







Wireless Sensor Networks

A survey on maximizing lifetime in sensor coverage problems

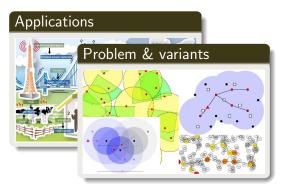


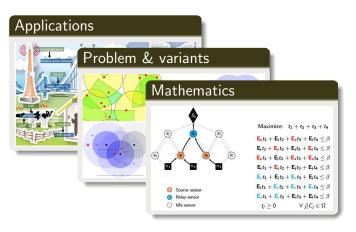
February 5, 2015

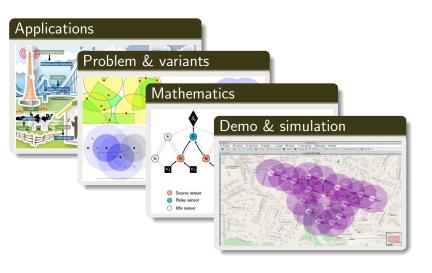
Team: A. Bounceur, E. Bourreau, F. Castaño, A. Rossi, A. Singh and N. Velasco

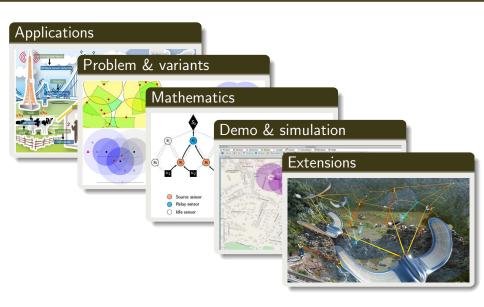
Marc Sevaux (UBS)











Contents

- Introduction to Wireless Sensor Networks
 - Motivations
 - Applications
 - Wireless sensors
 - Networks
 - Objective functions

WSN: a growing field of research

Research fundings

Funding is continuously growing

- → NSF \$47M (2003)
- → US Military \$1.5B (on RTLS)
- \rightarrow Living PlanIT \$13T (10 years)

WSN market

2012	2022	2032
\$0.6B	\$2.4B	\$6.5B

WSN: a growing field of research

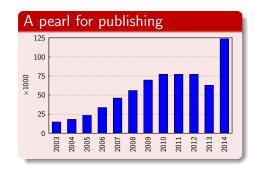
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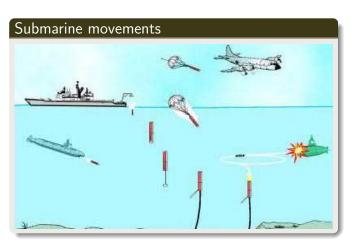


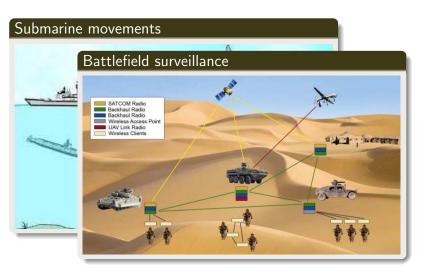
Applications

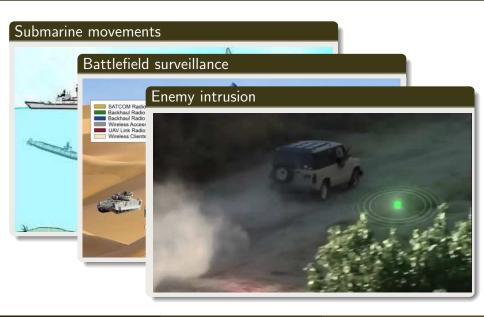
Definition (Wireless Sensor Network)

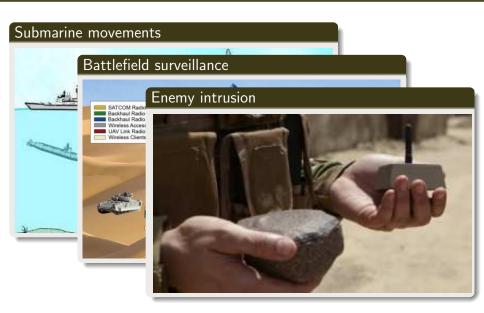
A wireless sensor network (WSN) consists of spatially distributed autonomous sensors to cooperatively monitor physical or environmental conditions, such as temperature, vibration, pressure or pollutants...

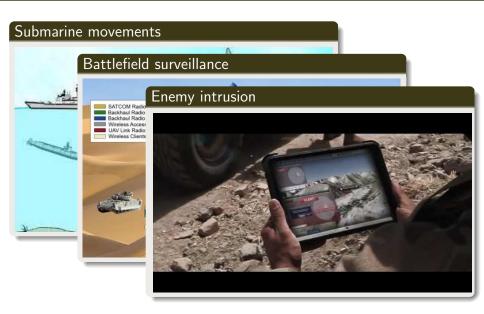
- Military applications
- Environment and civil engineering
- Industry and commerce
- Smart home
- Health

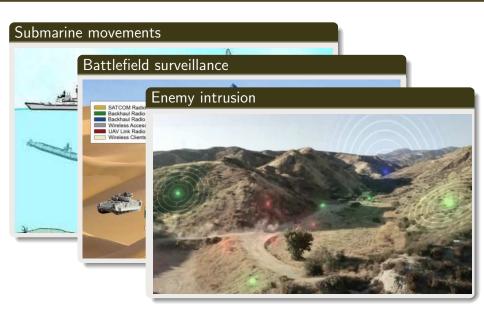












Military applications (sensors)







