

Optimal control strategies for a hybrid renewable energy system: an ALANN/RNN technique

Soft Computing

December 2019, Volume 23, Issue 24, pp 13459–13475 | Cite as

- K. Mahendran (1) Email author (mahendrank1104@gmail.com)
- S. U. Prabha (2)

1. Department of Electrical and Electronics Engineering, Jansons Institute of Technology, , Coimbatore, India
2. Department of Electrical and Electronics Engineering, Sri Ramakrishna Engineering College, , Coimbatore, India

Methodologies and Application
First Online: 06 March 2019

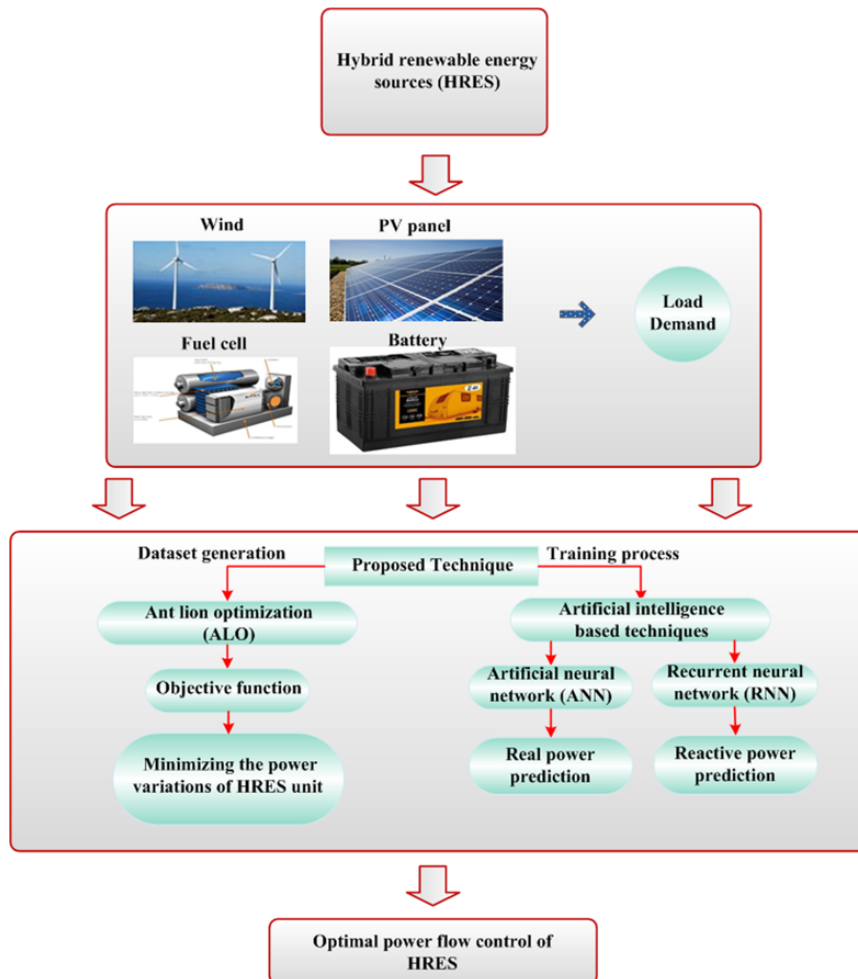
- 85 Downloads

Abstract

In this paper, optimal control strategy for the power flow management of the grid-connected hybrid renewable energy system (HRES) is proposed. The proposed control strategy is the parallel execution of both the ant lion optimization with artificial neural network (ANN) and recurrent neural network (RNN), and hence it is named as ALANN/RNN. Here, the HRES is made out of photovoltaic, wind turbine, fuel cell, and battery which is associated with the DC link and can adjust the real and reactive power. The proposed ALANN/RNN technique predicts the required control gain parameters of the HRES to maintain the power flow based on the active and reactive power variation in the load side. To predict the control gain parameters, the proposed technique considers power balance constraints like renewable energy accessibility and load side power demand. By using the proposed technique, power flow variations between the source side and the load side and the operational cost of HRES in light of weekly and daily prediction grid electricity prices have been minimized. In the HRES unit, the power flow management of grid is accomplished while controlling the PI controller for producing the optimal control pulses of the DC/DC converter. The proposed method is actualized in MATLAB/Simulink working stage, and the effectiveness is analyzed via the comparison analysis using the existing techniques such as SPC, GA, PSO and BAT technique. The comparison results demonstrate that the occurrence of proposed approach confirms its ability for controlling the power flow in the HRES system.

Graphical Abstract

An optimal control strategy for the power flow management of the grid-connected hybrid renewable energy system (HRES) is proposed. The proposed control strategy is the joined execution of both the ant lion optimization (ALO) with artificial neural network (ANN) and recurrent neural network (RNN), and hence it is named as ALANN/RNN. ALO is utilized to minimizing the power variations of the HRES units. ANN is used for real power prediction, and RNN is utilized for reactive power prediction.



Keywords

HRES PV WT FC Battery ANN RNN ALO Power flow
Active and reactive power control strategy

Communicated by V. Loia.

This is a preview of subscription content, [log in](#) to check access.

Notes

Compliance with ethical standards

Conflict of interest

Authors declare that they have no conflict of interest.

Ethical approval

This article does not contain any studies with human participants performed by any of the authors.

Publisher's Note

Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

References

Aboubakeur H, Khaled A, Mohamed B (2018) A WCA-based optimization of a fuzzy sliding-mode controller for stand-alone hybrid renewable power system. *Soft Comput.* <https://doi.org/10.1007/s00500-018-3415-3> (<https://doi.org/10.1007/s00500-018-3415-3>)

[CrossRef](https://doi.org/10.1007/s00500-018-3415-3) (<https://doi.org/10.1007/s00500-018-3415-3>)

[Google Scholar](http://scholar.google.com/scholar_lookup?title=A%20WCA-based%20optimization%20of%20a%20fuzzy%20sliding-mode%20controller%20for%20stand-alone%20hybrid%20renewable%20power%20system&author=H.%20Aboubakeur&author=A.%20Khaled&author=B.%20Mohamed&journal=Soft%20Comput&publication_year=2018&doi=10.1007%2Fs00500-018-3415-3) (http://scholar.google.com/scholar_lookup?title=A%20WCA-based%20optimization%20of%20a%20fuzzy%20sliding-mode%20controller%20for%20stand-alone%20hybrid%20renewable%20power%20system&author=H.%20Aboubakeur&author=A.%20Khaled&author=B.%20Mohamed&journal=Soft%20Comput&publication_year=2018&doi=10.1007%2Fs00500-018-3415-3)

