# 行人重识别 Person Re-identification / Person Retrieval 专知荟萃

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### 入门学习

- 1. 行人重识别综述
  - [http://www.jianshu.com/p/98cc04cca0ae? utm\_campaign=maleskine&utm\_content=note&utm\_medium=seo\_notes&utm\_source=recommendation\]
- 2. 基于深度学习的Person Re-ID (综述)
  - [http://blog.csdn.net/linolzhang/article/details/71075756]
- 3. 郑哲东 -Deep-ReID: 行人重识别的深度学习方法
  - PPT: [https://www.slideshare.net/ZhedongZheng1/deep-reid]
  - 。视频: [http://www.bilibili.com/video/av13796843/]
- 4. 【行人识别】Deep Transfer Learning for Person Re-identification
  - o [http://blog.csdn.net/shenxiaolu1984/article/details/53607268]
- 5. 知乎专栏: 行人重识别 [https://zhuanlan.zhihu.com/personReid]
  - 。 行人重识别综述: 从哈利波特地图说起
  - 。 行人再识别中的迁移学习: 图像风格转换 (Learning via Translation)
  - 。 行人对齐+重识别网络
  - 。 SVDNet for Pedestrian Retrieval: CNN到底认为哪个投影方向是重要的?
  - 。用GAN生成的图像做训练? Yes!
  - 。 2017 ICCV 行人检索/重识别 接受论文汇总
  - 。 从人脸识别 到 行人重识别,下一个风口
- 6. GAN (生成式对抗网络)的研究现状,以及在行人重识别领域的应用前景?
  - o [https://www.zhihu.com/question/53001881/answer/170077548]
- 7. Re-id Resources
  - [https://wangzwhu.github.io/home/re\_id\_resources.html\]
- 8. 行人再识别 (行人重识别) 【包含与行人检测的对比】
  - o [http://blog.csdn.net/liuqinglong110/article/details/41699861]
- 9. 行人重识别综述 (Person Re-identification: Past, Present and Future)
  - o [http://blog.csdn.net/auto1993/article/details/74091803]

## 进阶论文及代码

# Person Re-identification / Person Retrieval

1. DeepReID: Deep Filter Pairing Neural Network for Person Re-Identification

- o intro: CVPR 2014
- paper: [http://www.cv-

foundation.org/openaccess/content\_cvpr\_2014/papers/Li\_DeepReID\_Deep\_Filter\_2014\_CVPR\_paper.pdf]

- 2. An Improved Deep Learning Architecture for Person Re-Identification
  - o intro: CVPR 2015
  - o paper: [http://www.cv-
  - foundation.org/openaccess/content\_cvpr\_2015/papers/Ahmed\_An\_Improved\_Deep\_2015\_CVPR\_paper.pdf]
  - o github: [https://github.com/Ning-Ding/Implementation-CVPR2015-CNN-for-ReID]
- 3. Deep Ranking for Person Re-identification via Joint Representation Learning
  - o intro: IEEE Transactions on Image Processing [TIP], 2016
  - arxiv: [https://arxiv.org/abs/1505.06821]
- 4. PersonNet: Person Re-identification with Deep Convolutional Neural Networks
  - arxiv: [http://arxiv.org/abs/1601.07255]
- 5. Learning Deep Feature Representations with Domain Guided Dropout for Person Re-identification
  - o intro: CVPR 2016
  - o arxiv: [https://arxiv.org/abs/1604.07528]
  - github: [https://github.com/Cysu/dgd\_person\_reid]
- 6. Person Re-Identification by Multi-Channel Parts-Based CNN with Improved Triplet Loss Function
  - o intro: CVPR 2016
  - paper: [http://www.cv-foundation.org/openaccess/content\_cvpr\_2016/papers/Cheng\_Person\_Re-Identification\_by\_CVPR\_2016\_paper.pdf]
- 7. End-to-End Comparative Attention Networks for Person Re-identification
  - [https://arxiv.org/abs/1606.04404]
- 8. A Multi-task Deep Network for Person Re-identification
  - arxiv: [http://arxiv.org/abs/1607.05369]
- 9. Gated Siamese Convolutional Neural Network Architecture for Human Re-Identification
  - arxiv: [http://arxiv.org/abs/1607.08378]
- 10. A Siamese Long Short-Term Memory Architecture for Human Re-Identification
  - o arxiv: [http://arxiv.org/abs/1607.08381]
- 11. Gated Siamese Convolutional Neural Network Architecture for Human Re-Identification
  - arxiv: [https://arxiv.org/abs/1607.08378]
- 12. Person Re-identification: Past, Present and Future
  - [https://arxiv.org/abs/1610.02984]
- 13. Deep Learning Prototype Domains for Person Re-Identification
  - arxiv: [https://arxiv.org/abs/1610.05047]
- 14. Deep Transfer Learning for Person Re-identification
  - o arxiv: [https://arxiv.org/abs/1611.05244]
- 15. A Discriminatively Learned CNN Embedding for Person Re-identification
  - o arxiv: [https://arxiv.org/abs/1611.05666]
  - github[MatConvnet]: [https://github.com/layumi/2016\_person\_re-ID]
- 16. Structured Deep Hashing with Convolutional Neural Networks for Fast Person Re-identification
  - o arxiv: [https://arxiv.org/abs/1702.04179]
- 17. In Defense of the Triplet Loss for Person Re-Identification
  - arxiv: [https://arxiv.org/abs/1703.07737]
  - o github[Theano]: [https://github.com/VisualComputingInstitute/triplet-reid]
- 18. Beyond triplet loss: a deep quadruplet network for person re-identification
  - o intro: CVPR 2017
  - arxiv: [https://arxiv.org/abs/1704.01719]
- 19. Part-based Deep Hashing for Large-scale Person Re-identification
  - intro: IEEE Transactions on Image Processing, 2017