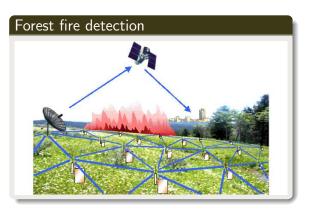


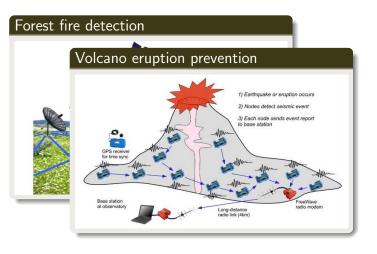


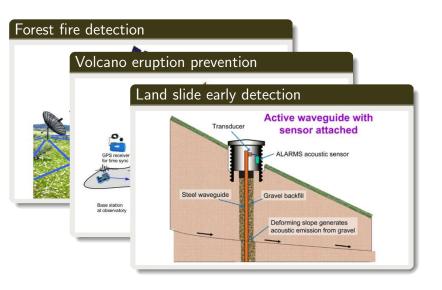


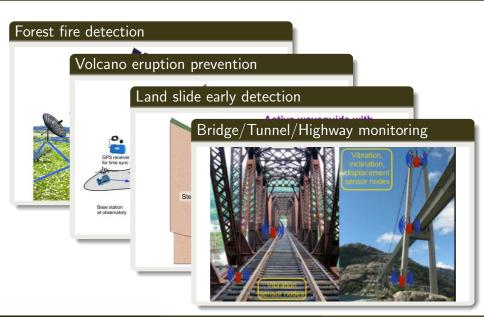
Military applications (sensors)