Abualigah LM, Khader AT (2017) Unsupervised text feature selection technique based on hybrid particle swarm optimization algorithm with genetic operators for the text clustering. *J Supercomput* 73(11):4773–4795. <https://doi.org/10.1007/s11227-017-2046-2> (<https://doi.org/10.1007/s11227-017-2046-2>)

[CrossRef](https://doi.org/10.1007/s11227-017-2046-2) (<https://doi.org/10.1007/s11227-017-2046-2>)

[Google Scholar](http://scholar.google.com/scholar_lookup?title=Unsupervised%20text%20feature%20selection%20technique%20based%20on%20hybrid%20particle%20swarm%20optimization%20algorithm%20with%20genetic%20operators%20for%20the%20text%20clustering&author=LM.%20Abualigah&author=AT.%20Khader&journal=J%20Supercomput&volume=73&issue=11&pages=4773-4795&publication_year=2017&doi=10.1007%2Fs11227-017-2046-2) (http://scholar.google.com/scholar_lookup?title=Unsupervised%20text%20feature%20selection%20technique%20based%20on%20hybrid%20particle%20swarm%20optimization%20algorithm%20with%20genetic%20operators%20for%20the%20text%20clustering&author=LM.%20Abualigah&author=AT.%20Khader&journal=J%20Supercomput&volume=73&issue=11&pages=4773-4795&publication_year=2017&doi=10.1007%2Fs11227-017-2046-2)

Abualigah LM, Khader AT, Hanandeh ES (2018a) A combination of objective functions and hybrid krill herd algorithm for text document clustering analysis. *Eng Appl Artif Intell* 73:111–125. <https://doi.org/10.1016/j.engappai.2018.05.003> (<https://doi.org/10.1016/j.engappai.2018.05.003>)

[CrossRef](https://doi.org/10.1016/j.engappai.2018.05.003) (<https://doi.org/10.1016/j.engappai.2018.05.003>)

[Google Scholar](http://scholar.google.com/scholar_lookup?title=A%20combination%20of%20objective%20functions%20and%20hybrid%20krill%20herd%20algorithm%20for%20text%20document%20clustering%20analysis&aut) (http://scholar.google.com/scholar_lookup?title=A%20combination%20of%20objective%20functions%20and%20hybrid%20krill%20herd%20algorithm%20for%20text%20document%20clustering%20analysis&aut)

hor=LM.%20Abualigah&author=AT.%20Khader&author=ES.%20Hanandeh&journal=Eng%20Appl%20Artif%20Intell&volume=73&pages=111-125&publication_year=2018&doi=10.1016%2Fj.engappai.2018.05.003)

Abualigah LM, Khader AT, Hanandeh ES (2018b) Hybrid clustering analysis using improved krill herd algorithm. *Appl Intell*. <https://doi.org/10.1007/s10489-018-1190-6> (<https://doi.org/10.1007/s10489-018-1190-6>)

[CrossRef](https://doi.org/10.1007/s10489-018-1190-6) (<https://doi.org/10.1007/s10489-018-1190-6>)

[Google Scholar](http://scholar.google.com/scholar_lookup?title=Hybrid%20clustering%20analysis%20using%20improved%20krill%20herd%20algorithm&author=LM.%20Abualigah&author=AT.%20Khader&author=ES.%20Hanandeh&journal=Appl%20Intell&publication_year=2018&doi=10.1007%2Fs10489-018-1190-6) (http://scholar.google.com/scholar_lookup?title=Hybrid%20clustering%20analysis%20using%20improved%20krill%20herd%20algorithm&author=LM.%20Abualigah&author=AT.%20Khader&author=ES.%20Hanandeh&journal=Appl%20Intell&publication_year=2018&doi=10.1007%2Fs10489-018-1190-6)

Aktas A, Erhan K, Ozdemir S, Ozdemir E (2017) Experimental investigation of a new smart energy management algorithm for a hybrid energy storage system in smart grid applications. *Electr Power Syst Res* 144:185–196.

<https://doi.org/10.1016/j.epsr.2016.11.022> (<https://doi.org/10.1016/j.epsr.2016.11.022>)

[CrossRef](https://doi.org/10.1016/j.epsr.2016.11.022) (<https://doi.org/10.1016/j.epsr.2016.11.022>)

[Google Scholar](http://scholar.google.com/scholar_lookup?title=Experimental%20investigation%20of%20a%20new%20smart%20energy%20management%20algorithm%20for%20a%20hybrid%20energy%20storage%20system%20in%20smart%20grid%20applications&author=A.%20Aktas&author=K.%20Erhan&author=S.%20Ozdemir&author=E.%20Ozdemir&journal=Electr%20Power%20Syst%20Res&volume=144&pages=185-196&publication_year=2017&doi=10.1016%2Fj.epsr.2016.11.022) (http://scholar.google.com/scholar_lookup?title=Experimental%20investigation%20of%20a%20new%20smart%20energy%20management%20algorithm%20for%20a%20hybrid%20energy%20storage%20system%20in%20smart%20grid%20applications&author=A.%20Aktas&author=K.%20Erhan&author=S.%20Ozdemir&author=E.%20Ozdemir&journal=Electr%20Power%20Syst%20Res&volume=144&pages=185-196&publication_year=2017&doi=10.1016%2Fj.epsr.2016.11.022)

Al-Sai ZA, Abualigah LM (2017) Big data and E-government: a review. In: *Proceedings of the 8th international conference on information technology (ICIT)*, Amman, pp 580–587. <https://doi.org/10.1109/icitech.2017.8080062> (<https://doi.org/10.1109/icitech.2017.8080062>)

Baghaee H, Mirsalim M, Gharehpetian G, Talebi H (2017) A decentralized power management and sliding mode control strategy for hybrid AC/DC microgrids including renewable energy resources. *IEEE Trans Ind Inform*.

