




## Thermal Video Processing Support for Rescue Operations



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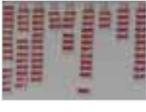
**15<sup>th</sup> Summer School on Image Processing**  
 6 – 15 July, 2007, Szeged, Hungary.






## Tools for Rescue Operation Management – Today









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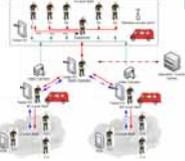





## Tools for Rescue Operation Management – SHARE






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## SHARE Overview: MAP3D



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## SHARE Overview: PTS Video

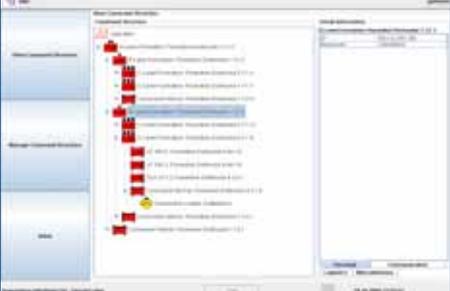


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## SHARE Overview: Interactive Resource Management

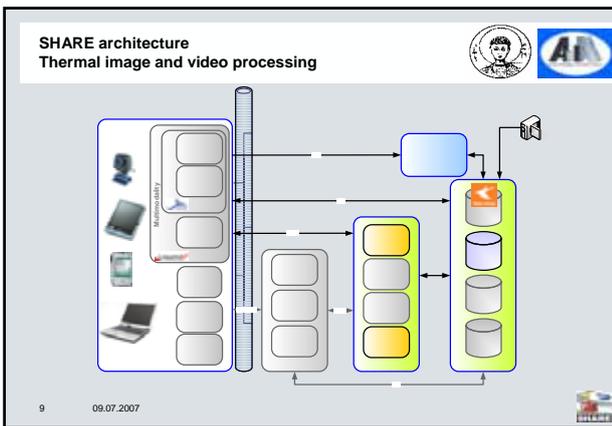
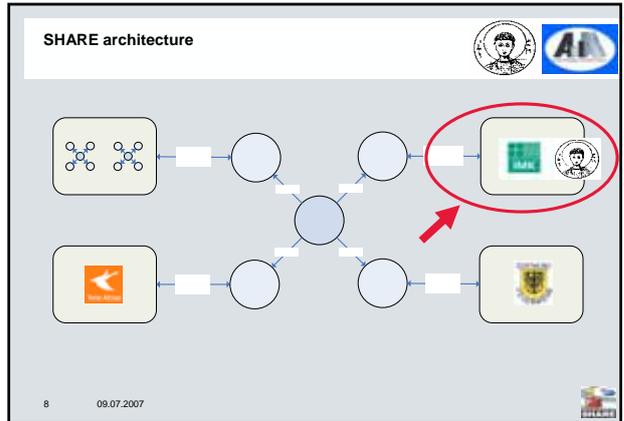


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### SHARE Overview: Thermal Video Processing

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### Objectives

- To provide tools for image and video analysis for assisting a fire-brigade or another rescue team during and after the rescue operation.
- Integration of state-of-the-art techniques for analyzing images/videos acquired using a thermal camera in a fire/smoke environment.

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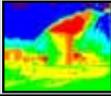
### General aims

<p><b>Fire focus</b> Fire occurrences according to hotspot detection to localize the fire, estimate its spreading and determine/estimate its change in time.</p>	
<p><b>Person detection</b> Human occurrences in thermal videos to localize human silhouettes to derive rescue and positioning information.</p>	
<p><b>Person tracking</b> Human movement analysis in the fire videos according to the trajectory analysis of them. E.g. slower/faster movements, directions.</p>	

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### End-user requirements

**Colorization**  
The thermal camera view is generally B&W. The grey tones make it difficult to get a quick overview of thermal characteristics of different objects.



**Interactive object detection and recognition**  
The recognition of objects is difficult. The user has to click on any area and the recognition module should mark the object. A further requirement is identification i.e. as a person.