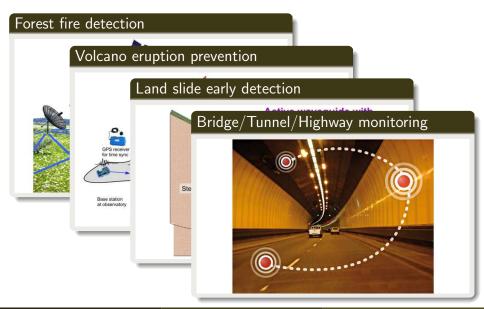


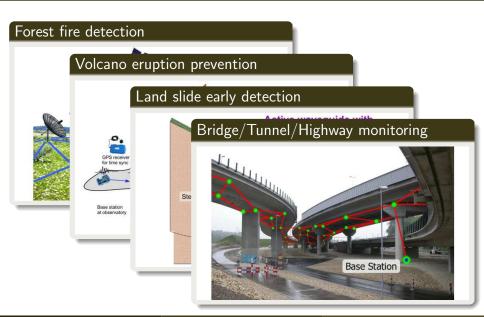




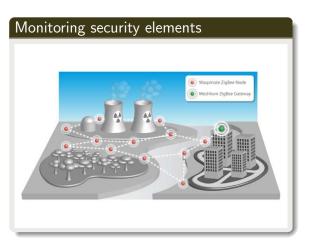




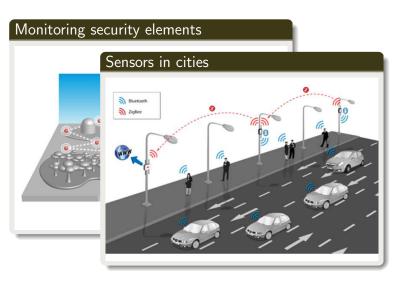




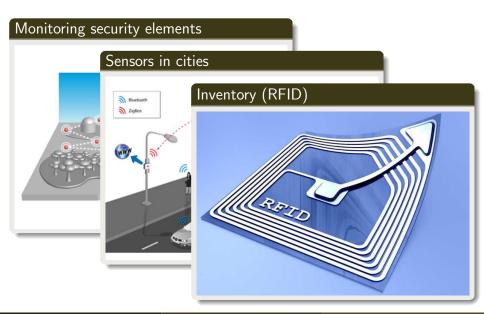
Industry and commerce



Industry and commerce

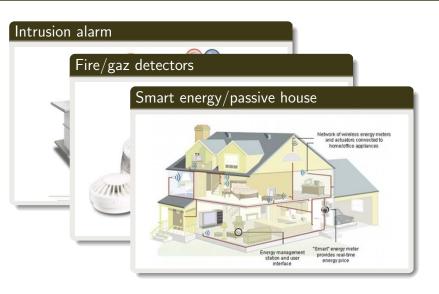


Industry and commerce



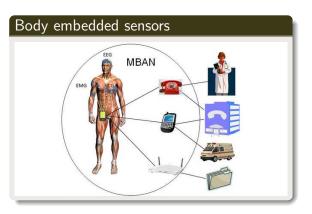




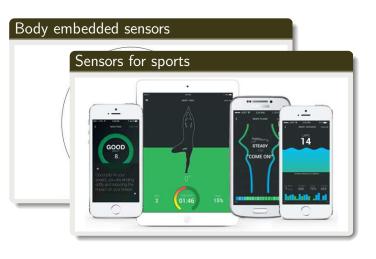






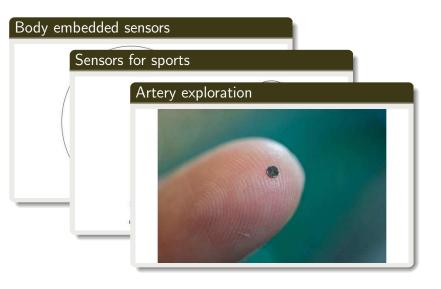




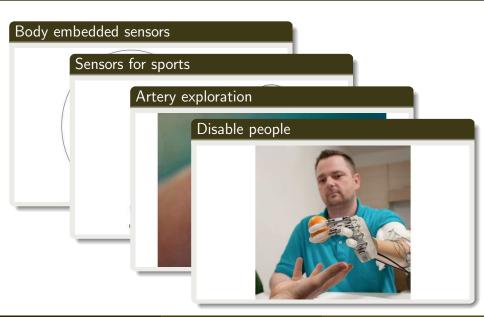




Health



Health



Wireless sensors



Electronic device:

- sensing module
- short-range communication
- self powered
- limited processing capabilities

Many types of wireless sensors





Many types of wireless sensors

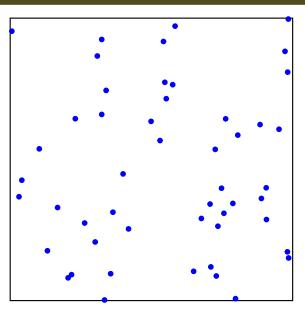


Many types of wireless sensors

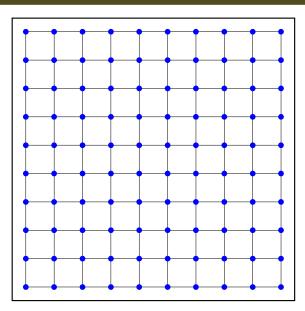




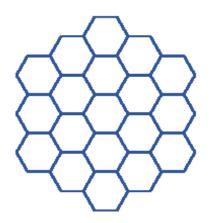
Random network

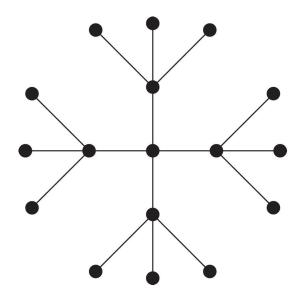


Mesh 2D regular

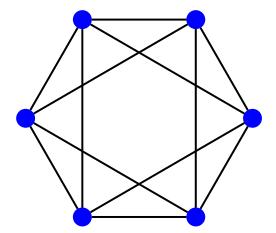


Hexagon regular

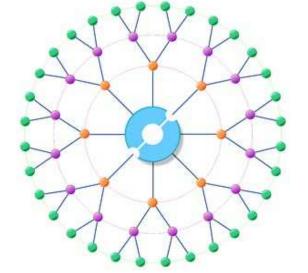




Star

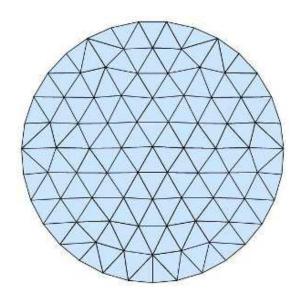


Ring



Ring-star

Ad-hoc

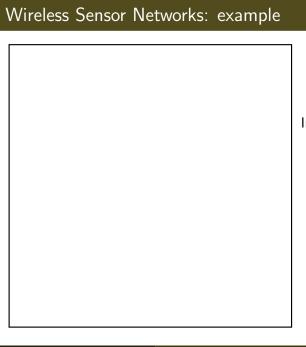


Objective functions

- Minimization of the covering breach
- Minimization of energy consumption
- Minimization of deployment cost
- Maximization of area monitoring
- Maximization of the network lifetime

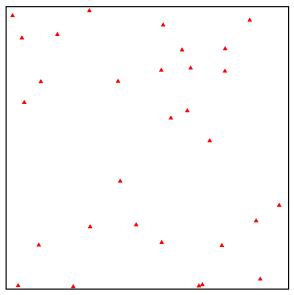
Contents

- Problem and variants
 - Our case study
 - MNLB
 - Classical variants of the problem



In a specific area

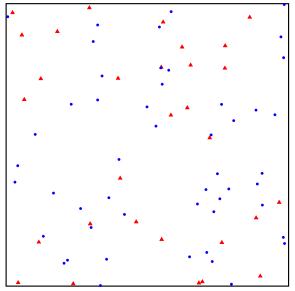
Wireless Sensor Networks: example



In a specific area

• a set of targets to monitor over time

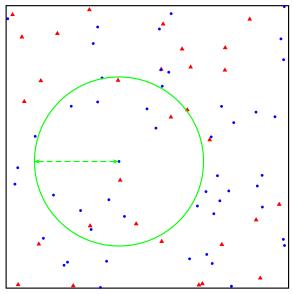
Wireless Sensor Networks: example



In a specific area

- a set of targets to monitor over time
- a set of sensors to cover the targets

Wireless Sensor Networks: example



In a specific area

- a set of targets to monitor over time
- a set of sensors to cover the targets
- a sensor maximum range for detection

Wireless Sensor Networks

Wireless sensors are [randomly] deployed for covering the set of targets

- all sensors are identical
- they operate on a battery, whose lifetime is normalized to one
- when a sensor is **inactive**, it consumes no energy
- when a sensor is **active**, it covers all the targets under its sensing range R_s