<https://doi.org/10.1109/tii.2017.2677943> (<https://doi.org/10.1109/tii.2017.2677943>)

[CrossRef](https://doi.org/10.1109/tii.2017.2677943) (<https://doi.org/10.1109/tii.2017.2677943>)

[Google Scholar](http://scholar.google.com/scholar_lookup?title=A%20decentralized%20power%20management%20and%20sliding%20mode%20control%20strategy%20for%20hybrid%20AC%2FDC%20microgrids%20including%20renewable%20energy%20resources&author=H.%20Baghaee&author=M.%20Mirsalim&author=G.%20Gharehpetian&author=H.%20Talebi&journal=IEEE%20Trans%20Ind%20Inform&publication_year=2017&doi=10.1109%2Ftii.2017.2677943) (http://scholar.google.com/scholar_lookup?title=A%20decentralized%20power%20management%20and%20sliding%20mode%20control%20strategy%20for%20hybrid%20AC%2FDC%20microgrids%20including%20renewable%20energy%20resources&author=H.%20Baghaee&author=M.%20Mirsalim&author=G.%20Gharehpetian&author=H.%20Talebi&journal=IEEE%20Trans%20Ind%20Inform&publication_year=2017&doi=10.1109%2Ftii.2017.2677943)

Bahmani-Firouzi B, Azizipanah-Abarghooee R (2014) Optimal sizing of battery energy storage for micro-grid operation management using a new improved bat algorithm. *Int J Electr Power Energy Syst* 56:42–54. <https://doi.org/10.1016/j.ijepes.2013.10.019> (<https://doi.org/10.1016/j.ijepes.2013.10.019>)

[CrossRef](https://doi.org/10.1016/j.ijepes.2013.10.019) (<https://doi.org/10.1016/j.ijepes.2013.10.019>)

[Google Scholar](http://scholar.google.com/scholar_lookup?title=Optimal%20sizing%20of%20battery%20energy%20storage%20for%20micro-grid%20operation%20management%20using%20a%20new%20improved%20bat%20algorithm&author=B.%20Bahmani-Firouzi&author=R.%20Azizipanah-Abarghooee&journal=Int%20J%20Electr%20Power%20Energy%20Syst&volume=56&pages=42-54&publication_year=2014&doi=10.1016%2Fj.ijepes.2013.10.019) (http://scholar.google.com/scholar_lookup?title=Optimal%20sizing%20of%20battery%20energy%20storage%20for%20micro-grid%20operation%20management%20using%20a%20new%20improved%20bat%20algorithm&author=B.%20Bahmani-Firouzi&author=R.%20Azizipanah-Abarghooee&journal=Int%20J%20Electr%20Power%20Energy%20Syst&volume=56&pages=42-54&publication_year=2014&doi=10.1016%2Fj.ijepes.2013.10.019)

Barklund E, Pogaku N, Prodanovic M et al. (2007) Energy management system with stability constraints for stand-alone autonomous microgrid. In: 2007 IEEE international conference on system of systems engineering, Oshawa.
<https://doi.org/10.1109/sysose.2007.4304233>
 (https://doi.org/10.1109/sysose.2007.4304233)

Basaran K, Cetin N, Borekci S (2017) Energy management for on-grid and off-grid wind/PV and battery hybrid systems. IET Renew Power Gener 11:642–649.
<https://doi.org/10.1049/iet-rpg.2016.0545> (https://doi.org/10.1049/iet-rpg.2016.0545)

CrossRef (https://doi.org/10.1049/iet-rpg.2016.0545)

Google Scholar (http://scholar.google.com/scholar_lookup?title=Energy%20management%20for%20on-grid%20and%20off-grid%20wind%20FPV%20and%20battery%20hybrid%20systems&author=K.%20Basaran&author=N.%20Cetin&author=S.%20Borekci&journal=IET%20Renew%20Power%20Gener&volume=11&pages=642-649&publication_year=2017&doi=10.1049%2Fiet-rpg.2016.0545)

Blaabjerg F, Chen Z, Kjaer S (2004) Power electronics as efficient interface in dispersed power generation systems. IEEE Trans Power Electron 19:1184–1194.
<https://doi.org/10.1109/tpel.2004.833453>
 (https://doi.org/10.1109/tpel.2004.833453)

CrossRef (https://doi.org/10.1109/tpel.2004.833453)

Google Scholar (http://scholar.google.com/scholar_lookup?title=Power%20electronics%20as%20efficient%20interface%20in%20dispersed%20power%20generation%20systems&author=F.%20Blaabjerg&author=Z.%20Chen&author=S.%20Kjaer&journal=IEEE%20Trans%20Power%20Electron&volume=19&pages=1184-1194&publication_year=2004&doi=10.1109%2Ftpel.2004.833453)

Blaabjerg F, Teodorescu R, Liserre M, Timbus A (2006) Overview of control and grid synchronization for distributed power generation systems. IEEE Trans Ind Electron 53:1398–1409. <https://doi.org/10.1109/tie.2006.881997>
 (https://doi.org/10.1109/tie.2006.881997)

CrossRef (https://doi.org/10.1109/tie.2006.881997)

Google Scholar (http://scholar.google.com/scholar_lookup?title=Overview%20of%20control%20and%20grid%20synchronization%20for%20distributed%20power%20generation%20systems&author=F.%20Blaabjerg&author=R.%20Teodorescu&author=M.%20Liserre&author=A.%20Timbus&journal=IEEE%20Trans%20Ind%20Electron&volume=53&pages=1398-1409&publication_year=2006&doi=10.1109%2Ftie.2006.881997)

Bohte S, Kok J, La Poutré H (2002) Error-backpropagation in temporally encoded networks of spiking neurons. Neurocomputing 48:17–37.
[https://doi.org/10.1016/s0925-2312\(01\)00658-0](https://doi.org/10.1016/s0925-2312(01)00658-0) (https://doi.org/10.1016/s0925-2312(01)00658-0)

CrossRef (https://doi.org/10.1016/s0925-2312(01)00658-0)

zbMATH (http://www.emis.de/MATH-item?1006.68760)

Google Scholar (http://scholar.google.com/scholar_lookup?title=Error-backpropagation%20in%20temporally%20encoded%20networks%20of%20spiking%20neurons&author=S.%20Bohte&author=J.%20Kok&author=H.%20Poutr%C3%A9&journal=Neurocomputing&volume=48&pages=17-37&publication_year=2002&doi=10.1016%2Fs0925-2312%2801%2900658-0)

Bojoi R, Limongi L, Roiu D, Tenconi A (2011) Enhanced power quality control strategy for single-phase inverters in distributed generation systems. IEEE Trans Power Electron 26:798–806. <https://doi.org/10.1109/tpel.2010.2103572>
 (https://doi.org/10.1109/tpel.2010.2103572)

CrossRef (<https://doi.org/10.1109/tpel.2010.2103572>)