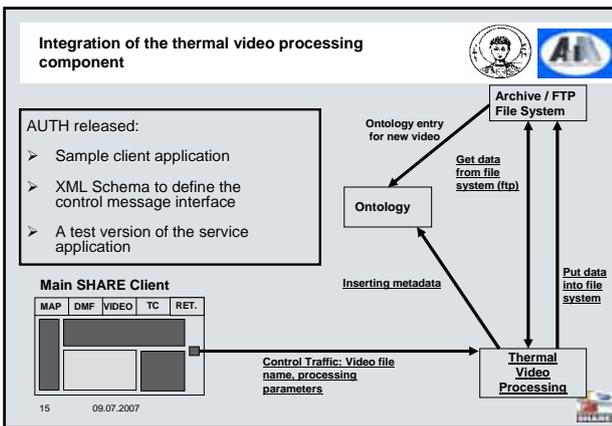
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### End-user requirements

**Tactical effectiveness**  
A very important function is the time control of tactical effectiveness. This function is needed to see the thermal condition of an object within different periods (e.g. 10 seconds steps). The thermal status of the marked object is visualized by colored faces. This helps the officer in charge to verify the effectiveness of his tactic, and to correct the methods very fast.



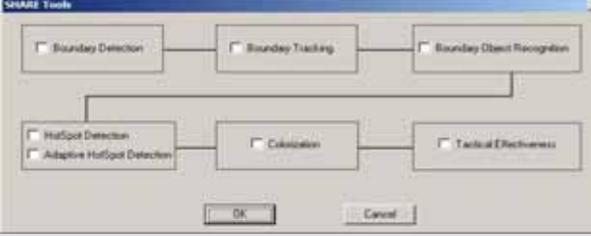
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- ### Integration of the thermal video processing component
- Defining GUI requirements for the SHARE client
  - Creating a service module with supporting video processing tasks for the second prototype
  - Creating a command message interface
  - Releasing a sample client
  - Adding XML parsing functionalities to interpret the control message and prepare Java source for ODS
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### Requirements for the client GUI

- SHARE thermal video processing tools (1<sup>st</sup> prototype GUI):



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### Requirements for the client GUI

- Selection of regions of interest (1<sup>st</sup> prototype GUI):

**Bounding box**



**Snake**



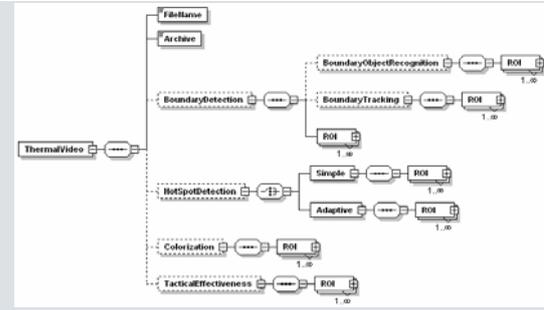
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### Definition of a control message interface

- Information sent from the client to the service:
  - Data server and directory information for the input video (video output is generated here, as well),
  - Name of the file to be processed,
  - Processing tasks together with their ROIs and scope (start frame/end frame information),
  - The control message is defined in terms of an XML Schema, and thus the message is sent as an XML file (IP package).

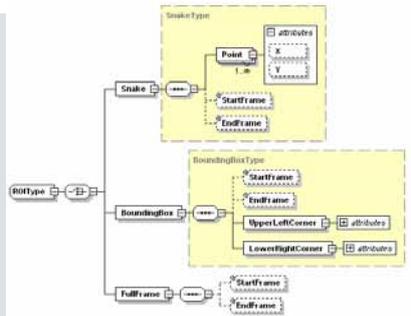
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### Control message interface, root class



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### Control message interface, ROI class