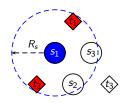




Wireless Sensor Networks

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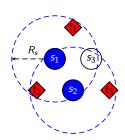


 s_1 covers t_1 and t_2 when it is active

Wireless Sensor Networks

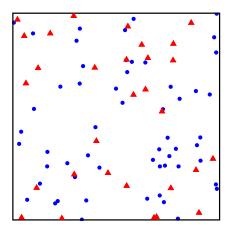
Wireless sensors are [randomly] deployed for covering the set of targets

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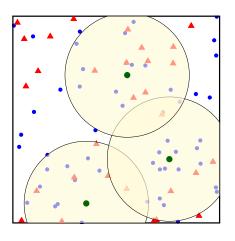


 s_1 covers t_1 and t_2 when it is active

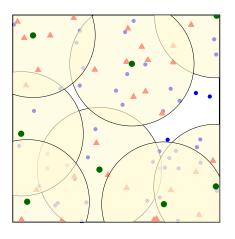
when s_1 and s_2 are active, they cover all the targets



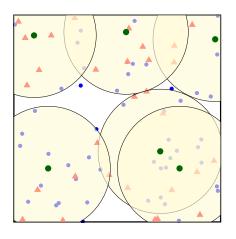
Initial situation



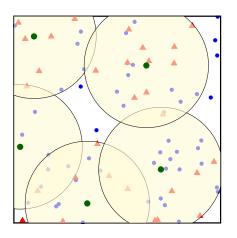
Not Good



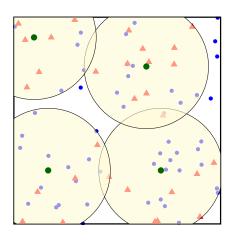
Good



Good



Almost Good



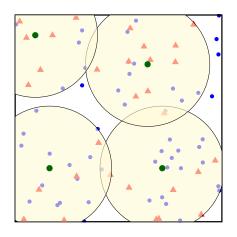
Very Good!!!

Lifetime maximization: MNLB

Maximization of the Network Lifetime under Bandwidth constraints

- the network lifetime is the objective to maximize
- all targets should be covered at any time
- bandwidth constraint is modeled as follows:
 any subset of active sensors must be made of at most W sensors

Lifetime maximization: MNLB

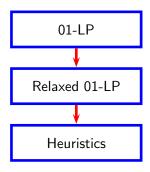


- all targets are covered
- if the bandwidth constraint is
 W = 5, ok
- we have to find other similar subsets to maximize lifetime

Lifetime maximization: MNLB



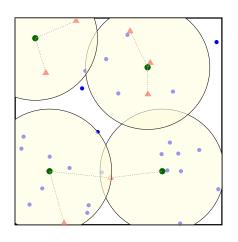
C. Wang, M.T. Thai, Y. Li, F. Wang, and W. Wu Optimization scheme for sensor coverage scheduling with bandwidth constraints. *Optimization Letters*, 3:63–75, 2009.



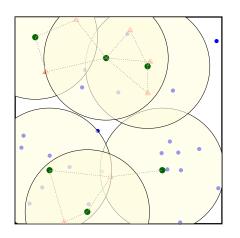
- first to solve MNLB
- ullet MNLB \mathcal{NP} -complete
- solve relaxed MCBB
- transform into MNLB
- heuristic approach
- 4 instances only
- 50 sensors

Maximization of the Network Lifetime with Q-coverage constraint

- the network lifetime is the objective to maximize
- all targets should be covered by Q sensors at any time



 all targets are now covered by Q sensors at any time (Q = 1)



- all targets are now covered by Q sensors at any time (Q = 2)
- we have to find plenty of similar subsets to maximize lifetime



Y. Gu, H. Liu, and B. Zhao.

Target coverage with QoS requirements in wireless sensor networks.

International Conference on Intelligent Pervasive Computing, 35–38, 2007.

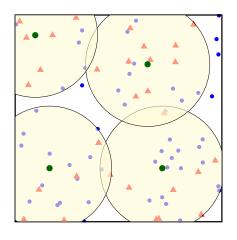
Column generation

- Q-coverage \mathcal{NP} -complete
- exact approach
- efforts on initial columns
- results on small instances
- 30-75 sensors
- only compare to MNLB (Q = 1)

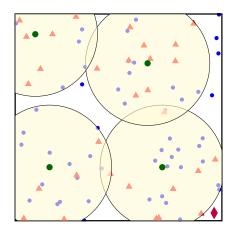
Lifetime maximization: base station

Maximization of the Network Lifetime with connectivity contraint

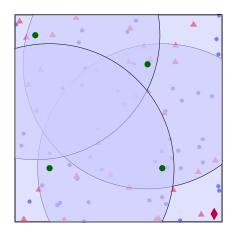
- the network lifetime is the objective to maximize
- all targets should be covered at any time
- all activated targets should be connected to a base station



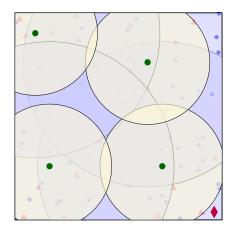
 all targets are covered by a sensor, when activated



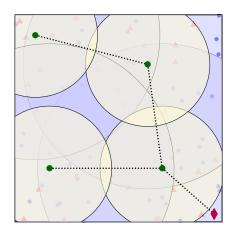
- all targets are covered by a sensor, when activated
- a base station is present in the network



- all targets are covered by a sensor, when activated
- a base station is present in the network
- every sensor has a large communication range



- all targets are covered by a sensor, when activated
- a base station is present in the network
- every sensor has a large communication range
- all activated sensors should be connected to the base station



- all targets are covered by a sensor, when activated
- a base station is present in the network
- every sensor has a large communication range
- all activated sensors should be connected to the base station



M. Gentili and A. Raiconi.

 $\alpha\text{-}\mathsf{Coverage}$ to extend network lifetime on wireless sensor networks.

