

In order to run the Genetic Algorithm coupled to the Pore Network Model, several alterations need to be made to the OpenPNM v2.6 documentation.

The changes are shown in **red**, and the surface area alteration for the extracted network is shown in **green**.

## Openpnm - Topotools:

```
def merge_pores(network, pores, geo, labels=['merged']):
```

```
    r"""
```

```
    Combines a selection of pores into a new single pore located at the
    centroid of the selected pores and connected to all of their neighbors.
```

```
    Parameters
```

```
    -----
```

```
    network : OpenPNM Network Object
```

```
    pores : array_like
```

```
        The list of pores which are to be combined into a new single pore
```

```
    labels : string or list of strings
```

```
        The labels to apply to the new pore and new throat connections
```

```
    Notes
```

```
    ----
```

```
    (1) The method also works if a list of lists is passed, in which case
    it consecutively merges the given selections of pores.
```

```
    (2) The selection of pores should be chosen carefully, preferable so that
    they all form a continuous cluster. For instance, it is recommended
    to use the ``find_nearby_pores`` method to find all pores within a
    certain distance of a given pore, and these can then be merged without
    causing any abnormal connections.
```

```
    Examples
```

```
    -----
```

```
>>> import openpnm as op
>>> pn = op.network.Cubic(shape=[20, 20, 1])
>>> Ps = pn.find_nearby_pores(pores=111, r=5, flatten=True)
>>> op.topotools.merge_pores(network=pn, pores=Ps, labels=['merged'])
>>> print(pn.Np)
321
>>> pn.pores('merged')
array([320])
>>> pn.num_throats('merged')
32
```

```

"""
# Assert that `pores` is list of lists
try:
    len(pores[0])
except (TypeError, IndexError):
    pores = [pores]

N = len(pores)
NBs, XYZs = [], []

for Ps in pores:
    temp = network.find_neighbor_pores(pores=Ps, mode='union', flatten=True,
                                       include_input=False)
    NBs.append(temp)
    points = np.concatenate((temp, Ps))
    # XYZs.append(hull_centroid(network["pore.coords"][[points], project, network))
    XYZs.append(hull_centroid(geo, network, pores))

extend(network, pore_coords=XYZs, labels=labels)
Pnew = network.Ps[-N::]

# Possible throats between new pores: This only happens when running in
# batch mode, i.e. multiple groups of pores are to be merged. In case
# some of these groups share elements, possible throats between the
# intersecting elements is not captured and must be added manually.
pores_set = [set(items) for items in pores]
NBs_set = [set(items) for items in NBs]
ps1, ps2 = [], []
from itertools import combinations
for i, j in combinations(range(N), 2):
    if not NBs_set[i].isdisjoint(pores_set[j]):
        ps1.append([network.Ps[-N+i]])
        ps2.append([network.Ps[-N+j]])

# Add (possible) connections between the new pores
connect_pores(network, pores1=ps1, pores2=ps2, labels=labels)
# Add connections between the new pores and the rest of the network
connect_pores(network, pores2=np.split(Pnew, N), pores1=NBs, labels=labels)
# Trim merged pores from the network
trim(network=network, pores=np.concatenate(pores))

# def hull_centroid(points):
#     r"""
#     Computes centroid of the convex hull enclosing the given coordinates.

#     Parameters
#     -----
#     points : Np by 3 ndarray
#         Coordinates (xyz)

#     Returns

```

```

# -----
# centroid : array
#     A 3 by 1 Numpy array containing coordinates of the centroid.

# """
# dim = [np.unique(points[:, i]).size != 1 for i in range(3)]
# hull = ConvexHull(points[:, dim])
# centroid = points.mean(axis=0)
# centroid[dim] = hull.points[hull.vertices].mean(axis=0)

# return centroid

```

```

def hull_centroid(geo, network, pores):

```

```

    # ONLY VALID WHEN MERGED IN TWO PORES ONLY!

```

```

    coords = network['pore.coords'][pores[0]]
    x_coord = (coords[0,0] + coords[1,0])/2
    y_coord = (coords[0,1] + coords[1,1])/2
    z_coord = (coords[0,2] + coords[1,2])/2
    centroid = [x_coord, y_coord, z_coord]