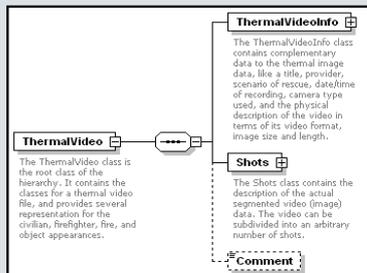
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### Research activities

- Content description of thermal videos
- Fire detection with Fourier analysis
- Supervised object extraction by snakes
  - Tracing quadrees for better concavity performance
  - Content adaptive heterogeneous snakes
- Automatic object detection and recognition
  - Creating human pose database
  - Hierarchical clustering for template databases
  - Textual description of database for faster matching
  - Divide and conquer strategy for affine distortions
  - Object simplification for faster matching

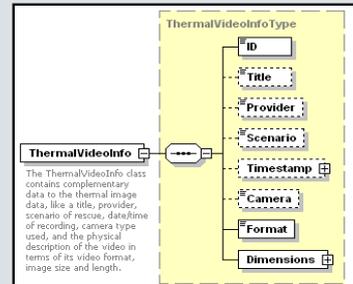
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### Research activities Content description of thermal videos



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### Research activities Content description of thermal videos



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Research activities  
Content description of thermal videos

ShotType

ShotInfo

Shot

CivilianAppearance

FirefighterAppearance

FireAppearance

ObjectAppearance

Comment

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Research activities  
Content description of thermal videos

CivilianAppearanceType

CivilianInstance

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Research activities  
Content description of thermal videos

Representation

Region

SubRegion

Component

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Research activities  
Querying based on the Schema

Questions on fire:

- > Is there any fire in the XXX scenario?
- > Is there any fire in the XXX scene?
- > Is there any fire in the XXX scene having YYY status?
- > Where is the fire in the XXX scene at the YYY time?
- > Where is the fire in the XXX scene having YYY status?
- > What is the status of the fire in the XXX scene?

Questions on human:

- > Are there any humans in the XXX scenario?
- > Are there any humans in the XXX scene?
- > Are there any humans in the XXX scene having YYY status?
- > Where are humans in the XXX scene at the YYY time?
- > Are there any humans in the XXX scene having YYY status?
- > Where are humans in the XXX scene having YYY status?
- > What is the status of humans in the XXX scene?
- > Are there any humans in the XXX scene having YYY activity?
- > Where are humans in the XXX scene having YYY activity?
- > What is the activity of humans in the XXX scene?

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Research activities  
Fire detection with Fourier analysis

- Fire has a special behavior in the frequency domain, so temporal Fourier analysis can be executed to check it, as fire usually has 0.5-20Hz flickering. Artificial fire:

$F(u)$  is the average temporal Fourier transform for the changing points.

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Research activities  
Fire detection with Fourier analysis

- Natural fire:

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**Research activities**  
**Fire detection with Fourier analysis**

- Non-fire videos does not contain strong peaks in the investigated frequency domain

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**Research activities**  
**Supervised object extraction by snakes**

- GVF snakes are used to extract objects starting from some user defined initial points
- Insufficient number of snake iterations can miss concavities
- Improvement of concavity performance and reduction of iteration steps are useful

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**Research activities**  
**Supervised object extraction by snakes**

Snake (active contour) model:

$$v(s) = (x(s), y(s)) \quad (0 \leq s \leq 1)$$

Energy functional to minimize:

$$E_{snake} = \int_0^1 E_{int}(v(s)) + E_{image}(v(s)) ds$$

Internal snake forces:

$$E_{int} = (\alpha(s)|v_s(s)|^2 + \beta(s)|v_{ss}(s)|^2)/2$$

External force field (GVF):

$$G(x; y) = (q(x; y); r(x; y))$$

which minimizes:

$$\iint \mu(q_x^2 + q_y^2 + r_x^2 + r_y^2) + |\nabla E|^2 |G - \nabla E|^2 dx dy \quad q = \frac{\partial E_{image}}{\partial x} \quad r = \frac{\partial E_{image}}{\partial y}$$

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**Research activities**  
**Divergence of GVF field**