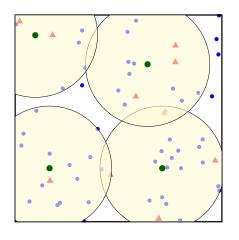
Optimization Letters, 7(1):157-172, 2013

Column generation
+
Heuristics

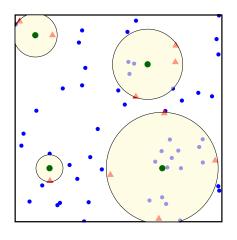
- exact approach
- greedy heuristics
- test bench 480 instances
- 25-150 sensors
- ullet can solve lpha-coverage

Maximization of the Network Lifetime with adjustable sensing range

- the network lifetime is the objective to maximize
- all targets should be covered at any time
- sensing range can be adjusted to reduce energy consumption
 - ad-hoc sensing ranges
 - predefined sensing ranges



 all targets are covered by a sensor, when activated



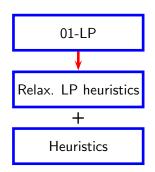
- all targets are covered by a sensor, when activated
- but the sensing range is reduced to the minimum value for covering the same targets and saving energy



M. Cardei, J. Wu, M. Lu, and M.O. Pervaiz.

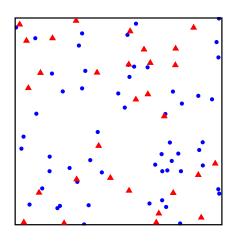
Maximum network lifetime in WSN with adjustable sensing ranges

Wireless And Mobile Computing, Networking And Communications, 438-445, 2005



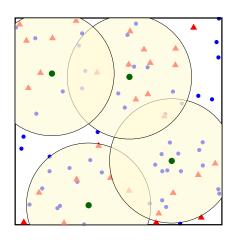
- nice study on sensing ranges
- only 16 instances
- 25-250 sensors

Lifetime maximization: α -coverage



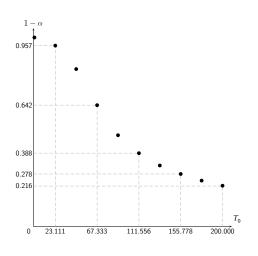
 sensors and targets are randomly placed

Lifetime maximization: α -coverage



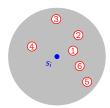
- sensors and targets are randomly placed
- ullet a fraction lpha of the targets are not covered
- here, $\alpha = 4/30 = 0.13$

Lifetime maximization: trade-off



- ullet a decision maker can choose between lifetime and lpha
- 200 sensors, 120 targets

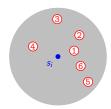
Lifetime maximization: directional sensors and focal lens

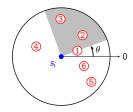


Omnidirectional sensor

Decide when to set the sensor to active state

Lifetime maximization: directional sensors and focal lens





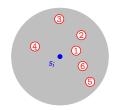
Omnidirectional sensor

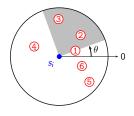
Directional sensor

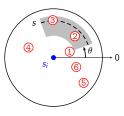
Decide when to set the sensor to active state

Set working direction θ

Lifetime maximization: directional sensors and focal lens







Omnidirectional sensor

Directional sensor

Camera sensor

Decide when to set the sensor to active state

Set working direction θ

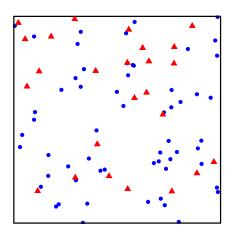
Set focal distance s

Contents

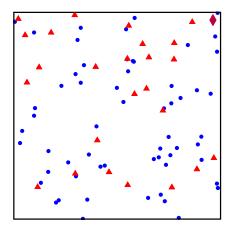
- Mathematics and general framework
 - Our problem
 - Covers
 - Reformulation of the problem
 - Column generation
 - Pricing subproblem
 - Matheuristics

α -CMLP

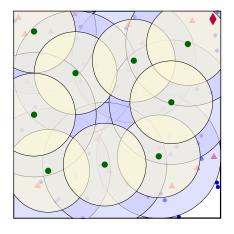
• set of targets and sensors



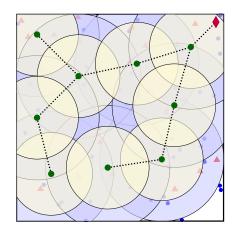
- set of targets and sensors
- base station



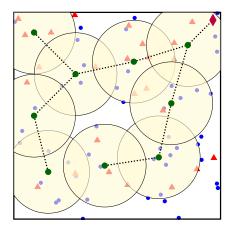
- set of targets and sensors
- base station
- activated sensors



- set of targets and sensors
- base station
- activated sensors
- communication links

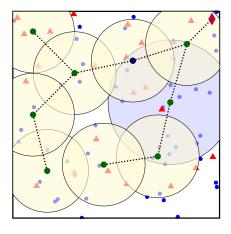


- set of targets and sensors
- base station
- activated sensors
- communication links
- ullet α -coverage



α -CMLP-MR

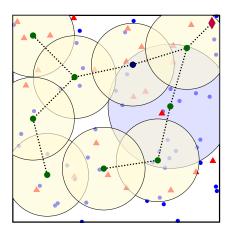
- set of targets and sensors
- base station
- activated sensors
- communication links
- ullet α -coverage
- some sensors can be used for communication only!