- arxiv: [https://arxiv.org/abs/1705.02145]
- 20. Deep Person Re-Identification with Improved Embedding
  - o [https://arxiv.org/abs/1705.03332]
- 21. Towards a Principled Integration of Multi-Camera Re-Identification and Tracking through Optimal Bayes Filters
  - arxiv: [https://arxiv.org/abs/1705.04608]
  - github: [https://github.com/VisualComputingInstitute/towards-reid-tracking]
- 22. Person Re-Identification by Deep Joint Learning of Multi-Loss Classification
  - o intro: IJCAI 2017
  - o arxiv: [https://arxiv.org/abs/1705.04724]
- 23. Attention-based Natural Language Person Retrieval
  - o intro: CVPR 2017 Workshop [vision meets cognition]
  - keywords: Bidirectional Long Short- Term Memory [BLSTM]
  - arxiv: [https://arxiv.org/abs/1705.08923]
- 24. Unsupervised Person Re-identification: Clustering and Fine-tuning
  - arxiv: [https://arxiv.org/abs/1705.10444]
  - github: [https://github.com/hehefan/Unsupervised-Person-Re-identification-Clustering-and-Fine-tuning]
- 25. Deep Representation Learning with Part Loss for Person Re-Identification
  - [https://arxiv.org/abs/1707.00798]
- 26. Pedestrian Alignment Network for Large-scale Person Re-identification
  - [https://raw.githubusercontent.com/layumi/Pedestrian\_Alignment/master/fig2.jpg]
  - arxiv: [https://arxiv.org/abs/1707.00408]
  - github: [https://github.com/layumi/Pedestrian\_Alignment]
- 27. Deep Reinforcement Learning Attention Selection for Person Re-Identification
  - [https://arxiv.org/abs/1707.02785]
- 28. Learning Efficient Image Representation for Person Re-Identification
  - [https://arxiv.org/abs/1707.02319]
- 29. Person Re-identification Using Visual Attention
  - o intro: ICIP 2017
  - arxiv: [https://arxiv.org/abs/1707.07336]
- 30. Deeply-Learned Part-Aligned Representations for Person Re-Identification
  - o intro: ICCV 2017
  - arxiv: [https://arxiv.org/abs/1707.07256]
- 31. What-and-Where to Match: Deep Spatially Multiplicative Integration Networks for Person Re-identification
  - [https://arxiv.org/abs/1707.07074]
- 32. Deep Feature Learning via Structured Graph Laplacian Embedding for Person Re-Identification
  - o [https://arxiv.org/abs/1707.07791]
- 33. Divide and Fuse: A Re-ranking Approach for Person Re-identification
  - o intro: BMVC 2017
  - arxiv: [https://arxiv.org/abs/1708.04169]
- 34. Large Margin Learning in Set to Set Similarity Comparison for Person Re-identification
  - o intro: IEEE Transactions on Multimedia
  - o arxiv: [https://arxiv.org/abs/1708.05512]
- 35. Multi-scale Deep Learning Architectures for Person Re-identification
  - o intro: ICCV 2017
  - o arxiv: [https://arxiv.org/abs/1709.05165]
- 36. Pose-driven Deep Convolutional Model for Person Re-identification
  - o [https://arxiv.org/abs/1709.08325]
- 37. HydraPlus-Net: Attentive Deep Features for Pedestrian Analysis
  - o intro: ICCV 2017. CUHK & SenseTime,
  - arxiv: [https://arxiv.org/abs/1709.09930]