```

```

    return centroid

```

# Openpnm – Algorithms – Reactive Transport:

```
def run(self, x0=None):
    r"""
    Builds the A and b matrices, and calls the solver specified in the
    ``settings`` attribute.

    Parameters
    -----
    x0 : ND-array
        Initial guess of unknown variable
    """
    self._validate_settings()
    # Check if A and b are well-defined
    self._validate_data_health()
    quantity = self.settings['quantity']
    logger.info('Running ReactiveTransport')
    x0 = np.zeros(self.Np, dtype=float) if x0 is None else x0
    self["pore.initial_guess"] = x0
    x, y = self._run_reactive(x0)
    self[quantity] = x

    return x, y

@docstr.dedent

def _run_reactive(self, x0):
    r"""
    Repeatedly updates ``A``, ``b``, and the solution guess within according
    to the applied source term then calls ``_solve`` to solve the resulting
    system of linear equations.

    Stops when the residual falls below ``solver_tol * norm(b)`` or when
    the maximum number of iterations is reached.

    Parameters
    -----
    x0 : ND-array
        Initial guess of unknown variable

    Returns
    -----
    x : ND-array
        Solution array.

    Notes
    ----
    The algorithm must at least complete one iteration, and hence the check for
    itr >= 1, because otherwise, _check_for_nans() never get's called in case
    there's something wrong with the data, and therefore, the user won't get
```

notified about the root cause of the algorithm divergence.

```
"""
w = self.settings['relaxation_quantity']
quantity = self.settings['quantity']
max_it = self.settings['nlin_max_iter']
# Write initial guess to algorithm obj (for _update_iterative_props to work)
self[quantity] = x = x0
# Update A and b based on self[quantity]
self._update_A_and_b()
# Just in case you got a lucky guess, i.e. x0!
if self._is_converged():
    logger.info(f'Solution converged: {self._get_residual():.4e}')
    y = True
    return x, y

for itr in range(max_it):
    # Solve, use relaxation, and update solution on algorithm obj
    self[quantity] = x = self._solve(x0=x) * w + x * (1 - w)
    self._update_A_and_b()
    # Check solution convergence
    if self._is_converged():
        logger.info(f'Solution converged: {self._get_residual():.4e}')
        y = True
        return x, y
    logger.info(f'Tolerance not met: {self._get_residual():.4e}')

if not self._is_converged():
    # raise Exception(f'Not converged after {max_it} iterations.')
    y = False
    return x, y
```

# Openpnm – Algorithms – Generic Transport:

```
def _solve(self, A=None, b=None, x0=None):
    """
    Sends the A and b matrices to the specified solver, and solves for *x*
    given the boundary conditions, and source terms based on the present
    value of *x*. This method does NOT iterate to solve for non-linear
    source terms or march time steps.
```

Parameters

-----

A : sparse matrix

The coefficient matrix in sparse format. If not specified, then it uses the ``A`` matrix attached to the object.

b : ND-array

The RHS matrix in any format. If not specified, then it uses the ``b`` matrix attached to the object.

x0 : ND-array

The initial guess for the solution of  $Ax = b$

Notes

-----

The solver used here is specified in the ``settings`` attribute of the algorithm.

"""

```
x0 = np.zeros_like(self.b) if x0 is None else x0
```

```
# Fetch A and b from self if not given, and throw error if not found
```

```
A = self.A if A is None else A
```

```
b = self.b if b is None else b
```

```
if A is None or b is None:
```

```
    raise Exception('The A matrix or the b vector not yet built.')
```

```
A = A.tocsr()
```

```
# Check if A and b are STILL well-defined
```

```
self._validate_data_health()
```

```
# Check if A is symmetric
```

```
if self.settings['solver_type'] == 'cg':
```

```
    is_sym = op.utils.is_symmetric(self.A)
```

```
    if not is_sym:
```

```
        raise Exception('CG solver only works on symmetric matrices.')
```

```
# Fetch additional parameters for iterative solvers
```

```
max_it = self.settings["solver_max_iter"]
```

```
atol = self._get_atol()
```

```
rtol = self._get_rtol(x0=x0)
```

```
# Fetch solver object based on settings dict.
```

```

solver = self._get_solver()
x = solver(A, b, atol=atol, rtol=rtol, max_it=max_it, x0=x0)

# Check solution convergence
# if not self._is_converged(x=x):
#     raise Exception("Solver did not converge.")

return x

def _get_solver(self):
    r"""
    Fetch solver object based on solver settings stored in settings dict.

    Notes
    -----
    The returned object can be called via ``obj.solve(A, b, x0[optional])``

    """
    # SciPy
    if self.settings['solver_family'] == 'scipy':
        def solver(A, b, atol=None, rtol=None, max_it=None, x0=None):
            r"""
            Wrapper method for scipy sparse linear solvers.
            """
            ls = getattr(scipy.sparse.linalg, self.settings['solver_type'])
            if self.settings["solver_type"] == "spsolve":
                x = ls(A=A, b=b)
            else:
                tol = self.settings["solver_tol"]
                x, _ = ls(A=A, b=b, atol=atol, tol=tol, maxiter=max_it, x0=x0)
            return x
        # PETSc
        elif self.settings['solver_family'] == 'petsc':
            def solver(A, b, atol=None, rtol=None, max_it=None, x0=None):
                r"""
                Wrapper method for PETSc sparse linear solvers.
                """
                from openpnm.utils.petsc import PETScSparseLinearSolver as SLS
                temp = {"type": self.settings["solver_type"],
                        "preconditioner": self.settings["solver_preconditioner"]}
                ls = SLS(A=A, b=b, settings=temp)
                x = ls.solve(x0=x0, atol=atol, rtol=rtol, max_it=max_it)
                return x
            # PyAMG
            elif self.settings['solver_family'] == 'pyamg':
                def solver(A, b, rtol=None, max_it=None, x0=None, **kwargs):
                    r"""
                    Wrapper method for PyAMG sparse linear solvers.
                    """
                    import pyamg
                    ml = pyamg.smoothed_aggregation_solver(A)