Google Scholar ([http://scholar.google.com/scholar_lookup?](http://scholar.google.com/scholar_lookup?title=Enhanced%20power%20quality%20control%20strategy%20for%20single-phase%20inverters%20in%20distributed%20generation%20systems&author=R.%20Bojoi&author=L.%20Limongi&author=D.%20Roiu&author=A.%20Tenconi&journal=IEEE%20Trans%20Power%20Electron&volume=26&pages=798-806&publication_year=2011&doi=10.1109%2Ftpel.2010.2103572)

[title=Enhanced%20power%20quality%20control%20strategy%20for%20single-phase%20inverters%20in%20distributed%20generation%20systems&author=R.%20Bojoi&author=L.%20Limongi&author=D.%20Roiu&author=A.%20Tenconi&journal=IEEE%20Trans%20Power%20Electron&volume=26&pages=798-806&publication_year=2011&doi=10.1109%2Ftpel.2010.2103572](http://scholar.google.com/scholar_lookup?title=Enhanced%20power%20quality%20control%20strategy%20for%20single-phase%20inverters%20in%20distributed%20generation%20systems&author=R.%20Bojoi&author=L.%20Limongi&author=D.%20Roiu&author=A.%20Tenconi&journal=IEEE%20Trans%20Power%20Electron&volume=26&pages=798-806&publication_year=2011&doi=10.1109%2Ftpel.2010.2103572))

Caisheng W, Nehrir M (2008) Power management of a stand-alone wind/photovoltaic/fuel cell energy system. *IEEE Trans Energy Convers* 23:957–967.

<https://doi.org/10.1109/tec.2007.914200>

(<https://doi.org/10.1109/tec.2007.914200>)

CrossRef (<https://doi.org/10.1109/tec.2007.914200>)

Google Scholar ([http://scholar.google.com/scholar_lookup?](http://scholar.google.com/scholar_lookup?title=Power%20management%20of%20a%20stand-alone%20wind%2Fphotovoltaic%2Ffuel%20cell%20energy%20system&author=W.%20Caisheng&author=M.%20Nehrir&journal=IEEE%20Trans%20Energy%20Convers&volume=23&pages=957-967&publication_year=2008&doi=10.1109%2Ftec.2007.914200)

[title=Power%20management%20of%20a%20stand-alone%20wind%2Fphotovoltaic%2Ffuel%20cell%20energy%20system&author=W.%20Caisheng&author=M.%20Nehrir&journal=IEEE%20Trans%20Energy%20Convers&volume=23&pages=957-967&publication_year=2008&doi=10.1109%2Ftec.2007.914200](http://scholar.google.com/scholar_lookup?title=Power%20management%20of%20a%20stand-alone%20wind%2Fphotovoltaic%2Ffuel%20cell%20energy%20system&author=W.%20Caisheng&author=M.%20Nehrir&journal=IEEE%20Trans%20Energy%20Convers&volume=23&pages=957-967&publication_year=2008&doi=10.1109%2Ftec.2007.914200))

Camacho A, Castilla M, Miret J et al (2015) Active and reactive power strategies with peak current limitation for distributed generation inverters during unbalanced grid faults. *IEEE Trans Ind Electron* 62:1515–1525.

<https://doi.org/10.1109/tie.2014.2347266>

(<https://doi.org/10.1109/tie.2014.2347266>)

CrossRef (<https://doi.org/10.1109/tie.2014.2347266>)

Google Scholar ([http://scholar.google.com/scholar_lookup?](http://scholar.google.com/scholar_lookup?title=Active%20and%20reactive%20power%20strategies%20with%20peak%20current%20limitation%20for%20distributed%20generation%20inverters%20during%20unbalanced%20grid%20faults&author=A.%20Camacho&author=M.%20Castilla&author=J.%20Miret&journal=IEEE%20Trans%20Ind%20Electron&volume=62&pages=1515-1525&publication_year=2015&doi=10.1109%2Ftie.2014.2347266)

[title=Active%20and%20reactive%20power%20strategies%20with%20peak%20current%20limitation%20for%20distributed%20generation%20inverters%20during%20unbalanced%20grid%20faults&author=A.%20Camacho&author=M.%20Castilla&author=J.%20Miret&journal=IEEE%20Trans%20Ind%20Electron&volume=62&pages=1515-1525&publication_year=2015&doi=10.1109%2Ftie.2014.2347266](http://scholar.google.com/scholar_lookup?title=Active%20and%20reactive%20power%20strategies%20with%20peak%20current%20limitation%20for%20distributed%20generation%20inverters%20during%20unbalanced%20grid%20faults&author=A.%20Camacho&author=M.%20Castilla&author=J.%20Miret&journal=IEEE%20Trans%20Ind%20Electron&volume=62&pages=1515-1525&publication_year=2015&doi=10.1109%2Ftie.2014.2347266))

Camacho-Gómez C, Jiménez-Fernández S, Mallol-Poyato R, Del Ser J, Salcedo-Sanz S (2018) Optimal design of Microgrid's network topology and location of the distributed renewable energy resources using the Harmony Search algorithm. *Soft Comput.*

<https://doi.org/10.1007/s00500-018-3300-0> (<https://doi.org/10.1007/s00500-018-3300-0>)

CrossRef (<https://doi.org/10.1007/s00500-018-3300-0>)

Google Scholar ([http://scholar.google.com/scholar_lookup?](http://scholar.google.com/scholar_lookup?title=Optimal%20design%20of%20Microgrid%E2%80%99s%20network%20topology%20and%20location%20of%20the%20distributed%20renewable%20energy%20resources%20using%20the%20Harmony%20Search%20algorithm&author=C.%20Camacho-G%C3%B3mez&author=S.%20Jim%C3%A9nez-Fern%C3%A1ndez&author=R.%20Mallol-Poyato&author=J.%20DelSer&author=S.%20Salcedo-Sanz&journal=Soft%20Comput&publication_year=2018&doi=10.1007%2Fs00500-018-3300-0)