- o github: [https://github.com/xh-liu/HydraPlus-Net]
- 38. Person Re-Identification with Vision and Language
  - [https://arxiv.org/abs/1710.01202]
- 39. Margin Sample Mining Loss: A Deep Learning Based Method for Person Re-identification
  - [https://arxiv.org/abs/1710.00478]
- 40. Learning Deep Context-aware Features over Body and Latent Parts for Person Re-identification
  - intro: CVPR 2017, CASIA
  - o keywords: Multi-Scale Context-Aware Network [MSCAN]
  - o arxiv: [https://arxiv.org/abs/1710.06555]
- 11. Pseudo-positive regularization for deep person re-identification
  - [https://arxiv.org/abs/1711.06500]
- 12. Let Features Decide for Themselves: Feature Mask Network for Person Re-identification
  - keywords: Feature Mask Network [FMN]
  - arxiv: [https://arxiv.org/abs/1711.07155]
- 43. Image-Image Domain Adaptation with Preserved Self-Similarity and Domain-Dissimilarity for Person Re-identification
  - [https://arxiv.org/abs/1711.07027]
- 14. AlignedReID: Surpassing Human-Level Performance in Person Re-Identification
  - o intro: Megvii, Inc & Zhejiang University
  - o arxiv: [https://arxiv.org/abs/1711.08184]
  - evaluation website: [Market1501]: [http://reid-challenge.megvii.com/]
  - evaluation website: [CUHK03]: [http://reid-challenge.megvii.com/cuhk03]
- 45. Region-based Quality Estimation Network for Large-scale Person Re-identification
  - o intro: AAAI 2018
  - arxiv: [https://arxiv.org/abs/1711.08766]
- 46. Deep-Person: Learning Discriminative Deep Features for Person Re-Identification
  - [https://arxiv.org/abs/1711.10658]
- 17. A Pose-Sensitive Embedding for Person Re-Identification with Expanded Cross Neighborhood Re-Ranking
  - arxiv: [https://arxiv.org/abs/1711.10378]
  - o github: [https://github.com/pse-ecn/pose-sensitive-embedding]

### Person Search

- 1. Joint Detection and Identification Feature Learning for Person Search
  - o intro: CVPR 2017
  - keywords: Online Instance Matching OIM loss function
  - homepage[dataset+code]:[http://www.ee.cuhk.edu.hk/~xgwang/PS/dataset.html]
  - o arxiv: [https://arxiv.org/abs/1604.01850]
  - paper: [http://www.ee.cuhk.edu.hk/~xgwang/PS/paper.pdf]
  - o github[official. Caffe]: [https://github.com/ShuangLI59/person\_search]
- 2. Person Re-identification in the Wild
  - o intro: CVPR 2017 spotlight
  - o keywords: PRW dataset
  - project page: [http://www.liangzheng.com.cn/Project/project\_prw.html]
  - arxiv: [https://arxiv.org/abs/1604.02531]
  - o github: [https://github.com/liangzheng06/PRW-baseline]
- 3. IAN: The Individual Aggregation Network for Person Search
  - [https://arxiv.org/abs/1705.05552]
- 4. Neural Person Search Machines
  - o intro: ICCV 2017
  - arxiv: [https://arxiv.org/abs/1707.06777]

### Re-ID with GAN

1. Unlabeled Samples Generated by GAN Improve the Person Re-identification Baseline in vitro

- intro: ICCV 2017
- arxiv: [https://arxiv.org/abs/1701.07717]
- o github: [https://github.com/layumi/Person-reID\_GAN]
- 2. Person Transfer GAN to Bridge Domain Gap for Person Re-Identification
  - [https://arxiv.org/abs/1711.08565]

#### Vehicle Re-ID

- 1. Learning Deep Neural Networks for Vehicle Re-ID with Visual-spatio-temporal Path Proposals
  - o intro: ICCV 2017
  - arxiv: [https://arxiv.org/abs/1708.03918]

