

Practical Lab
Variational Methods and Inverse Problems in Imaging
Summer term 2014
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Problem sheet 2

May 16th, 2014

Problem 2 (Chan-Vese segmentation)

During the next weeks we will study the Chan-Vese level set approach for the piecewise constant Mumford Shah model. To obtain a segmentation the following energy is to be minimized:

$$E_{CV}[c_1, c_2, \phi] = \frac{1}{2} \int_{\Omega} (u - c_1)^2 (1 - H(\phi)) + (u - c_2)^2 H(\phi) \, dx + \nu \int_{\Omega} |\nabla H(\phi)|_{\epsilon} \, dx.$$

Our ultimate goal is to implement the alternating minimization algorithm discussed in the lecture. To lay the foundations we will set up all required finite element operators to be able to assemble and solve the system of equations for one semi implicit time step:

$$\begin{aligned} (M[\Phi^k] + \tau L[\Phi^k]) \bar{\Phi}^{k+1} &= \tau \bar{F}[c_1, c_2] + M[\Phi^k] \bar{\Phi}^k, \quad \text{where} \\ M[\Phi] &:= \left(\int_{\Omega} \mathcal{I}_1(\psi_i \psi_j) \mathcal{I}_0 \left(H'_{\rho}(\Phi)^{-1} \right) \, dx \right)_{i,j \in I} \\ L[\Phi] &:= \left(\nu \int_{\Omega} \frac{\mathcal{I}_0(\nabla \psi_i \cdot \nabla \psi_j)}{\mathcal{I}_0(|\nabla \Phi|_{\epsilon})} \, dx \right)_{i,j \in I} \\ \bar{F}[c_1, c_2] &:= \left(\frac{1}{2} \int_{\Omega} \mathcal{I}_0 \left(((c_1 - u_0)^2 - (c_2 - u_0)^2) \psi_i \right) \, dx \right)_{i \in I} \end{aligned}$$

We approximate the Heaviside function by

$$H_{\rho}(s) = \frac{1}{2} \left(1 + \frac{2}{\pi} \arctan \left(\frac{s}{\rho} \right) \right).$$

For fixed Φ^k we can compute the optimal intensities c_1^k and c_2^k by

$$c_1^k = \frac{\int_{\Omega} \mathcal{I}_0(u_0(1 - H_{\rho}(\Phi^k))) \, dx}{\int_{\Omega} \mathcal{I}_0(1 - H_{\rho}(\Phi^k)) \, dx}, \quad c_2^k = \frac{\int_{\Omega} \mathcal{I}_0(u_0 H_{\rho}(\Phi^k)) \, dx}{\int_{\Omega} \mathcal{I}_0(H_{\rho}(\Phi^k)) \, dx}.$$

Your tasks (May 9th, 2014):

- (i) Write a class `MyHeavisideFunction` with member functions `evaluate` and `evaluateDerivative`, where ρ is passed to the constructor.

- (ii) Derive classes from `FENonlinIntegrationScalarInterface` to compute the numerators and the denominators of c_1^k and c_2^k . To evaluate u_0 at a given quadrature point you can use `DiscreteFunctionDefault` which then needs to be passed to the constructor of your operator. The piecewise constant interpolation \mathcal{I}_0 will be achieved by using an appropriate quadrature rule, i. e. a quadrature of order 1 which is evaluated at the center of mass.
- (iii) Implement the weighted mass matrix by deriving from `LumpedMassOpInterface` and implementing `getCoeff`. This interface will exploit the fact that mass lumping leads to diagonal matrices. Pass the nodal values vector of the level set function $\bar{\Phi}$ as a `DiscreteFunctionDefault` object. To evaluate this discrete function in the center of mass either use `evaluate` with local coordinates (0.5,0.5) or set the quadrature rule for the `DiscreteFunctionDefault` object to order 1 and use `evaluateAtQuadPoint`.
- (iv) Likewise implement the weighted stiffness matrix by overwriting `getCoeff` of `FELinScalarWeightedStiffInterface`. Again, pass $\bar{\Phi}$ as a `DiscreteFunctionDefault` object and choose the quadrature rule appropriately. Recall $|x|_\epsilon = \sqrt{x^2 + \epsilon^2}$.
- (v) For the vector \bar{F} derive from `FENonlinOpInterface` and implement `getNonlinearity`. Again, choose the quadrature rule appropriately and pass u_0 .
- (vi) Finally try to compute c_1 and c_2 for fixed u_0 and $\bar{\Phi}$ and solve the system of equations for fixed τ . This will later become a single step of the alternating minimization algorithm.

Your tasks (May 16th, 2014):

Implement the full Chan-Vese model with $\tau_0 = 512$, $\rho = 10^{-4}$, $\nu = 5 \cdot 10^{-3}$ and $\epsilon = 10^{-5}$!

Some hints:

- (i) The following headers should be included:
`adaptiveGridPlotter.h`, `adaptiveQuocUtils.h`
- (ii) To load an image, you can either use the constructor of a `ScalarArray` or the method `loadPNG`. Afterwards you have to run the `AdaptiveArrayConverter` for compatibility issues with the adaptive grids. Furthermore, the `AdaptiveGridPlotter` allows you to save your results.
- (iii) We provide the class `SemImplicitGradientDescent` to perform the semi-implicit gradient descent. Derive a class `ImplicitPart` from
`aol::SemImplicitGradientDescentImplicitPart`
and overload the following methods:
`assembleSystemMatrix`, `constructRHS`, `setTau`.