α -CMLP-MR

- set of targets and sensors
- base station
- activated sensors
- communication links
- ullet α -coverage
- some sensors can be used for communication only!

We are now looking for subsets of active sensors and their role



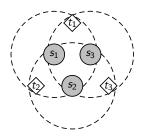
Covers

Definition (Cover)

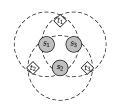
A cover is a subset of sensors used at the same time for covering a subset of targets

Examples:

- cover $\{s_1\}$ covers t_1 and t_2
- cover $\{s_1, s_2\}$ covers all the targets
- cover $\{s_1, s_3\}$ also covers all the targets

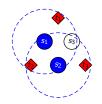


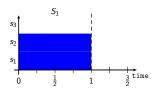
Scheduling the covers (disjoint covers)



In that small example, we have 3 covers $S_1=\{s_1,s_2\}$, $S_2=\{s_1,s_3\}$ and $S_3=\{s_2,s_3\}$ that cover all the targets

Continuous use of covers (disjoint covers)





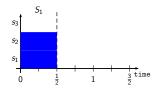
Battery depleted for s_1 and s_2 , other covers cannot be used.

If we want to cover all the targets with disjoint covers, maximum network lifetime is equal to 1

Scheduling the covers (non-disjoint covers)

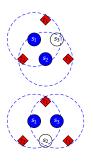
Sequentially use $\{s_1,s_2\}$, $\{s_1,s_3\}$ and $\{s_2,s_3\}$ for 0.5 units of time each

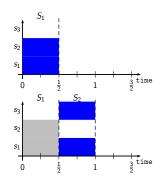




Scheduling the covers (non-disjoint covers)

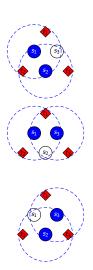
Sequentially use $\{s_1, s_2\}$, $\{s_1, s_3\}$ and $\{s_2, s_3\}$ for 0.5 units of time each

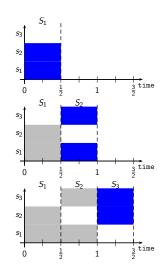




Scheduling the covers (non-disjoint covers)

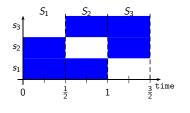
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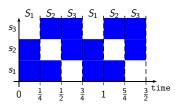




Scheduling the covers

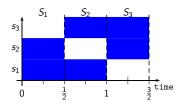
Different schedules can conduct to equivalent solutions

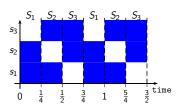




Scheduling the covers

Different schedules can conduct to equivalent solutions





Questions:

- How can we find these covers?
- How long are we going to use them?

A very simple model

If we know how to build the covers, $\alpha\text{-CMLP-MR}$ is simply formulated by:

General LP model

Maximize:
$$\sum_{j|C_j \in \Omega} t_j$$

$$\sum_{j|C_j \in \Omega} (E_{s_v}) t_j \le \beta_{s_v} \qquad \forall \ s_v \in S$$

$$t_j \geq 0 \qquad \forall \ j | C_j \in \Omega$$

Remarks:

Too many columns
 15 sensors ≈ 14 million columns



Remarks:

- Too many columns
 15 sensors ≈ 14 million columns
- Few columns are useful

 15 sensors: at most 15 columns



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- Too many columns
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- Strategy: generate them on the fly



Remarks:

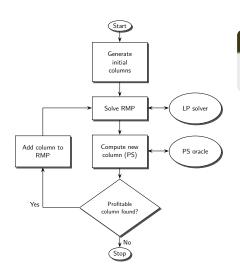
- Too many columns
 15 sensors ≈ 14 million columns
- Few columns are useful
 15 sensors: at most 15 columns
- Strategy: generate them on the fly



Solution approach

Column generation is a natural approach to solve the problem

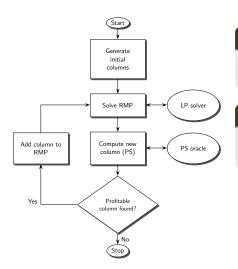
Principle of column generation approaches (CG)



Master Problem (RMP)

Maximizes network lifetime for the available set of columns

Principle of column generation approaches (CG)



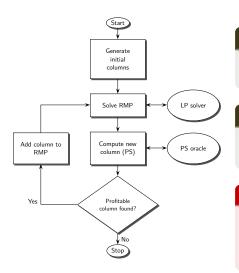
Master Problem (RMP)

Maximizes network lifetime for the available set of columns

Pricing Subproblem (PS)

Identifies new columns that can help to extend lifetime

Principle of column generation approaches (CG)



Master Problem (RMP)

Maximizes network lifetime for the available set of columns

Pricing Subproblem (PS)

Identifies new columns that can help to extend lifetime

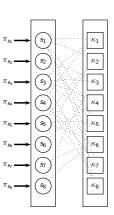
Performance might be poor...