### **Deep Metric Learning**

- 1. Deep Metric Learning for Person Re-Identification
  - o intro: ICPR 2014
  - paper: [http://www.cbsr.ia.ac.cn/users/zlei/papers/ICPR2014/Yi-ICPR-14.pdf]
- 2. Deep Metric Learning for Practical Person Re-Identification
  - [https://arxiv.org/abs/1407.4979]
- 3. Constrained Deep Metric Learning for Person Re-identification
  - [https://arxiv.org/abs/1511.07545]
- 4. DarkRank: Accelerating Deep Metric Learning via Cross Sample Similarities Transfer
  - o intro: TuSimple
  - o keywords: pedestrian re-identification
  - arxiv: [https://arxiv.org/abs/1707.01220]

#### **Re-ID** with Attributes Prediction

- 1. Deep Attributes Driven Multi-Camera Person Re-identification
  - o intro: ECCV 2016
  - o arxiv: [https://arxiv.org/abs/1605.03259]
- 2. Improving Person Re-identification by Attribute and Identity Learning
  - [https://arxiv.org/abs/1703.07220]

## Video-based Person Re-Identification

- 1. Recurrent Convolutional Network for Video-based Person Re-Identification
  - o intro: CVPR 2016
  - paper: [http://www.cv
    - $foundation.org/openaccess/content\_cvpr\_2016/papers/McLaughlin\_Recurrent\_Convolutional\_Network\_CVPR\_2016\_paper.pdf]$
  - o github: [https://github.com/niallmcl/Recurrent-Convolutional-Video-ReID]
- 2. Deep Recurrent Convolutional Networks for Video-based Person Re-identification: An End-to-End Approach
  - [https://arxiv.org/abs/1606.01609]
- 3. Jointly Attentive Spatial-Temporal Pooling Networks for Video-based Person Re-Identification
  - o intro: ICCV 2017
  - arxiv: [https://arxiv.org/abs/1708.02286]
- 4. Three-Stream Convolutional Networks for Video-based Person Re-Identification
  - [https://arxiv.org/abs/1712.01652]

### Re-ranking

- 1. Re-ranking Person Re-identification with k-reciprocal Encoding
  - o intro: CVPR 2017
  - arxiv: [https://arxiv.org/abs/1701.08398]
  - github: [https://github.com/zhunzhong07/person-re-ranking]

### 实战项目

1. Open-ReID: Open source person re-identification library in python

- intro: Open-ReID is a lightweight library of person re-identification for research purpose. It aims to provide a uniform interface for different datasets, a full set of models and evaluation metrics, as well as examples to reproduce [near] state-of-the-art results.
- o project page: [https://cysu.github.io/open-reid/]
- o github[PyTorch]: [https://github.com/Cysu/open-reid]
- examples: [https://cysu.github.io/open-reid/examples/training\_id.html]
- benchmarks: [https://cysu.github.io/open-reid/examples/benchmarks.html]

#### 2. caffe-PersonReID

- o intro: Person Re-Identification: Multi-Task Deep CNN with Triplet Loss
- gtihub: [https://github.com/agjayant/caffe-Person-ReID]
- 3. DukeMTMC-reID\_baseline Matlab
  - [https://github.com/layumi/DukeMTMC-reID\_baseline]
- 4. Code for IDE baseline on Market-1501
  - [https://github.com/zhunzhong07/IDE-baseline-Market-1501]

### 教程

- 1. 1st Workshop on Target Re-Identification and Multi-Target Multi-Camera Tracking
  - o [https://reid-mct.github.io/]
- 2. 郑哲东 -Deep-ReID: 行人重识别的深度学习方法
  - PPT: [https://www.slideshare.net/ZhedongZheng1/deep-reid]
  - 。 视频: [http://www.bilibili.com/video/av13796843/]
- 3. Person Identification in Large Scale Camera Networks Wei-Shi Zheng (郑伟诗)
  - [http://isee.sysu.edu.cn/~zhwshi/Research/ADL-OPEN.pdf\]
- 4. Person Re-Identification: Theory and Best Practice
  - [http://www.micc.unifi.it/reid-tutorial/slides/]