```

```

        x = ml.solve(b=b, x0=x0, tol=rtol, maxiter=max_it, accel="bicgstab")
        return x
# PyPardiso
elif self.settings['solver_family'] == 'pypardiso':
    try:
        import pypardiso
    except ModuleNotFoundError:
        if self.Np <= 8000:
            # logger.critical("Pardiso not found, reverting to much "
            #                 + "slower spsolve. Install pardiso with: "
            #                 + "conda install -c conda-forge pardiso4py")
            self.settings['solver_family'] = 'scipy'
            return self._get_solver()
        else:
            raise Exception("Pardiso not found. Install it with: "
                            + "conda install -c conda-forge pardiso4py")

def solver(A, b, **kwargs):
    r"""
    Wrapper method for PyPardiso sparse linear solver.
    """
    x = pypardiso.spsolve(A=A, b=b)
    return x
else:
    raise Exception(f"{self.settings['solver_family']} not available.")

return solver

def _is_converged(self, x=None):
    r"""
    Check if solution has converged based on the following criterion:
    res <= max(norm(b) * tol, atol)
    """
    res = self._get_residual(x=x)
    # Verify that residual is finite (i.e. not inf/nan)
    if not np.isfinite(res):
        # logger.error(f"Solution diverged: {res:.4e}")
        # raise Exception(f"Solution diverged, undefined residual: {res:.4e}")
        flag_converged = False
    # Check convergence
    tol = self.settings["solver_tol"]
    res_tol = norm(self.b) * tol
    flag_converged = True if res <= res_tol else False
    return flag_converged

```



# Openpnm – Models – Geometry:

```
r"""
```

This submodule contains pore-scale models that calculate geometrical properties. These models are to be added to a Geometry object.

```
"""
```

```
from . import pore_size
from . import pore_seed
from . import pore_volume
from . import pore_surface_area
from . import pore_cross_sectional_area
from . import throat_endpoints
from . import throat_cross_sectional_area
from . import throat_seed
from . import throat_size
from . import throat_length
from . import throat_perimeter
from . import throat_surface_area
from . import throat_volume
from . import throat_capillary_shape_factor
from . import throat_centroid
from . import throat_vector
```

```
# Up for deprecation
```

```
pore_area = pore_cross_sectional_area
```

```
throat_area = throat_cross_sectional_area
```

```
def pore_label(target):
    for j in range(len(target)):
        target = j

    return target
```

# Openpnm – Models – Geometry – Pore Surface Area:

```
def sphere(
    target,
    pore_diameter='pore.diameter',
    throat_cross_sectional_area='throat.cross_sectional_area',
):
    r"""
    Calculates internal surface area of pore bodies assuming they are
    spherical then subtracts the area of the neighboring throats in a
    crude way, by simply considering the throat cross-sectional area, thus
    not accounting for the actual curvature of the intersection.

    Parameters
    -----
    target : GenericGeometry
        The Geometry object for which these values are being calculated.
        This controls the length of the calculated array, and also
        provides access to other necessary thermofluid properties.
    pore_diameter : str
        The dictionary key to the pore diameter array.
    throat_cross_sectional_area : str
        The dictionary key to the throat cross sectional area array.
        Throat areas are needed since their insection with the pore are
        removed from the computation.

    Returns
    -----
    value : NumPy ndarray
        Array containing pore surface area values.

    """
    network = target.project.network
    R = target[pore_diameter] / 2
    Asurf = 4 * _np.pi * R**2
    Tn = network.find_neighbor_throats(pores=target.Ps, flatten=False)
    Tsurf = _np.array([network[throat_cross_sectional_area][Ts].sum() for Ts in Tn])
    value = Asurf # - Tsurf
    return value
```