- PS implementation issues
- Heading-in effect
- Tail-off effect

Solving the pricing subproblem

Data

 π_{si}: Dual variable value associated to battery constraint for sensor s_i



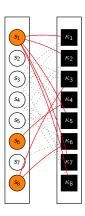
Solving the pricing subproblem

Decision variables

- sensor activity
 - $y_{s_i} \in \{0,1\}$

Objective

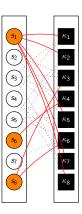
- Min: $\sum_{s_i \in \mathcal{S}} y_{s_i} \pi_{s_i}$
- Identify a subset of sensors with interesting reduced cost



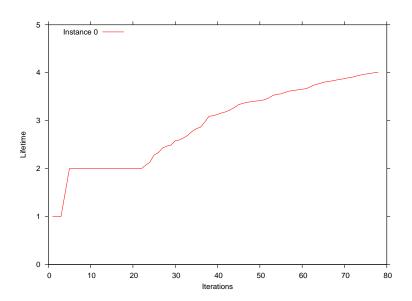
Solving the pricing subproblem

Remarks

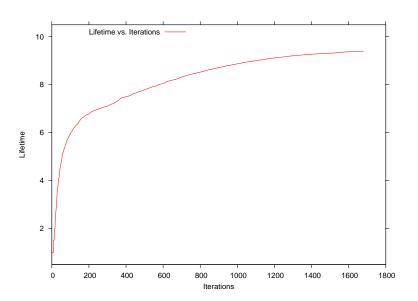
- Weighted set covering NP-Hard
- One column per iteration
- Approximations lead to premature convergence



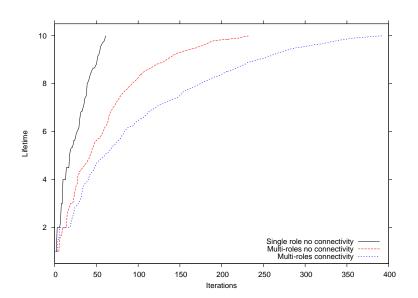
Heading-in effect



Tail-off effect



Tail-off effect



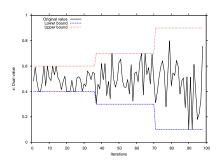
Improvements – Stabilization

Classical stabilization strategies are explored

Stabilized CG

Manage dual variables:

- Dual variable stabilization
- Dual variable smoothing



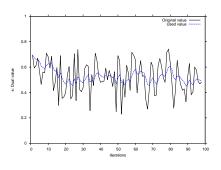
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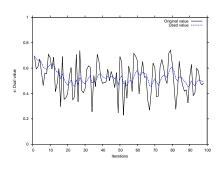
Improvements – Stabilization

Classical stabilization strategies are explored

Stabilized CG

Manage dual variables:

- Dual variable stabilization
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Nice, but not very efficient...

Improvements – Intensification & diversification

Metaheuristics are used to intensify/diversify the search

Intensification • GRASP • VNS



Improvements – Intensification & diversification

Metaheuristics are used to intensify/diversify the search

Intensification

- GRASP
- VNS
- Evolutionary algorithms

Diversification

 Return multiple profitable columns



(S5) (S6)

(s₇)

s₈





(54)

 (s_5) (s_6)

(57)

(58





















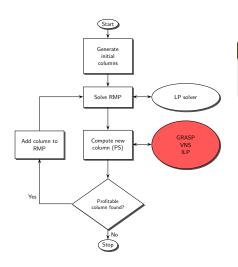








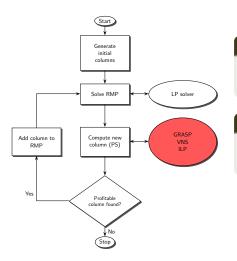
A new matheuristic framework



GRASP

Set covering with relaxed connectivity constraints + repair

A new matheuristic framework



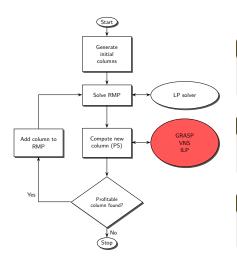
GRASP

Set covering with relaxed connectivity constraints + repair

VNS

Considering connectivity and coverage constraints

A new matheuristic framework



GRASP

Set covering with relaxed connectivity constraints + repair

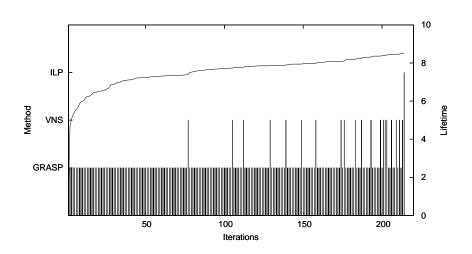
VNS

Considering connectivity and coverage constraints

ILP solver

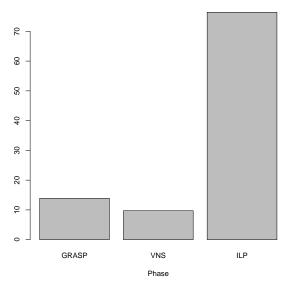
Used to check optimality or discover difficult columns

Results



Results





Other techniques and variants

Techniques used for the pricing subproblem

- Evolutionary algorithm find quickly several columns
- Constraint Programming prove optimality use specific tree variables and propagation

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Techniques used for the pricing subproblem

- Evolutionary algorithm find quickly several columns
- Constraint Programming prove optimality use specific tree variables and propagation

Variants of the problem

- Multiple base stations
- Irregular shapes
- Directional sensors
- Obstacles
- Area coverage

Publications



A. Rossi, A. Singh, and M. Sevaux.

Column generation algorithm for sensor coverage scheduling under bandwidth constraints. Networks. 60(3):141–154, 2012.