For a vector field:  $F(x, y) = P(x, y)i + Q(x, y)j$   
 Its divergence is defined as:  $div F = \frac{\partial P}{\partial x} + \frac{\partial Q}{\partial y}$

High divergence: Low divergence:

Thresholding to decide:  $div F < \theta$

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**Improving GVF snake**  
**Triangle step**

- We detect bad snake segments based on divergence, estimate snake directions and select a new snake point inside the concavity

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**Research activities**  
**Supervised object extraction by snakes**

- Tracing quadrees for better concavity performance
  - We cover the expected object boundary with a grid with larger scale (quadtree decomposition)

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**Research activities**  
Supervised object extraction by snakes

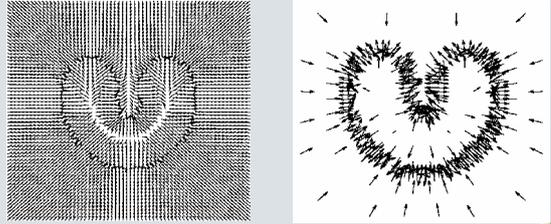
- Tracing quadrees for better concavity performance
  - A boundary tracer is generalized for the „thick arc” representation, followed by pixelwise iterations to finish



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**Research activities**  
Supervised object extraction by snakes

- Content adaptive heterogeneous snakes
  - We can make faster the snake iteration within homogeneous subregions (regions can be defined e.g. by quadrees)



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**Research activities**  
Supervised object extraction by snakes

- Content adaptive heterogeneous snakes
  - The snake captures the rough boundary in a few iteration steps on the larger grid (e.g. four steps is needed for U-shape)



- A common advantage of these quadtree-based approaches that they are adaptive (the quadtree is based on the image content), and noise suppression can be applied.

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**Research activities**  
Object detection and recognition

- Creating human pose database
  - For detection, based on whole object (human) silhouettes a database is created with different activities and views
  - Activities:
    - Running
    - Walking
    - Falling/lying
    - Sitting (testing reasons)
    - Punching (testing reasons)
  - Views:
    - Front
    - Side
    - Top

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**Research activities**  
Object detection and recognition

- Creating human pose database
  - Realistic 3D modeling software was used



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**Research activities**  
Object detection and recognition

- Creating human pose database

<p>Walking</p> 	<p>Running</p> 
<p>Falling/lying</p> 	<p>Punching (demo)</p> 

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**Research activities**  
**Object detection and recognition**

- Creating human pose database
  - Since chamfer matching is used to locate database templates...



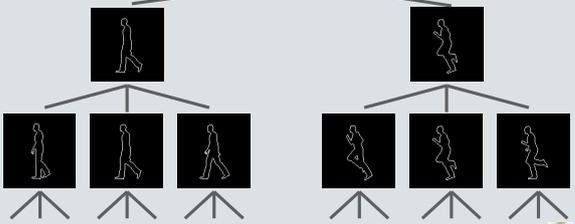
...boundary tracing is applied to extract database elements



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**Research activities**  
**Object detection and recognition**

- Hierarchical clustering for template databases
  - Templates are organized into hierarchy for faster matching



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**Research activities**  
**Object detection and recognition**



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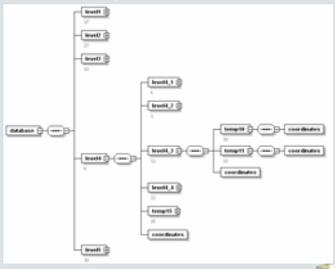
**Research activities**  
**Object detection and recognition**

- Textual description of database for faster matching
  - Database is stored as an XML file containing silhouette vectors

```

<database>
  <level1>
    + <level1_1>
    + <level1_2>
    + <temp39>
    + <temp36>
    <coordinates>(-54,-3)
  </level1>
  + <level2>
  + <level3>
  + <level4>
  + <level5>
</database>

