

Scuola di Dottorato in Ingegneria dell'Informazione

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Progetto Eureka

Ambient Intelligence: Computational Audio Processing For Human Fall Detection

- Introduction
- Dataset
 - FAS
 - A3FALL Dataset
- Supervised Approaches
 - Multi-class SVM
 - Binary SVM
- Unsupervised Approach
 - OCSVM
 - End-To-End CNN-AE
- Weakly-supervised Approach
 - OCSVM + Template Matching
 - User-Aided
 - Few-shot Siamese Neural Networks
 - OneShot Siamese Autoencoders
- Other Contributions
- Conclusions
- References

Human fall: a real problem for society

"And why do we fall, Bruce? So we can learn to pick ourselves up" cit. Batman Begins

- 62% of injury-related hospitalizations for the people over 65 years are the result of a fall [1]
- main cause of death due to accidents for people over 65 [2]
- can lead to psychophysical repercussions on people [3]

What can be done whit FCS

- Monitoring of the elderly or people who live alone
- Assistance time reduction

Fall Classification System Challenge [4]

- Try to collect sufficient human fall data
 - Supervised methods (SVM): HF in training
 - difficulty in retrieving examples that represent human falls
- Deal with no human fall data
 - Novelty detection approach (OCSVM)
 - good description of "normality"

Related Work

- Wearable
 - Accelerometers
 - Gyroscopes
- Ambient
 - Vision System
 - Audio microphone
 - Radar doppler

Fall Event



Motivations and Contributions

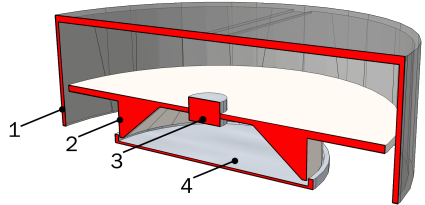


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Floor Acoustic Sensor[5]

1. The outer container
2. The inner container
3. The microphone slot
4. The membrane touching the floor



Advantage

- Easily integrated into the environment
- More sensitive to signals related to falls

3D printed prototype



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The fall events dataset: A3Fall

motivazione: mancanza di dataset audio adeguati descrizione generale:
descrizione 3 stanze



The recording setup

strumentazione: microfoni (fas e aerei + randy + sceda audio +
marche microfoni)

Description

aggiungere qualcosa sulla sinistra

Class	R0	R1	R2
Nr. of occurrences			
Basket	64	40	40
Fork	64	40	40
Ball	64	40	40
Book	64	40	40
Bag	64	30	40
Chair	96	40	40
Table	0	40	40
Guitar Slide	0	40	40
Nipper	0	40	40
Keys	0	40	40
Hook	0	40	40
Coat Hook	0	40	40
Manikin Doll	44	0	0
Human Fall	0	40	40
Total length (s)			
Background	2530	9055	5550



confronto nel channel e SNR tra fas e aerial

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End-to-End Unsupervised Network for Audio Timbre Transfer

Conclusions



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Conferences and Workshop

- **WIRN 2016:** 26th Italian Workshop on Neural Networks, May 18-20 2016, Vietri sul Mare, Salerno, Italy *[1 oral presentation]*
- **EUSIPCO 2017:** 25th European Signal Processing Conference, 28 Ago.-2 Sept. 2017, Kos Island, Greece *[1 oral presentation]*
- **WIRN 2018:** 28th Italian Workshop on Neural Networks, 13-15 June 2018, Vietri sul Mare, Salerno, Italy *[1 oral presentation]*
- **EUSIPCO 2018:** 28th edition of the European Signal Processing Conference, Sept. 3-7 2018, Rome, Italy *[1 poster]*

In addition:

- Speaker: “Le nuove applicazioni dell’Intelligenza Artificiale in ambito musicale”, workshop at **Acusmatiq XII** - international festival of electronic, electro-acoustic and experimental music, 28 - 30 July 2017, Ancona, Italy



