

Backward stepwise selection

$$\mathcal{S}_P = \mathcal{P}$$

for $k = P - 1 \dots 1$:

for $\kappa, \phi_p \in \text{enumerate}(\mathcal{S}_{k+1})$

$$\mathcal{A}_\kappa = \mathcal{S}_{k+1} \setminus \phi_p$$

$$\hat{\theta}_\kappa = \text{train}(\mathcal{A}_\kappa, \mathcal{D}_{\text{train}})$$

$$\ell_\kappa = \text{perf}(\mathcal{A}_\kappa, \hat{\theta}_\kappa, \mathcal{D}_{\text{val}})$$

$$\kappa^* = \text{argbest}(\{\ell_\kappa\})$$

$$\mathcal{S}_k = \mathcal{A}_{\kappa^*}$$

$$\mathcal{S}^* = \text{best of } \{\mathcal{S}_k\}_P$$

$$\hat{\theta}^* = \text{train}(\mathcal{S}^*, \mathcal{D}_{\text{train}})$$

$$\ell^* = \text{perf}(\mathcal{S}^*, \hat{\theta}^*, \mathcal{D}_{\text{test}})$$

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curlyS = [set() for i in range(P+1)]
curlyS[P] = set(features)
ellk = np.full(P+1, np.inf)

for k in range(...): # TODO

    assert k+1 == len(curlyS[k+1])
    curlyA = [set() for i in range(k+1)]
    ellkappa = np.full(k+1, np.inf)

    for kappa, phip in enumerate(...): # TODO
        curlyA[kappa] = ... # TODO
        theta0hat, theta1hat = train( curlyA[kappa] , Dtrain)
        ellkappa[kappa] = perf(curlyA[kappa], theta0hat, theta1hat,
                               Dvalidate)

    kappastar = ellkappa.argmin()
    curlyS[k] = curlyA[kappastar]
    ellk[k] = ellkappa[kappastar]

kstar = ellk.argmin()
Sstar = curlyS[kstar]
theta0star, theta1star = train(Sstar , Dtrain)
ellstar = perf(Sstar, theta0star, theta1star, Dtest)

# Store the results
b_ellk = ellk
b_ellstar = ellstar
b_kstar = kstar
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