```

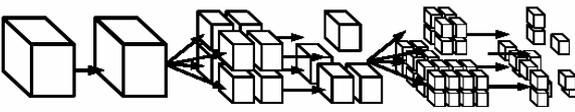


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**Research activities**  
**Object detection and recognition**

- Divide and conquer strategy for affine distortions
  - The templates may occur in a geometrically distorted way
  - Usually, affine transformations are sufficient to be considered
  - A „divide and conquer“ strategy is used to restrict the search of the affine (6D) parameter space

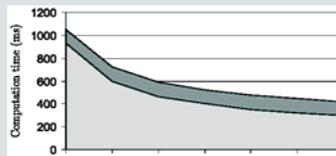
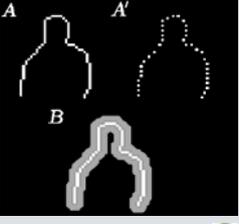
Evaluate Subdivide Evaluate Subdivide Evaluate



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**Research activities**  
**Object detection and recognition**

- Object simplification for faster matching
  - For further speed up a point reduction method was developed which preserves the most optimal subset for chamfer matching
  - It can be applied to any sets in arbitrary dimension. Contours:

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**Research activities**  
Centroidal Voronoi Tessellation (CVT) framework

Given

- $\Omega \in \mathbb{R}^d$
- a density function  $\rho$
- $k$  points  $\{x_i\}_{i=1}^k$  in  $\Omega$

the set  $\{V_i\}_{i=1}^k$  is a Voronoi tessellation (VT) of  $\Omega$  corresponding to the points  $\{x_i\}_{i=1}^k$  if, for each  $i$ ,

$$V_i = \{x \in \Omega : |x - x_i| \leq |x - x_j| \text{ for } i \neq j\}$$

the Center of Mass of each Voronoi set  $V_i$ ,  $i = 1, \dots, k$ , is given by

$$z_i = \frac{\int_{V_i} x \rho(x) dx}{\int_{V_i} \rho(x) dx}$$

\*\*\* VT = CVT if  $z_i = x_i$  for all  $i$  \*\*\*

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**Research activities**  
Centroidal Voronoi Tessellation (CVT) framework

Given

- any set  $\{y_i\}_{i=1}^k$  of  $k$  points in  $\Omega$
- any tessellation  $\{W_i\}_{i=1}^k$  of  $\Omega$

let

$$F(\{y_i, W_i\}) \equiv \sum_{i=1}^k \int_{W_i} \rho(x) |x - y_i|^2 dx$$

electrical engineer: distortion value  
statistician: variance  
planner, manager: cost

tessellations of a square

tessellations on a sphere

if  $F(\{z_i, V_i\}) = \min_{\{y_i, W_i\}} F(\{y_i, W_i\})$   
then  
 $\{V_i\}_{i=1}^k$  is a CVT with generators  $\{z_i\}_{i=1}^k$

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**Research activities**  
Region-based Centroidal Voronoi Tessellation

We should remove points from the original template in such a way that is optimal with respect to the matching function.

Optimization problem

**Problem:** Reduce the set  $A \subseteq B$  with  $|A| = N$  to  $|A'| = K$ , such that the distance map of  $A'$  remains as close as possible to the distance map of  $A$  within  $B$ .

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**Research activities**  
Region-based Centroidal Voronoi Tessellation

**Iteration:**

- Construct the Voronoi tessellation  $\{V_i\}_{i=1}^K$  of  $B$  with generators  $\{x_i \in A \mid i = 1, \dots, K\}$ ;
- Define the new set of generators as the points of  $A$  closest to the centroids of  $\{V_i\}_{i=1}^K$ ;
- Repeat steps 1 and 2 until some stopping criterion is met.

Other algorithms (e.g. random sampling) are also possible.

