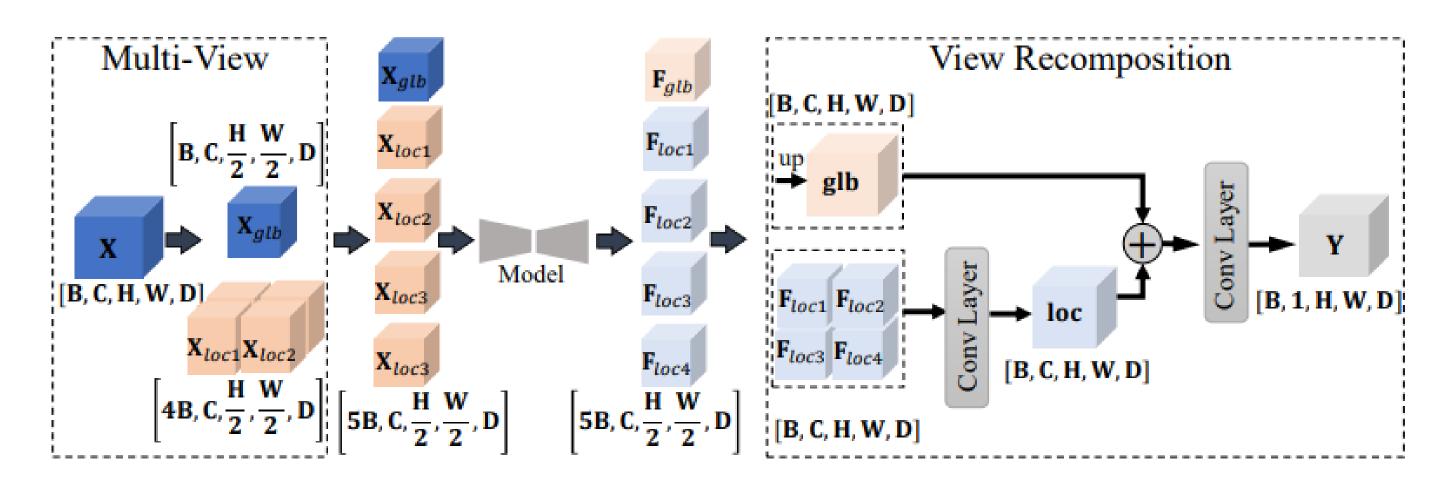
| Dataset   | Metric          | C+T   | C+C   | T+T   | MT    |
|-----------|-----------------|-------|-------|-------|-------|
| ImageCAS  | $DSC\uparrow$   | 70.37 | 69.45 | 62.67 | 71.05 |
|           | $NSD\uparrow$   | 56.36 | 53.42 | 47.54 | 56.32 |
|           | $ASD\downarrow$ | 23.87 | 25.89 | 32.47 | 24.06 |
|           | $DSC\uparrow$   | 83.59 | 82.74 | 78.56 | 73.94 |
| CAS2023   | $NSD\uparrow$   | 73.44 | 70.89 | 67.28 | 58.33 |
|           | $ASD\downarrow$ | 1.79  | 1.97  | 2.17  | 15.21 |
| Parse2022 | DSC↑            | 63.85 | 62.77 | 62.89 | 58.36 |
|           | $NSD\uparrow$   | 43.39 | 43.21 | 42.45 | 42.58 |
|           | $ASD\downarrow$ | 9.02  | 10.84 | 9.65  | 11.37 |

