## Paper Review in the field – State of the art

## Iphys: Open source toolbox- Matlab

- Introduction
- Impact of video Parameters:
  - video compression (x.264, x265) has the majority impact. Frame rate and resolution has lower impact Solution Super resolution
  - Multi Image performance is better
  - Distance depends on the camera sensor type
  - Light wavelength Green most effective
- Covered methods: Using ROI
  - Green Channel: Filter based approach for green channel
  - ICA: DeTrended, z-transform, Normalized, ICA, FFT
  - CHROM: Combination of chrominance, Spacial average
  - POS: Plane orthogonal to the skin tone
  - o BCG: Filter, PCAvi

## **Fusing Partial Camera Signals Pulse rate**

- Face Detection and Segmentation
- Camera Signal Processing!!
- Signal Separation
- Filter
- Auto Regressive

## Deep Super resolution to recover Physiological information from videos

- Preprocess video frame by super resolution techniques
  - Bilenear & Bicubic
  - Deep recurrent convolutional network (this paper applied)
- Extract HR from the frames
- Dataset: Recovering pulse rate with a multi-imager array Estepp et. al. 2014

#### **DeepPhys: Convolutional Attention Networks (CAN)**

- Outperforms all methods in RGB and infrared video dataset
- Visualization via attention mechanism
- DRM: Model for skin and image
  - $\circ C_t = I(t) \cdot (v_s(t) + v_d(t) + v_n(t))$
  - $\circ$  Non linearity between p(t) and  $C_t$
- Approach
  - Model Representation input:  $\frac{c_l(t+\Delta t)-c_l(t)}{c_l(t+\Delta t)+c_l(t)}$
  - o CNN
- Datasets:
  - Estepp et al. Recovering PR during motion Artifact with multi imager array for non-contact IPPG, 2014
  - Chen et al. Eliminate info from video
  - MAHNOB-HCI <a href="https://mahnob-db.eu/hci-tagging/pages/supplementary/">https://mahnob-db.eu/hci-tagging/pages/supplementary/</a> (Request)
  - Chen et al. Non contact physio. From neck NIR video

## **Spectral Estimation Methods for iPPG**

• Dataset: Estepp et. Al 2014

## InPhysible: Camouflage against VB Physiological Measurement

• Proposed a glass based system to disrupt the Heart rate measurement.

## Cardiolens: Physiological monitoring in mixed environment

• System to measure PPG using glass

## DeepMag: Source specific Motion Magnification using GD

## Supervised Learning approach to remote HR estimation from Facial Videos

- Datasets: Own data collection (Rana et al.)
- Method
  - Feature extraction
  - Signal sync: Red and green channel
  - Feature Representation
  - $\circ$  SVM

## SparsePPG: Drivers monitoring using NIR

- Dataset: RGB and NIR (collected own)
- Method
  - Signal Modeling Sparse PPG
  - o RPCA denoise
  - Spectral estimation
  - Fusion of time window
  - Facial tracking

## HR extraction based on NIR: Driver state monitoring

- Dataset: Own collected
- Method
  - Face tracking KLT
  - o EMD and FFT
- Multiple people option

#### Infrared based video HR

- Dataset: Own collected
- Method:
  - Feature Extration KTL
  - Channel separation, normalization, Detrending
  - o EMD, FFT

#### NonContact Monitoring of RR in Newborn using IR

- Dataset: 12 subject and study of infant
- Method
  - o ROI channel
  - Filtering
  - $\circ$  SQI
  - Information Fusion

## Waveform analysis for camera based PPG

- Own dataset collection
- processing
- Information about the PPG data

## Monitoring cardiorespiratory signals using Thermal imaging: Pilot study

- Data: Frontal view and side view, own collected dataset, 20 subjects
- Vertical head movement to measure RR
  - Cold air from nose in and hot air out.
- HR estimation
  - o Image preprocess, region selection, Shi-Tomasi corner detection, Temporal filter, PCA

## Local Group invariance for HR estimation from Face video in wild

- **Public data** available: (<a href="https://github.com/partofthestars/LGI-PPGI-DB">https://github.com/partofthestars/LGI-PPGI-DB</a>) Heusch et. al. And Bobbia et. al.
- Feature invariance under motion
- Mathematical modeling
- Methodology

## Non-Contact Remote measurement of the HRV using NIR

• Multiple camera sensors

#### Diffusion Process for HR estimation from face videos under realistic Conditions

- Problem formulation
- Feature representation under varying pixel intensity

## Estimation of RR from thermal videos of preterm infants

- Methodology
  - Region tracking
  - Signal Processing
    - Mean temporal value
    - Adaptive window autocorrelation
    - Adaptive window avg magnitude diff func
    - Adaptive maximum amplitudes pairs