#### 综述

- 1. Person Re-identification: Past, Present and Future Liang Zheng, Yi Yang, Alexander G. Hauptmann
  - [https://arxiv.org/abs/1610.02984]
- 2. Person Re-Identification Book
  - [https://link.springer.com/book/10.1007/978-1-4471-6296-4]
- 3. A Systematic Evaluation and Benchmark for Person Re-Identification: Features, Metrics, and Datasets
  - [http://lanl.arxiv.org/abs/1605.09653]
- 4. People reidentification in surveillance and forensics: A survey
  - [https://dl.acm.org/citation.cfm?doid=2543581.2543596]

### 数据集

- 1. Re-ID 数据集汇总
  - [https://robustsystems.coe.neu.edu/sites/robustsystems.coe.neu.edu/files/systems/projectpages/reiddataset.html]

#### 图像数据集

- 1. Market-1501 Dataset 751个人, 27种属性, 一共约三万张图像 (一人多图)
  - [http://www.liangzheng.org/Project/project\_reid.html\]
  - Code for IDE baseline on Market-1501 :[https://github.com/zhunzhong07/IDE-baseline-Market-1501]
- 2. DukeMTMC-reID DukeMTMC数据集的行人重识别子集,原始数据集地址(http://vision.cs.duke.edu/DukeMTMC/),为行人跟踪数据集。原始数据集包含了85分钟的高分辨率视频,采集自8个不同的摄像头。并且提供了人工标注的bounding box。最终,DukeMTMC-reID 包含了 16,522张训练图片(来自702个人), 2,228个查询图像(来自另外的702个人),以及 17,661 张图像的搜索库(gallery)。并提供切割后的图像供下载。
  - [https://github.com/layumi/DukeMTMC-reID\_evaluation\]
- 3. CUHK01, 02, 03
  - [http://www.ee.cuhk.edu.hk/~rzhao/\]

#### Attribute相关数据集

- 1. RAP
  - [https://link.zhihu.com/?target=http%3A//rap.idealtest.org/]
- 2. Attribute for Market-1501and DukeMTMC\_reID
  - [https://link.zhihu.com/?target=https%3A//vana77.github.io/]

#### 视频相关数据集

- 1. Mars
  - [http://liangzheng.org/Project/project\_mars.html]
- 2. PRID2011
  - [https://www.tugraz.at/institute/icg/research/team-bischof/lrs/downloads/]

#### NLP相关数据集:

- 1. 自然语言搜图像
  - [http://xiaotong.me/static/projects/person-search-language/dataset.html]
- 2. 自然语言搜索行人所在视频
  - [http://www.mi.t.u-tokyo.ac.jp/projects/person\_search]

# 领域专家

- 1. Shaogang Gong -[http://www.eecs.qmul.ac.uk/~sgg/\]
- 2. Xiaogang Wang
  - [http://www.ee.cuhk.edu.hk/~xgwang/\]
- 3. Weishi Zheng
  - [https://sites.google.com/site/sunnyweishi/]
- 4. Liang Zheng
  - [http://www.liangzheng.com.cn/]
- 5. Chen Change Loy
  - [https://staff.ie.cuhk.edu.hk/~ccloy/\]
- 6. Qi Tian
  - [http://www.cs.utsa.edu/~qitian/tian-publication-year.html\]
- 7. Shengcai Liao
  - [http://www.cbsr.ia.ac.cn/users/scliao/]
- 8. Rui Zhao
  - o [http://www.ee.cuhk.edu.hk/~rzhao/\]
- 9. Yang Yang
  - [http://www.cbsr.ia.ac.cn/users/yyang/main.htm]
- 10. Ling Shao
  - [http://lshao.staff.shef.ac.uk/]
- 11. Ziyan Wu
  - [http://wuziyan.com/]
- 12. DaPeng Chen
  - [http://gr.xjtu.edu.cn/web/dapengchen/home]
- 13. Horst Bischof
  - [https://www.tugraz.at/institute/icg/research/team-bischof/lrs/downloads/prid450s]
- 14. Niki Martinel
  - [http://users.dimi.uniud.it/~niki.martinel/]

# 15. Liang Lin

[http://hcp.sysu.edu.cn/home/]

## 16. Le An

• [http://auto.hust.edu.cn/index.php?a=shows&catid=28&id=134]

# 17. Xiang Bai

o [http://mc.eistar.net/~xbai/index.html\]

# 18. Xiaoyuan Jing

• [http://mla.whu.edu.cn/plus/list.php?tid=2]

# 19. Fei Xiong

• [http://robustsystems.coe.neu.edu/?q=content/research]

# 20. DaPeng Chen

• [http://gr.xjtu.edu.cn/web/dapengchen/home]