## DiCO: Learning Dynamic Collaborative Network for Semi-supervised 3D Vessel Segmentation

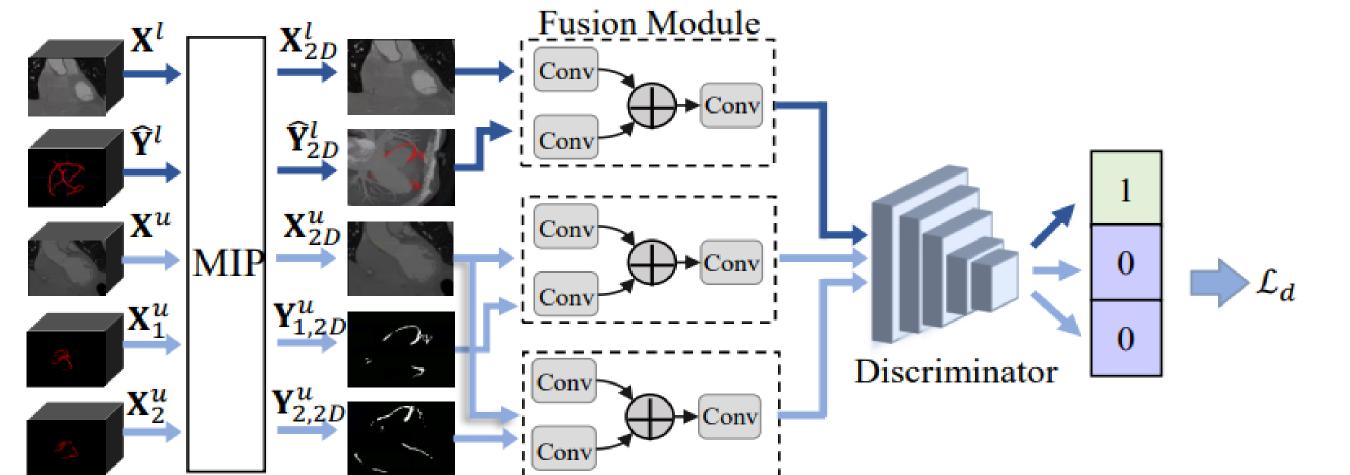
■ Architecture of the DiCO framework



■Multi-view integration module



■MIP adversarial supervision module



#### **Experiments: SOTA comparison & ablation study**

| Method            |                | Source    | Scans Used |           | Metrics  |          |              |
|-------------------|----------------|-----------|------------|-----------|----------|----------|--------------|
|                   |                | Source    | L Volumes  | U Volumes | DSC↑ (%) | NSD ↑(%) | ASD ↓(voxel) |
|                   | MT [27]        | ICLR'17   | 45         | 855       | 71.05    | 56.32    | 24.06        |
|                   | UA-MT [40]     | MICCAI'19 | 45         | 855       | 70.11    | 55.83    | 23.11        |
|                   | SASSNet [13]   | MICCAI'20 | 45         | 855       | 72.73    | 58.54    | 21.96        |
|                   | SLCNet [15]    | MICCAI'22 | 45         | 855       | 72.78    | 57.36    | 20.44        |
| Semi-supervised   | MagicNet [2]   | CVPR'23   | 45         | 855       | 71.88    | 57.50    | 22.10        |
|                   | CAML [6]       | MICCAI'23 | 45         | 855       | 71.66    | 58.03    | 23.73        |
|                   | CauSSL [18]    | ICCV'23   | 45         | 855       | 69.14    | 53.25    | 24.79        |
|                   | GuidedNet [42] | ACMMM'24  | 45         | 855       | 65.24    | 50.63    | 30.21        |
|                   | DiCo           | Ours      | 45         | 855       | 73.79    | 58.59    | 20.00        |
| Method            |                | Source    | Scans Used |           | Metrics  |          |              |
|                   |                |           | L Volumes  | U Volumes | DSC↑ (%) | NSD ↑(%) | ASD ↓(voxel) |
| 1                 | MT [27]        | ICLR'17   | 5          | 85        | 73.94    | 58.33    | 15.21        |
|                   | UA-MT [40]     | MICCAI'19 | 5          | 85        | 77.31    | 59.22    | 5.89         |
|                   | SASSNet [13]   | MICCAI'20 | 5          | 85        | 75.43    | 58.82    | 7.67         |
|                   | SLCNet [15]    | MICCAI'22 | 5          | 85        | 77.21    | 61.65    | 3.65         |
| Semi-supervised   | MagicNet [2]   | CVPR'23   | 5          | 85        | 84.13    | 72.73    | 1.92         |
| Seilli-supervised | CAML [6]       | MICCAI'23 | 5          | 85        | 79.64    | 67.43    | 2.19         |
|                   |                | ICCV'23   | 5          | 85        | 76.72    | 62.48    | 2.19         |
|                   | CauSSL [18]    |           | 3          |           |          |          |              |
|                   | GuidedNet [42] | ACMMM'24  | 5          | 85        | 81.60    | 69.00    | 2.01         |
|                   | DiCo           | Ours      | 5          | 85        | 86.05    | 74.35    | 1.49         |
| Method            |                | Source    | Scans Used |           | Metrics  |          |              |
|                   |                | Source    | L Volumes  | U Volumes | DSC↑ (%) | NSD ↑(%) | ASD ↓(voxel  |
|                   | MT [27]        | ICLR'17   | 5          | 85        | 58.36    | 42.58    | 11.37        |
| Semi-supervised   | UA-MT [40]     | MICCAI'19 | 5          | 85        | 62.70    | 45.72    | 10.51        |
|                   | SASSNet [13]   | MICCAI'20 | 5          | 85        | 68.33    | 29.19    | 7.57         |
|                   | SLCNet [15]    | MICCAI'22 | 5          | 85        | 66.13    | 48.87    | 8.18         |
|                   | MagicNet [2]   | CVPR'23   | 5          | 85        | 69.19    | 53.25    | 5.53         |
|                   | CAML [6]       | MICCAI'23 | 5          | 85        | 66.75    | 50.22    | 7.27         |
|                   | CauSSL [18]    | ICCV'23   | 5          | 85        | 66.45    | 48.88    | 7.94         |
|                   | GuidedNet [42] | ACMMM'24  | 5          | 85        | 68.80    | 51.80    | 6.74         |
|                   | DiCo           | Ours      | 5          | 85        | 70.93    | 55.26    | 5.74         |
| Eull our arrised  | VNet [1]       | ICCV'16   | 90         | 0         | 65.53    | 48.87    | 8.08         |
| Full-supervised   |                | DIDAGO    | 00         |           |          | 50.00    |              |
| i un supervised   | CTNet [21]     | BIBM'22   | 90         | 0         | 73.12    | 58.92    | 5.88         |