## Multisensor data fusion for enhanced RR estimation in thermal videos

- Methodology
  - o ROI detection
  - Tracking
  - Breathing waveform
  - o SQI
  - Signal fusion

## A ppg Smartphone based Method for HRV assessment: Device model and breathing influences

• SPPG: 23 persons : No more description

## Non-Contact IR camera based respiratory rhythm measurement while driving

- Infrared frame
- Depth point-cloud
- normalization
- opportunistic piece selection

## Comparison of video based methods for respiratory rhythm measurement

- 21 subjects
- RGB videos
- · Depth point cloud
- thermal video
- Signal processing

## VitaMon: Measuring HRV using smartphone front camera

- Datatset: 30 participants
- Low resolution
  - Multiple ppg reading from different face portion to overcome low resolution
- Methodology
  - CNN to learn correlation between ECG and recontruct
  - Multiple facial region
  - o Two-phase ML

## **Single-Element Remote-PPG**

SoftSig (soft signature based extraction)

- Methodology
  - Projection
  - Selection Step
  - Dataset: own dataset

## Analysis of CNN-based remote-PPG to understand limitation and sensitivities.

- HNU and PURE pulse rate detection dataset.
- PPG extraction
  - Input preprocessing normalization difference
  - o CNN network
  - Post processing

## Attacks on Heartbeat-Based security using Remote photoplethysmography

Heartbeat based security

## Illumination Robust HR extraction from single-wavelength IR camera using spatial channel expansion.

- Dataset: Own collected
- Methodology
  - o Sub-window
  - Decomposition
  - Component selection

## IR thermography-based monitoring of respiratory phase without image segmentation.

• Pixel time series to avoid nose tracking

## Discriminative signature for remote-PPG

- PPG strength lower in NIR spectrum
- Discriminative signature based extraction (DIS) in NIR

#### NN based luminance variation resistant remote PPG for driver HR monitoring

- Facial motion and luminance concerns
- Personalized ANN
- HCI driver dataset

#### Remote PPG enhancement with ML methods

- Convolutional auto encoder and Multi-channel CAE
- PCA-SS

#### Motion resistant IPPG based on Spectral peak tracking algorithm

- MRSPT
- Multi-channel spectral matrix decomposition
- Dominant Motion Signal
- Kalman filter and verification

## Remote PPG with constrained ICA using periodicity and Chrominance Constraints

- cICAt
- Dataset:
  - o UBFC-RPPG (This Paper) <a href="https://sites.google.com/view/ybenezeth/ubfcrppg">https://sites.google.com/view/ybenezeth/ubfcrppg</a>
  - MMSE-HR (Public database)
    - http://www.cs.binghamton.edu/~lijun/Research/3DFE/3DFE Analysis.html

## VIPL-HR: A multi-modal database for pulse estimation from less-constrained face video

- Database: <a href="http://vipl.ict.ac.cn/database.php">http://vipl.ict.ac.cn/database.php</a>
  - o MAHNOB
  - o MMSE-HR
  - PURE (https://www.tu-ilmenau.de/en/neurob/data-sets-code/pulse/) request
  - $\circ$  PFF
  - o OBF

## Self-adaptive matrix completion for HR Estimation from face videos under realistic conditions

- Dynamically select face regions
- Chrominance Features
  - $\circ$  C =  $X_f \alpha Y_f$
  - $\circ \quad \alpha = SD(X_f)/SD(Y_f)$
  - $\circ$  X<sub>f</sub> and Y<sub>f</sub> are filtered signal of X and Y
  - $\circ$  X = 3R<sub>n</sub> 2G<sub>n</sub>, Y = 1.5R<sub>n</sub> +G<sub>n</sub> -1.5B<sub>n</sub>; (normalized version of R, G, B)
- Self-adaptive Matrix Completion

## New insights into the origin fo rPPG signals in visible light and infrared

mathematical modeling

## **Noldus information technology Research**

- Skin Reflection model Wang et al. Algo. Principle of remote PPG
- Facereader

## Remote Detection of PPG systolic and diastolic Peaks using a Digital camera

- Face ROI
- Color channel
- ICA
- Source signal separated and rescaled

#### HR estimation using remote PPG with multi-objective optimization

- Semi blind source extraction method Optimizing method
- Face ROI and Spatial avg
- Pulse and feature extraction
- MAICA (Multi-objective Opt. With Autocorrelation as a periodicity measurement and ICA)

## Exploring the usage of time-of-flight cameras for contact and remote PPG

- ToF camera type Pico Flexx ToF
- Own Data!!