[title=Optimal%20design%20of%20Microgrid%E2%80%99s%20network%20topology%20and%20location%20of%20the%20distributed%20renewable%20energy%20resources%20using%20the%20Harmony%20Search%20algorithm&author=C.%20Camacho-G%C3%B3mez&author=S.%20Jim%C3%A9nez-Fern%C3%A1ndez&author=R.%20Mallol-Poyato&author=J.%20DelSer&author=S.%20Salcedo-Sanz&journal=Soft%20Comput&publication_year=2018&doi=10.1007%2Fs00500-018-3300-0](http://scholar.google.com/scholar_lookup?title=Optimal%20design%20of%20Microgrid%E2%80%99s%20network%20topology%20and%20location%20of%20the%20distributed%20renewable%20energy%20resources%20using%20the%20Harmony%20Search%20algorithm&author=C.%20Camacho-G%C3%B3mez&author=S.%20Jim%C3%A9nez-Fern%C3%A1ndez&author=R.%20Mallol-Poyato&author=J.%20DelSer&author=S.%20Salcedo-Sanz&journal=Soft%20Comput&publication_year=2018&doi=10.1007%2Fs00500-018-3300-0))

Dubey H, Pandit M, Panigrahi B (2016) Hydro-thermal-wind scheduling employing novel ant lion optimization technique with composite ranking index. *Renew Energy* 99:18–34. <https://doi.org/10.1016/j.renene.2016.06.039>

(<https://doi.org/10.1016/j.renene.2016.06.039>)

CrossRef (<https://doi.org/10.1016/j.renene.2016.06.039>)

Google Scholar (http://scholar.google.com/scholar_lookup?title=Hydro-thermal-wind%20scheduling%20employing%20novel%20ant%20lion%20optimization%20tec

hunique%20with%20composite%20ranking%20index&author=H.%20Dubey&author=M.%20Pandit&author=B.%20Panigrahi&journal=Renew%20Energy&volume=99&pages=18-34&publication_year=2016&doi=10.1016%2Fj.renene.2016.06.039)

Emadi A, Williamson S, Khaligh A (2006) Power electronics intensive solutions for advanced electric, hybrid electric, and fuel cell vehicular power systems. *IEEE Trans Power Electron* 21:567–577. <https://doi.org/10.1109/tpel.2006.872378>
(<https://doi.org/10.1109/tpel.2006.872378>)

CrossRef (<https://doi.org/10.1109/tpel.2006.872378>)

Google Scholar (http://scholar.google.com/scholar_lookup?title=Power%20electronics%20intensive%20solutions%20for%20advanced%20electric%2C%20hybrid%20electric%2C%20and%20fuel%20cell%20vehicular%20power%20systems&author=A.%20Emadi&author=S.%20Williamson&author=A.%20Khaligh&journal=IEEE%20Trans%20Power%20Electron&volume=21&pages=567-577&publication_year=2006&doi=10.1109%2Ftpel.2006.872378)

Harrison G, Piccolo A, Siano P, Wallace A (2008) Hybrid GA and OPF evaluation of network capacity for distributed generation connections. *Electr Power Syst Res* 78:392–398. <https://doi.org/10.1016/j.epsr.2007.03.008>
(<https://doi.org/10.1016/j.epsr.2007.03.008>)

CrossRef (<https://doi.org/10.1016/j.epsr.2007.03.008>)

Google Scholar (http://scholar.google.com/scholar_lookup?title=Hybrid%20GA%20and%20OPF%20evaluation%20of%20network%20capacity%20for%20distributed%20generation%20connections&author=G.%20Harrison&author=A.%20Piccolo&author=P.%20Siano&author=A.%20Wallace&journal=Electr%20Power%20Syst%20Res&volume=78&pages=392-398&publication_year=2008&doi=10.1016%2Fj.epsr.2007.03.008)

Higuita Cano M, Agbossou K, Kelouwani S, Dubé Y (2017) Experimental evaluation of a power management system for a hybrid renewable energy system with hydrogen production. *Renew Energy* 113:1086–1098. <https://doi.org/10.1016/j.renene.2017.06.066>
(<https://doi.org/10.1016/j.renene.2017.06.066>)

CrossRef (<https://doi.org/10.1016/j.renene.2017.06.066>)

Google Scholar (http://scholar.google.com/scholar_lookup?title=Experimental%20evaluation%20of%20a%20power%20management%20system%20for%20a%20hybrid%20renewable%20energy%20system%20with%20hydrogen%20production&author=M.%20Higuita%20Cano&author=K.%20Agbossou&author=S.%20Kelouwani&author=Y.%20Dub%C3%A9&journal=Renew%20Energy&volume=113&pages=1086-1098&publication_year=2017&doi=10.1016%2Fj.renene.2017.06.066)

Kefayat M, Lashkar Ara A, Nabavi Niaki S (2015) A hybrid of ant colony optimization and artificial bee colony algorithm for probabilistic optimal placement and sizing of distributed energy resources. *Energy Convers Manag* 92:149–161. <https://doi.org/10.1016/j.enconman.2014.12.037>
(<https://doi.org/10.1016/j.enconman.2014.12.037>)

CrossRef (<https://doi.org/10.1016/j.enconman.2014.12.037>)

Google Scholar (http://scholar.google.com/scholar_lookup?title=A%20hybrid%20of%20ant%20colony%20optimization%20and%20artificial%20bee%20colony%20algorithm%20for%20probabilistic%20optimal%20placement%20and%20sizing%20of%20distributed%20energy%20resources&author=M.%20Kefayat&author=A.%20Lashkar%20Ara&author=S.%20Nabavi%20Niaki&journal=Energy%20Convers%20Manag&volume=92&pages=149-161&publication_year=2015&doi=10.1016%2Fj.enconman.2014.12.037)

Khooban M, Niknam T (2015) A new intelligent online fuzzy tuning approach for multi-area load frequency control: self Adaptive Modified Bat Algorithm. *Int J Electr*

Power Energy Syst 71:254–261. <https://doi.org/10.1016/j.ijepes.2015.03.017>

(<https://doi.org/10.1016/j.ijepes.2015.03.017>)

CrossRef (<https://doi.org/10.1016/j.ijepes.2015.03.017>)

Google Scholar (http://scholar.google.com/scholar_lookup?

title=A%20new%20intelligent%20online%20fuzzy%20tuning%20approach%20for%20multi-area%20load%20frequency%20control%3A%20self%20Adaptive%20Modified%20Bat%20Algorithm&author=M.%20Khooban&author=T.%20Niknam&journal=Int%20J%20Electr%20Power%20Energy%20Syst&volume=71&pages=254-261&publication_year=2015&doi=10.1016%2Fj.ijepes.2015.03.017)

Lu B, Shahidehpour M (2005) Short-term scheduling of battery in a grid-connected PV/battery system. IEEE Trans Power Syst 20:1053–1061.