Training Activity

- **Courses:**

- “Progettare la ricerca: i progetti europei”, Prof. Nicola Paone
- “Economia e Management del Trasferimento Tecnologico”, Prof. Donato Iacobucci

- **Seminars:**

- “Automated Prominent Nucleoli Detection in Cancer Cells”, Dr. Hwee Kuan Lee
- “Tecniche di Elaborazione Numerica dei Segnali Applicata alla Sintesi della Canna d'Organo”, Ing. Carlo Zinato
- “Robustness Analysis of Binaural Loudspeaker Reproduction”, Prof. Risheng Xia - Feb. 21 2017
- “From signal representations to musical creation: a geometric approach”, Dott. Carmine Cella - Mar. 16 2017
- “Tecnologie Elettroniche nei Centri Dati di Google”, Dott. Anthony Tonizzo - May 17 2017



Training Activity

Other:

- Corso di Perfezionamento post laurea in *Computer Music Production* organized by *UnivPm* - **Awarded Certificate**
- Integrative activity organized by the “Contamination LAB” concerning self-entrepreneurship - **Best Pitch Winner** (Team)
- Reviewer for international journals (IEEE Transactions on Emerging Topics in Computational Intelligence, Information Processing in Agriculture) and international conferences (WIRN2016, IJCNN 2017, IJCNN 2018, ICONIP 2018).

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M. Mubashir, L. Shao, and L. Seed,
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S. Abbate, M. Avvenuti, P. Corsini, J. Light, and A. Vecchio,
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“Acoustic cues from the floor: a new approach for fall classification,”
Expert Systems with Applications, vol. 60, pp. 51–61, 2016.

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in *Computer Vision and Pattern Recognition, 2005. CVPR 2005. IEEE Computer Society Conference on*. IEEE, 2005, vol. 1, pp. 539–546.
-  D. Droghini, E. Principi, S. Squartini, P. Olivetti, and P. F.,
“Human fall detection by using an innovative floor acoustic sensor,”
in *Proc. of WIRN*. Vietri sul Mare, Italy, May, 18-20 2016,
(8 pages), to appear.
-  J. Bromley, I. Guyon, Y. LeCun, E. Säckinger, and R. Shah,
“Signature verification using a” siamese” time delay neural network,”
in *Advances in Neural Information Processing Systems*, 1994, pp. 737–744.
-  G. Koch, R. Zemel, and R. Salakhutdinov,
“Siamese neural networks for one-shot image recognition,”
in *ICML Deep Learning Workshop*, 2015, vol. 2.



References (3)

-  D. Droghini, D. Ferretti, E. Principi, S. Squartini, and F. Piazza,
“A combined one-class svm and template matching approach for user-aided human
fall detection by means of floor acoustic features,”
Computational Intelligence and Neuroscience, vol. 2017, 2017,
Article ID 1512670.

Publications List (1)


International Journal:

[3 articles, 2 first author]

-  [1] E. Marchi, F. Vesperini, S. Squartini, and B. Schuller,
“Deep recurrent neural network-based autoencoders for acoustic novelty detection,”
Computational Intelligence and Neuroscience, 2016.
-  [2] F. Vesperini, P. Vecchiotti, E. Principi, S. Squartini, and F. Piazza,
“Localizing speakers in multiple rooms by using deep neural networks,”
Computer Speech and Language, 2017.

International Journal (submitted):

[1 article, 1 first author]





-  [1] F. Vesperini, L. Gabrielli, E. Principi, and S. Squartini,
“Polyphonic sound event detection by using capsule neural networks,”
Journal of Selected Topics in Signal Processing, 2018, submitted.

International Conference:

[14 articles, 5 first author]

-  [1] E. Marchi, F. Vesperini, F. Eyben, S. Squartini, and B. Schuller,
“A Novel Approach for Automatic Acoustic Novelty Detection Using a Denoising
Autoencoder with Bidirectional LSTM Neural Networks,”
in *Proc. of ICASSP*, Brisbane, Australia, 19-24 Apr. 2015, IEEE.