## RPPG using nonlinear mode decomposition

- PURE dataset
- NonLinear Mode Decomposition

## Non-Contact PPG and Instantaneous HR estimation from infrared face video

- Principle signal extraction method
- Code: https://github.com/natalialmg/IR iHR

## 3D CNN for remote pulse HR measurement and mapping from facial video

- COHFACE Dataset: https://www.idiap.ch/dataset/cohface/download-proc
- 3D CNN

#### Might check later

• <a href="https://www.jimmynewland.com/wp/">https://www.jimmynewland.com/wp/</a>

## A novel framework for rPPG pulse extraction on compressed videos

- Benchmark dataset own!
- Video compression artifacts
  - Amplitude deterioration
  - High-freq. Noise
  - trace discontinuity
- Methodology
  - Singular spectrum analysis (SSA)
  - Reconstruction component (RC)

## A comparative Survey of Methods for remote HR detection from frontal face videos

- MAHNOB-HCI dataset
- Survey paper

## Algorithmic principles of remote PPG

- Own dataset of 60 people
- Comparison between existing methods
- rPPG model: Specular and Diffuse reflection: [rPPG methods extract the diffuse reflection from the input video]

## Amplitude selective filtering for remote PPG

- Own dataset
- R channel AS and band pass filter

## Remote HR measurement from highly compressed facial videos: An End-to-end Deep learning solution with video enhancement. (https://arxiv.org/pdf/1907.11921v1.pdf)

- Two stage Enhancement and Attenuation network
- STVEN and rPPGNet

## RhythmNet: End-to-end HR estimation from face via spatio-temporal representation

VIPL-HR databases.

## Non-contact heart rate monitoring by combining convolutional neural network skin detection and remote photoplethysmography via a low-cost camera

- CNN to get skin (ROI),
- then rppg methods (ICA or PCA)

## Vision-Based Heart Rate Estimation Via A Two-Stream CNN

COHFACE databaset

## Real-time rPPG monitoring

## A Real-Time Contactless Pulse Rate and Motion Status Monitoring System Based on Complexion Tracking

- NIR camera on FPGA
- Transfer to mobile for processing
- BPM detection.
- Motion/skin detection

#### Remote heart rate monitoring - Assessment of the Facereader rPPg by Noldus

- Facereader app
- BPM only

# Optimizing Remote Photoplethysmography Using Adaptive Skin Segmentation for Real-Time Heart Rate Monitoring

Proper ROI selection

#### Remote heart rate measurement using low-cost RGB face video: a technical literature review

• A review itself.

#### HeartTrack: Convolutional neural network for remote video-based heart rate monitoring

- Synthetic dataset
- CNN based 3D architecture

#### Github Links: Dataset, Database, Code

- Dataset: https://github.com/partofthestars/LGI-PPGI-DB
- Code: https://github.com/pi-null-mezon/vpglib
- <a href="https://github.com/partofthestars/PPGI-Toolbox">https://github.com/partofthestars/PPGI-Toolbox</a>
- <a href="https://github.com/ymonno/RemotePPG">https://github.com/ymonno/RemotePPG</a>
- https://github.com/habom2310/Heart-rate-measurement-using-camera
- <a href="https://github.com/danmcduff/iphys-toolbox">https://github.com/danmcduff/iphys-toolbox</a>
- https://github.com/vladostan/Dataset-for-video-based-pulse-detection
- Dataset: <a href="ftp://ftp.merl.com/pub/tmarks/MR">ftp://ftp.merl.com/pub/tmarks/MR</a> NIRP dataset/

## **IR Fever Detection:**

http://www.infrared.avio.co.jp/en/products/ir-thermo/lineup/tvs200is\_tvs500is/index.html

https://www.photonics.com/Articles/Demand for FLIR Temperature Screening Devices/a65632

https://satir.com/application/thermal-imaging-and-fever-detection

https://journals.plos.org/plosone/article?id=10.1371/journal.pone.0203302

https://iopscience.iop.org/book/978-0-7503-1143-4/chapter/bk978-0-7503-1143-4ch5

\*http://www.thermoteknix.com/products/oem-thermal-imaging/fevir-scan-fever-screening-system/ https://www.optotherm.com/ts-advantages.htm

https://www.hikvision.com/en/products/Thermal-Products/Thermal-products/Thermal-cameras/fever-screening-series/

https://athena-security.com/