A. Rossi, A. Singh, and M. Sevaux.

An exact approach for maximizing the lifetime of sensor networks with adjustable sensing ranges. Computers and Operations Research, 39(12):3166–3176, 2012.



A. Rossi, A. Singh, and M. Sevaux.

Lifetime maximization in wireless directional sensor network.

European Journal of Operational Research, 231(1):229–241, 2013.



A. Singh, A. Rossi, and M. Sevaux.

Matheuristic approaches for Q-coverage problem versions in wireless sensor networks. *Engineering Optimization*, 45(5):609–626, 2013.



F. Castaño, A. Rossi, M. Sevaux, and N. Velasco.

A column generation approach to extend lifetime in wireless sensor networks with coverage and connectivity constraints. Computers and Operations Research, 52(B):220–230, 2014.



F. Castaño, E. Bourreau, N. Velasco, A. Rossi, and M. Sevaux.

Exact approaches for lifetime maximization in connectivity constrained wireless multi-role sensor networks. European Journal of Operational Research, 241(1):28–38, 2015.



M. Sevaux, M. Vecchio, and A. Bounceur, editors.

Special issue on Algorithms for Wireless Sensor Networks, volume x of Algorithms. MDPI, 2015. Available online.

Publications



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Two important references



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Contents

- 4 Simulation and Demo
 - www.cupcarbon.com
 - a simulation tool
 - open source
 - java-based platform

Demo CupCarbon



www.cupcarbon.org

Launch the demo movie, if it works!!!

Contents

- **6** Conclusion & perspectives
 - On our work
 - Future trends

Conclusions and perspectives

Our matheuristic framework

- is well suited for WSN lifetime maximization
- can adapt to many variants
- is fully customisable

And after...

- combination of all variants?
- ullet moving targets (o target tracking)
- moving sensors
- full integration in cup-carbon

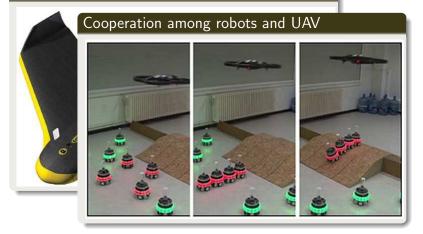


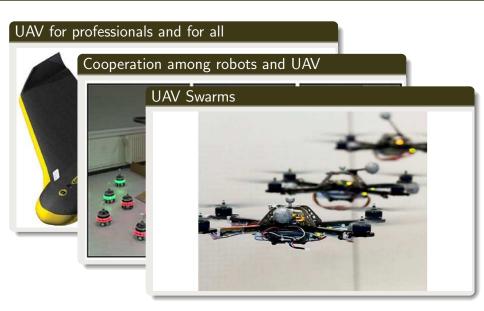


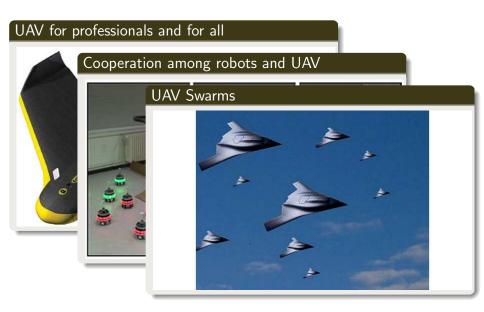


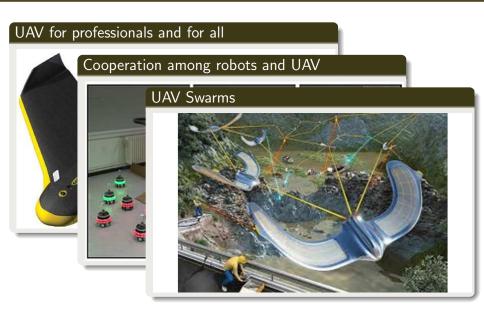
UAV for professionals and for all Cooperation among robots and UAV

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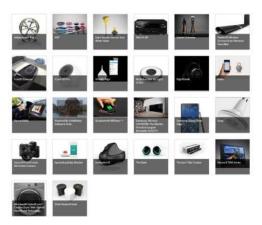


THE GLOBAL STAGE FOR INNOVATION

¹Quote from a famous Belgian actor!

Are we aware?1

Among the 19 categories for innovation, 10 are related to sensors, wireless sensors or wireless sensor networks...



¹Quote from a famous Belgian actor!









Wireless Sensor Networks

A survey on maximizing lifetime in sensor coverage problems

Marc Sevaux

ORBEL 29

Université de Bretagne-Sud www.univ-ubs.fr/or/

February 5, 2015