| Dataset   | Metric          | MT    | Base  | +MIP  | +MV   | All   |
|-----------|-----------------|-------|-------|-------|-------|-------|
| ImageCAS  | $DSC\uparrow$   | 71.05 | 70.37 | 71.15 | 72.37 | 73.79 |
|           | $NSD\uparrow$   | 56.32 | 56.36 | 53.64 | 57.36 | 58.59 |
|           | $ASD\downarrow$ | 24.06 | 23.87 | 21.97 | 19.44 | 20.00 |
| CAS2023   | DSC↑            | 73.94 | 83.59 | 84.42 | 85.63 | 86.05 |
|           | $NSD\uparrow$   | 58.33 | 73.44 | 73.24 | 73.40 | 74.35 |
|           | $ASD\downarrow$ | 15.21 | 1.79  | 2.31  | 1.63  | 1.49  |
| Parse2022 | DSC↑            | 58.36 | 63.85 | 66.29 | 68.46 | 70.93 |
|           | $NSD\uparrow$   | 42.58 | 47.39 | 50.15 | 52.14 | 55.26 |
|           | ASD.            | 11.37 | 9.02  | 7.24  | 5.92  | 5.74  |

DSCNet [23]

|  | Datasets   | Method | Metric |       |                 |  |
|--|------------|--------|--------|-------|-----------------|--|
|  |            |        | DSC↑   | NSD↑  | $ASD\downarrow$ |  |
|  | ImageCAS   | 3D     | 60.79  | 43.73 | 46.31           |  |
|  |            | 2D     | 71.15  | 53.64 | 21.97           |  |
|  | CAS2023    | 3D     | 83.25  | 71.39 | 2.49            |  |
|  | CA32023    | 2D     | 84.42  | 73.24 | 2.31            |  |
|  | Pares2022  | 3D     | 59.33  | 46.92 | 12.68           |  |
|  | 1 41632022 | 2D     | 66.29  | 50.15 | 7.24            |  |

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#### Conclusion

> A new efficient Semi-supervised framework that

ICCV'23

- ✓ alleviates cognitive bias
- ✓ performs well in vascular structure segmentation
- ✓ achieves SOTA performance