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**Research activities**  
Object detection and recognition

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**Research activities**  
Object detection and recognition

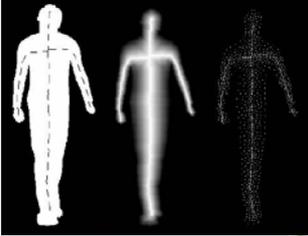
- Object simplification for faster matching
  - ... and regions:

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**Research activities**  
Object detection and recognition

- Object simplification for faster matching
  - Simplification can be done with weighting the set differently

$$\tilde{\varrho}(\mathbf{x}) = \frac{d(\mathbf{x}, \overline{B^c})}{d(\mathbf{x}, \text{sk}(A)) + d(\mathbf{x}, \overline{B^c})}$$

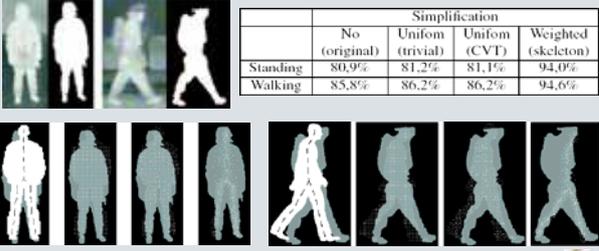
$$\varrho(\mathbf{x}) = \frac{\tilde{\varrho}(\mathbf{x})}{\int_B \tilde{\varrho}(\mathbf{y}) d\mathbf{y}}, \text{ for } \mathbf{x} \in B$$


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**Research activities**  
Object detection and recognition

- Simplification using a skeleton-based weight function

	Simplification			
	No (original)	Unifom (trivial)	Unifom (CVT)	Weighted (skeleton)
Standing	80,9%	81,2%	81,1%	94,0%
Walking	85,8%	86,2%	86,2%	94,6%



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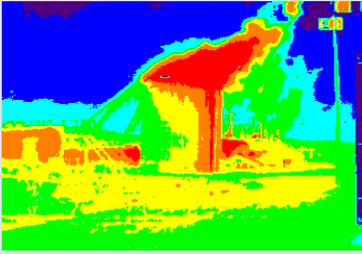
**Software module – 2<sup>nd</sup> prototype**

- Tasks in the 2<sup>nd</sup> prototype
  - Colorization
  - Hotspot detection
  - Fire detection
  - Boundary detection
  - Boundary tracking
  - Boundary object recognition
  - Automatic object detection

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**Software module – 2<sup>nd</sup> prototype**

- Colorization tool



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**Software module – 2<sup>nd</sup> prototype**

- Hotspot detection tool



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**Software module – 2<sup>nd</sup> prototype**

- Fire detection tool

```

- <FireAppearance>
  <ID>1</ID>
  <TimeIn>10:00:23</TimeIn>
  <TimeOut>10:00:30</TimeOut>
- <FireInstances>
  - <FireInstance>
    <ID>1</ID>
    - <ROIMarking>
      <ID>1</ID>
      - <Representation>
        <ID>1</ID>
        - <BoundingBox>
          <Width>70</Width>
          <Height>19</Height>
          - <Center>
            <X>67</X>
            <Y>170</Y>
          </Center>
        </BoundingBox>
      </ROIMarking>
    </FireInstance>
  </FireInstances>
  </FireAppearance>
  
```

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Software module – 2<sup>nd</sup> prototype

- Boundary detection tool



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Software module – 2<sup>nd</sup> prototype

- Boundary object recognition tool



```

- <CivilianAppearance>
  <ID>1</ID>
  <TimeIn>10:00:23</TimeIn>
  <TimeOut>10:00:23</TimeOut>
- <CivilianInstances>
  - <CivilianInstance>
    <ID>1</ID>
    - <ROI Marking>
      <ID>1</ID>
    - <Representation>
      <ID>1</ID>
    - <Contour>
      <ComposingPoints>(147,25)
    </ComposingPoints>
  
```

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Software module – 2<sup>nd</sup> prototype

- Boundary tracking tool



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Software module – 2<sup>nd</sup> prototype

- Automatic object detection



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Thank you

Thank you for your attention.

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