<https://doi.org/10.1109/tpwrs.2005.846060>

(<https://doi.org/10.1109/tpwrs.2005.846060>)

CrossRef (<https://doi.org/10.1109/tpwrs.2005.846060>)

Google Scholar (http://scholar.google.com/scholar_lookup?title=Short-term%20scheduling%20of%20battery%20in%20a%20grid-connected%20PV%2Fbattery%20system&author=B.%20Lu&author=M.%20Shahidehpour&journal=IEEE%20Trans%20Power%20Syst&volume=20&pages=1053-1061&publication_year=2005&doi=10.1109%2Ftpwrs.2005.846060)

connected%20PV%2Fbattery%20system&author=B.%20Lu&author=M.%20Shahidehpour&journal=IEEE%20Trans%20Power%20Syst&volume=20&pages=1053-1061&publication_year=2005&doi=10.1109%2Ftpwrs.2005.846060)

Mandal D, Pal S, Saha P (2007) Modeling of electrical discharge machining process using back propagation neural network and multi-objective optimization using non-dominating sorting genetic algorithm-II. J Mater Process Technol 186:154–162.

<https://doi.org/10.1016/j.jmatprotec.2006.12.030>

(<https://doi.org/10.1016/j.jmatprotec.2006.12.030>)

CrossRef (<https://doi.org/10.1016/j.jmatprotec.2006.12.030>)

Google Scholar (http://scholar.google.com/scholar_lookup?title=Modeling%20of%20electrical%20discharge%20machining%20process%20using%20back%20propagation%20neural%20network%20and%20multi-objective%20optimization%20using%20non-dominating%20sorting%20genetic%20algorithm-II&author=D.%20Mandal&author=S.%20Pal&author=P.%20Saha&journal=J%20Mater%20Process%20Technol&volume=186&pages=154-162&publication_year=2007&doi=10.1016%2Fj.jmatprotec.2006.12.030)

II&author=D.%20Mandal&author=S.%20Pal&author=P.%20Saha&journal=J%20Mater%20Process%20Technol&volume=186&pages=154-162&publication_year=2007&doi=10.1016%2Fj.jmatprotec.2006.12.030)

Menezes Morato M, da Costa Mendes P, Normey-Rico J, Bordons C (2017) Optimal operation of hybrid power systems including renewable sources in the sugar cane industry. IET Renew Power Gener 11:1237–1245. <https://doi.org/10.1049/iet-rpg.2016.0443>

(<https://doi.org/10.1049/iet-rpg.2016.0443>)

CrossRef (<https://doi.org/10.1049/iet-rpg.2016.0443>)

Google Scholar (http://scholar.google.com/scholar_lookup?title=Optimal%20operation%20of%20hybrid%20power%20systems%20including%20renewable%20sources%20in%20the%20sugar%20cane%20industry&author=M.%20Menezes%20Morato&author=Mendes%20P.%20Costa&author=J.%20Normey-Rico&author=C.%20Bordons&journal=IET%20Renew%20Power%20Gener&volume=11&pages=1237-1245&publication_year=2017&doi=10.1049%2Fiet-rpg.2016.0443)

title=Optimal%20operation%20of%20hybrid%20power%20systems%20including%20renewable%20sources%20in%20the%20sugar%20cane%20industry&author=M.%20Menezes%20Morato&author=Mendes%20P.%20Costa&author=J.%20Normey-Rico&author=C.%20Bordons&journal=IET%20Renew%20Power%20Gener&volume=11&pages=1237-1245&publication_year=2017&doi=10.1049%2Fiet-rpg.2016.0443)

Mirjalili S (2015) The ant lion optimizer. Adv Eng Softw 83:80–98.

<https://doi.org/10.1016/j.advengsoft.2015.01.010>

(<https://doi.org/10.1016/j.advengsoft.2015.01.010>)

CrossRef (<https://doi.org/10.1016/j.advengsoft.2015.01.010>)

Google Scholar (http://scholar.google.com/scholar_lookup?title=The%20ant%20lion%20optimizer&author=S.%20Mirjalili&journal=Adv%20Eng

title=The%20ant%20lion%20optimizer&author=S.%20Mirjalili&journal=Adv%20Eng

%20Softw&volume=83&pages=80-98&publication_year=2015&doi=10.1016%2Fj.advensoft.2015.01.010)

Muthukumar R, Balamurugan P (2018) A model predictive controller for improvement in power quality from a hybrid renewable energy system. *Soft Comput.*

<https://doi.org/10.1007/s00500-018-3626-7> (<https://doi.org/10.1007/s00500-018-3626-7>)

[CrossRef](https://doi.org/10.1007/s00500-018-3626-7) (<https://doi.org/10.1007/s00500-018-3626-7>)

[Google Scholar](http://scholar.google.com/scholar_lookup?title=A%20model%20predictive%20controller%20for%20improvement%20in%20power%20quality%20from%20a%20hybrid%20renewable%20energy%20system&author=R.%20Muthukumar&author=P.%20Balamurugan&journal=Soft%20Comput&publication_year=2018&doi=10.1007%2Fs00500-018-3626-7) (http://scholar.google.com/scholar_lookup?title=A%20model%20predictive%20controller%20for%20improvement%20in%20power%20quality%20from%20a%20hybrid%20renewable%20energy%20system&author=R.%20Muthukumar&author=P.%20Balamurugan&journal=Soft%20Comput&publication_year=2018&doi=10.1007%2Fs00500-018-3626-7)

Nick M, Cherkaoui R, Paolone M (2014) Optimal allocation of dispersed energy storage systems in active distribution networks for energy balance and grid support.