Publications List (2)

-  [2] E. Marchi, F. Vesperini, F. Weninger, F. Eyben, S. Squartini, and B. Schuller, “Non-Linear Prediction with LSTM Recurrent Neural Networks for Acoustic Novelty Detection,” in *Proc. of IJCNN*, Killarney, Ireland, 12-16 Jul. 2015, IEEE.
-  [3] F. Vesperini, P. Vecchiotti, E. Principi, S. Squartini, and F. Piazza, “Deep neural networks for multi-room voice activity detection: Advancements and comparative evaluation,” in *Proc. of IJCNN*, Vancouver, Canada, 24-29 Jul. 2016, IEEE, pp. 3391–3398.
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-  [6] F. Vesperini, P. Vecchiotti, E. Principi, S. Squartini, and F. Piazza,
“A neural network based algorithm for speaker localization in a multi-room
environment,”
in *Machine Learning for Signal Processing (MLSP), 2016 IEEE 26th International
Workshop on.* IEEE, 2016, pp. 1–6.
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“Acoustic novelty detection with adversarial autoencoders,”
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“A neural network approach for sound event detection in real life audio,”
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-  [9] L. Gabrielli, C. E. Cella, F. Vesperini, D. Droghini, E. Principi, and S. Squartini,
“Deep learning for timbre modification and transfer: An evaluation study,”
in *Proc. of 144th AES*, Milan, Italy, 24–26 May 2018, Audio Engineering Society.

Publications List (4)

-  [10] L. Ambrosini, L. Gabrielli, F. Vesperini, S. Squartini, and L. Cattani,
“Deep neural networks for road surface roughness classification from acoustic signals,”
in *Proc. of 144th AES*, Milan, Italy, 24-26 May 2018, Audio Engineering Society.
-  [11] F. Vesperini, A. Galli, L. Gabrielli, E. Principi, and S. Squartini,
“Snore sounds excitation localization by using scattering transform and deep neural networks,”
in *Proc. of IJCNN*, Rio de Janeiro, Brasil, 8-13 Jul. 2018, IEEE.
-  [12] F. Vesperini, D. Droghini, E. Principi, L. Gabrielli, and S. Squartini,
“Hierarchic ConvNets framework for rare sound event detection,”
in *Proc. of EUSIPCO*. IEEE, Sept. 3-7 2018.
-  [13] F. Vesperini, L. Romeo, E. Principi, A. Monteriù, and S. Squartini,
“Convolutional recurrent neural networks and acoustic data augmentation for snore detection,”
in *Proc. of WIRN*, Vietri sul Mare, Italy, 13-15 Jun. 2018.

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[14] D. Droghini, F. Vesperini, E. Principi, S. Squartini, and F. Piazza,
“Few-shot siamese neural networks employing audio features for human-fall
detection,”
in *Proc. of The International Conference on Pattern Recognition and Artificial
Intelligence*, Union, NJ, USA, Aug. 15-17 2018.

Others:



F. Vesperini, D. Droghini, D. Ferretti, E. Principi, L. Gabrielli, S. Squartini, and
F. Piazza,
“A hierarchic multi-scaled approach for rare sound event detection,”
Ancona, Italy, 2017, DCASE Tech. Report. Copyright-free.



F. Vesperini, L. Gabrielli, E. Principi, and S. Squartini,
“A capsule neural networks based approach for bird audio detection,”
Ancona, Italy, 2018, DCASE Tech. Report. Copyright-free.



L. Gabrielli, F. Vesperini, D. Droghini, and S. Squartini,
“Rima Glottidis: Experimenting generative raw audio synthesis for a sound
installation,”
in *XXII Colloquium of Musical Informatics*, Udine, Italy, 20-23 Nov. 2018.