IEEE Trans Power Syst 29:2300–2310. <https://doi.org/10.1109/tpwrs.2014.2302020> (<https://doi.org/10.1109/tpwrs.2014.2302020>)

[CrossRef](https://doi.org/10.1109/tpwrs.2014.2302020) (<https://doi.org/10.1109/tpwrs.2014.2302020>)

[Google Scholar](http://scholar.google.com/scholar_lookup?title=Optimal%20allocation%20of%20dispersed%20energy%20storage%20systems%20in%20active%20distribution%20networks%20for%20energy%20balance%20and%20grid%20support&author=M.%20Nick&author=R.%20Cherkaoui&author=M.%20Paolone&journal=IEEE%20Trans%20Power%20Syst&volume=29&pages=2300-2310&publication_year=2014&doi=10.1109%2Ftpwrs.2014.2302020) (http://scholar.google.com/scholar_lookup?title=Optimal%20allocation%20of%20dispersed%20energy%20storage%20systems%20in%20active%20distribution%20networks%20for%20energy%20balance%20and%20grid%20support&author=M.%20Nick&author=R.%20Cherkaoui&author=M.%20Paolone&journal=IEEE%20Trans%20Power%20Syst&volume=29&pages=2300-2310&publication_year=2014&doi=10.1109%2Ftpwrs.2014.2302020)

Perera A, Nik V, Mauree D, Scartezzini J (2017) Electrical hubs: an effective way to integrate non-dispatchable renewable energy sources with minimum impact to the grid. *Appl Energy* 190:232–248. <https://doi.org/10.1016/j.apenergy.2016.12.127> (<https://doi.org/10.1016/j.apenergy.2016.12.127>)

[CrossRef](https://doi.org/10.1016/j.apenergy.2016.12.127) (<https://doi.org/10.1016/j.apenergy.2016.12.127>)

[Google Scholar](http://scholar.google.com/scholar_lookup?title=Electrical%20hubs%3A%20an%20effective%20way%20to%20integrate%20non-dispatchable%20renewable%20energy%20sources%20with%20minimum%20impact%20to%20the%20grid&author=A.%20Perera&author=V.%20Nik&author=D.%20Mauree&author=J.%20Scartezzini&journal=Appl%20Energy&volume=190&pages=232-248&publication_year=2017&doi=10.1016%2Fj.apenergy.2016.12.127) (http://scholar.google.com/scholar_lookup?title=Electrical%20hubs%3A%20an%20effective%20way%20to%20integrate%20non-dispatchable%20renewable%20energy%20sources%20with%20minimum%20impact%20to%20the%20grid&author=A.%20Perera&author=V.%20Nik&author=D.%20Mauree&author=J.%20Scartezzini&journal=Appl%20Energy&volume=190&pages=232-248&publication_year=2017&doi=10.1016%2Fj.apenergy.2016.12.127)

Praveen Kumar T, Subrahmanyam N, Sydulu M (2018) CMBSNN for power flow management of the hybrid renewable energy—storage system-based distribution generation. *IETE Tech Rev.* <https://doi.org/10.1080/02564602.2018.1465860> (<https://doi.org/10.1080/02564602.2018.1465860>)

[CrossRef](https://doi.org/10.1080/02564602.2018.1465860) (<https://doi.org/10.1080/02564602.2018.1465860>)

[Google Scholar](http://scholar.google.com/scholar_lookup?title=CMBSNN%20for%20power%20flow%20management%20of%20the%20hybrid%20renewable%20energy%20storage%20system-based%20distribution%20generation&author=T.%20Praveen%20Kumar&author=N.%20Subrahmanyam&author=M.%20Sydulu&journal=IETE%20Tech%20Rev&publication_year=2018&doi=10.1080%2F02564602.2018.1465860) (http://scholar.google.com/scholar_lookup?title=CMBSNN%20for%20power%20flow%20management%20of%20the%20hybrid%20renewable%20energy%20storage%20system-based%20distribution%20generation&author=T.%20Praveen%20Kumar&author=N.%20Subrahmanyam&author=M.%20Sydulu&journal=IETE%20Tech%20Rev&publication_year=2018&doi=10.1080%2F02564602.2018.1465860)

Riffonneau Y, Bacha S, Barruel F, Ploix S (2011) Optimal power flow management for grid connected PV systems with batteries. *IEEE Trans Sustain Energy* 2:309–320.

<https://doi.org/10.1109/tste.2011.2114901> (<https://doi.org/10.1109/tste.2011.2114901>)

[CrossRef](https://doi.org/10.1109/tste.2011.2114901) (<https://doi.org/10.1109/tste.2011.2114901>)

[Google Scholar](http://scholar.google.com/scholar_lookup?title=Optimal%20power%20flow%20management%20for%20grid%20connected%20) (http://scholar.google.com/scholar_lookup?title=Optimal%20power%20flow%20management%20for%20grid%20connected%20

PV%20systems%20with%20batteries&author=Y.%20Riffonneau&author=S.%20Bacha&author=F.%20Barruel&author=S.%20Ploix&journal=IEEE%20Trans%20Sustain%20Energy&volume=2&pages=309-320&publication_year=2011&doi=10.1109%2Ftste.2011.2114901)

Selva Santhos Kumar R, Girirajkumar S (2015) Z-source inverter fed induction motor drive control using particle swarm optimization recurrent neural network. *J Intell Fuzzy Syst* 28:2749–2760. <https://doi.org/10.3233/ifs-151552>

(<https://doi.org/10.3233/ifs-151552>)

CrossRef (<https://doi.org/10.3233/ifs-151552>)

Google Scholar (http://scholar.google.com/scholar_lookup?title=Z-source%20inverter%20fed%20induction%20motor%20drive%20control%20using%20particle%20swarm%20optimization%20recurrent%20neural%20network&author=R.%20Selva%20Santhos%20Kumar&author=S.%20Girirajkumar&journal=J%20Intell%20Fuzzy%20Syst&volume=28&pages=2749-2760&publication_year=2015&doi=10.3233%2Fifs-151552)

Sun K, Zhang L, Xing Y, Guerrero J (2011) A distributed control strategy based on DC bus signaling for modular photovoltaic generation systems with battery energy storage. *IEEE Trans Power Electron* 26:3032–3045.

<https://doi.org/10.1109/tpel.2011.2127488>

(<https://doi.org/10.1109/tpel.2011.2127488>)

CrossRef (<https://doi.org/10.1109/tpel.2011.2127488>)

Google Scholar (http://scholar.google.com/scholar_lookup?title=A%20distributed%20control%20strategy%20based%20on%20DC%20bus%20signaling%20for%20modular%20photovoltaic%20generation%20systems%20with%20battery%20energy%20storage&author=K.%20Sun&author=L.%20Zhang&author=Y.%20Xing&author=J.%20Guerrero&journal=IEEE%20Trans%20Power%20Electron&volume=26&pages=3032-3045&publication_year=2011&doi=10.1109%2Ftpel.2011.2127488)

Timbus A, Liserre M, Teodorescu R et al (2009) Evaluation of current controllers for distributed power generation systems. *IEEE Trans Power Electron* 24:654–664.

<https://doi.org/10.1109/tpel.2009.2012527>

(<https://doi.org/10.1109/tpel.2009.2012527>)

CrossRef (<https://doi.org/10.1109/tpel.2009.2012527>)

Google Scholar (http://scholar.google.com/scholar_lookup?title=Evaluation%20of%20current%20controllers%20for%20distributed%20power%20generation%20systems&author=A.%20Timbus&author=M.%20Liserre&author=R.%20Teodorescu&journal=IEEE%20Trans%20Power%20Electron&volume=24&pages=654-664&publication_year=2009&doi=10.1109%2Ftpel.2009.2012527)

Torres-Jimenez J, Rodriguez-Cristerna A (2017) Metaheuristic post-optimization of the NIST repository of covering arrays. *CAAI Trans Intell Technol* 2(1):31–38.

<https://doi.org/10.1016/j.trit.2016.12.006>

(<https://doi.org/10.1016/j.trit.2016.12.006>)

CrossRef (<https://doi.org/10.1016/j.trit.2016.12.006>)

Google Scholar (http://scholar.google.com/scholar_lookup?title=Metaheuristic%20post-optimization%20of%20the%20NIST%20repository%20of%20covering%20arrays&author=J.%20Torres-Jimenez&author=A.%20Rodriguez-Cristerna&journal=CAAI%20Trans%20Intell%20Technol&volume=2&issue=1&pages=31-38&publication_year=2017&doi=10.1016%2Fj.trit.2016.12.006)

Zhang J (2006) Optimal power flow control for congestion management by interline power flow controller (IPFC). In: International conference on power system technology, 2006. PowerCon 2006, Chongqing, 22 Oct 2006

Google Scholar (<https://scholar.google.com/scholar?q=Zhang%20J%20%282006%29%20Optimal%20power%20flow%20control%20for%20congestion%20management%20by%20interline%20power%20flow%20controller%20%28IPFC%29.%20In%3A%20International%20conference%20on%20power%20system%20technology%2C%202006.%20PowerCon%202006%2C%20Chongqing%2C%2022%20Oct%202006>)

Zhang L, Gari N, Hmurcik L (2014) Energy management in a microgrid with distributed energy resources. *Energy Convers Manag* 78:297–305. <https://doi.org/10.1016/j.enconman.2013.10.065> (<https://doi.org/10.1016/j.enconman.2013.10.065>)

CrossRef (<https://doi.org/10.1016/j.enconman.2013.10.065>)

Google Scholar (http://scholar.google.com/scholar_lookup?title=Energy%20management%20in%20a%20microgrid%20with%20distributed%20energy%20resources&author=L.%20Zhang&author=N.%20Gari&author=L.%20Hmurcik&journal=Energy%20Convers%20Manag&volume=78&pages=297-305&publication_year=2014&doi=10.1016%2Fj.enconman.2013.10.065)

CrossRef (<https://doi.org/10.1016/j.enconman.2013.10.065>)

Google Scholar (http://scholar.google.com/scholar_lookup?title=An%20isolated%20three-port%20bidirectional%20DC%E2%80%93DC%20converter%20with%20decoupled%20power%20flow%20management&author=C.%20Zhao&author=S.%20Round&author=J.%20Kolar&journal=IEEE%20Trans%20Power%20Electron&volume=23&pages=2443-2453&publication_year=2008&doi=10.1109%2Ftpel.2008.2002056)

Zhao C, Round S, Kolar J (2008) An isolated three-port bidirectional DC–DC converter with decoupled power flow management. *IEEE Trans Power Electron* 23:2443–2453. <https://doi.org/10.1109/tpel.2008.2002056> (<https://doi.org/10.1109/tpel.2008.2002056>)

CrossRef (<https://doi.org/10.1109/tpel.2008.2002056>)

Google Scholar (http://scholar.google.com/scholar_lookup?title=A%20fully%20distributed%20reactive%20power%20optimization%20and%20control%20method%20for%20active%20distribution%20networks&author=W.%20Zheng&author=W.%20Wu&author=B.%20Zhang&journal=IEEE%20Trans%20Smart%20Grid&publication_year=2015&doi=10.1109%2Ftsg.2015.2396493)

Zheng W, Wu W, Zhang B et al (2015) A fully distributed reactive power optimization and control method for active distribution networks. *IEEE Trans Smart Grid*. <https://doi.org/10.1109/tsg.2015.2396493> (<https://doi.org/10.1109/tsg.2015.2396493>)

CrossRef (<https://doi.org/10.1109/tsg.2015.2396493>)

Google Scholar (http://scholar.google.com/scholar_lookup?title=Effects%20of%20laccase%20incubated%20from%20white%20rot%20fungi%20on%20the%20mechanical%20properties%20of%20fiberboard&author=X.%20Zhu&author=S.%20Han&author=Y.%20Liu&author=G.%20Chen&journal=J%20For%20Res&volume=28&issue=6&pages=1293-1300&publication_year=2017&doi=10.1007%2Fs11676-017-0398-3)

Zhu X, Han S, Liu Y, Chen G (2017) Effects of laccase incubated from white rot fungi on the mechanical properties of fiberboard. *J For Res* 28(6):1293–1300. <https://doi.org/10.1007/s11676-017-0398-3> (<https://doi.org/10.1007/s11676-017-0398-3>)

CrossRef (<https://doi.org/10.1007/s11676-017-0398-3>)

Google Scholar (http://scholar.google.com/scholar_lookup?title=Effects%20of%20laccase%20incubated%20from%20white%20rot%20fungi%20on%20the%20mechanical%20properties%20of%20fiberboard&author=X.%20Zhu&author=S.%20Han&author=Y.%20Liu&author=G.%20Chen&journal=J%20For%20Res&volume=28&issue=6&pages=1293-1300&publication_year=2017&doi=10.1007%2Fs11676-017-0398-3)

Copyright information

© Springer-Verlag GmbH Germany, part of Springer Nature 2019

About this article

Cite this article as:

Mahendran, K. & Prabha, S.U. Soft Comput (2019) 23: 13459. <https://doi.org/10.1007/s00500-019-03885-9>

- First Online 06 March 2019
- DOI <https://doi.org/10.1007/s00500-019-03885-9>
- Publisher Name Springer Berlin Heidelberg
- Print ISSN 1432-7643
- Online ISSN 1433-7479
- [About this journal](#)
- [Reprints and Permissions](#)

Personalised recommendations

SPRINGER NATURE

© 2019 Springer Nature Switzerland AG. Part of [Springer Nature](#).

Not logged in Not affiliated 182.73.209.66