

Department of Mathematics

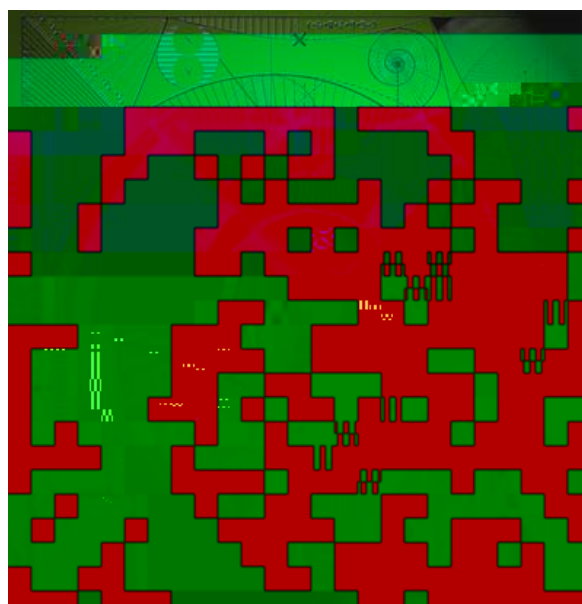
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State estimation using model order reduction for unstable systems

by

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T b  , a  a cc  a a  ca  , fl d fl .
F a  , d c a  ab  a , ca   a  fi d
b   b  a , a  a , a  . T fi d 
b   a a  a  a  a  b  a  b  d  b c
d a ca   c  a  . U a    d a  b a a -
a Ga  -N d d   d c  a  
 a  ab  . I  a a d , d  
d a a  b  ba  d a c  d  d d 
d c d , ab   . T  a ca   ,

$a, \quad ca, \quad Da \, a \, a \quad a \quad c \quad a \quad fi \, d \quad b \quad a \, b$
 $c \quad b \quad a \quad da \, a \quad a \quad ca \quad d \quad . \, I$
 $a \quad c \quad -d \quad a \, a \, a \quad da \, a \, a \quad (4D-Va)$
 $a \quad b \quad d \, a \, a \quad a \quad a \quad a \quad b$

$$_x \phi(x) = f(x)^T f(x); \tag{1}$$

$f(x) \quad c \quad d \quad a \quad ca \quad d \quad T \quad ,$
 $d \, b \, a \quad a \quad a \quad a \quad Ga \quad -N \quad d,$
 $a \quad a \quad c \quad 4D-Va \quad [1, 2]. \, W \quad a \quad d$
 $a \quad c \quad a \quad d \quad Jac \, b \, a \quad , \quad c \quad f(x) \, a \, d$
 $c \quad Jac \, b \, a \quad , \quad a \quad ca \quad d \quad c \quad , \quad d$
 $a \quad a \quad a \quad d \quad (TLM). \, S \quad fica \quad , \quad ca$
 $d \, c \quad d \quad a \quad d \quad a \, d \quad ab \, b \, a \quad .$
 $I \quad ab \quad TLM \, a \quad d \quad a \quad , \quad ca \quad d$
 $a \quad a \quad ab \quad a \, fi \quad a \quad T \quad a \quad c$
 $b \, ab \quad a \quad a \quad ab \quad d \, b \quad d \quad .$
 $A \, c \quad d \, a \quad ac \quad d \, c \quad c \quad b$
 $(1) \quad a \quad a \quad TLM \, b \, a \quad a \quad d \quad d \, a \quad a \, a$
 $\quad . \, W \quad ad \quad a \quad a \quad a \quad ac \, ca \quad c$

(2) ca b ac c , d b a Ga -N d. T f a d fi d
a a a ac a a a a a

(k)

$$\phi(\delta x_0^{(k)}) = \|J_f \delta x_0^{(k)} + f(x_0^{(k)})\|_2^2; \quad (3)$$

$$x_0^{(k+1)} = x_0^{(k)} + \delta x_0^{(k)} \cdot \mathbb{I} \left(\frac{J_f d}{\text{Jac } b a} \cdot f \cdot T \right) \quad (2) \quad \text{a} \quad \frac{J_f d}{\text{Jac } b a} \cdot f \cdot T \quad \text{b}$$

$$J_f = \begin{bmatrix} \left(B_0^{-\frac{1}{2}}\right)^T & \left(R_0^{-\frac{1}{2}}H_0\right)^T & \left(R_1^{-\frac{1}{2}}H_1M_{1,0}\right)^T & \cdots & \left(R_N^{-\frac{1}{2}}H_NM_{N,0}\right)^T \end{bmatrix}^T; \quad (4)$$

$$H_i := \frac{\partial h_i}{\partial x_i}(x^{(i)})$$

$$\mathcal{S} : \begin{cases} \delta x_{i+1} &= M \delta x_i; \\ d_i &= H \delta x_i; \end{cases} \quad (6)$$
$$T : \mathbb{C} \rightarrow \mathbb{R}^{p-m}; \quad (7)$$

$$T \quad (6) \quad a \quad M \quad a \quad d \quad a \quad d \quad c \quad c. \quad T \quad b \quad ab. \quad fi \quad d$$

$$d \quad a \quad a \quad (6) \quad d \quad a \quad ab. \quad d \quad d \quad c \quad c$$

$$ab. \quad T \quad d \quad \alpha-b \quad d \quad d \quad ba. \quad c \quad d \quad ca \quad a$$

$$c \quad b \quad d \quad d [6] \quad \alpha-b \quad ded, \dots \quad a$$

$$a \quad M \quad a \quad c \quad c \quad a \quad d \quad a$$

$$ad \quad \alpha. \quad F \quad a \quad ab. \quad S \quad b. \quad fi \quad d$$

$$c \quad a \quad \alpha. \quad T \quad \alpha-b \quad d \quad d \quad ba. \quad c \quad d \quad ca \quad c$$

$$a \quad d \quad a \quad a \quad c \quad U \quad a \quad d \quad V, \quad c \quad c \quad a \quad c \quad d$$

$$\mathcal{S}: \begin{cases} \delta \hat{x}_{i+1} &= U^T M V \delta \hat{x}_i; \\ \hat{d}_i &= H V \delta \hat{x}_i; \end{cases} \quad (9)$$

$$\|T - \hat{T}\|_{h_{\infty, \alpha}} \leq 2(\sigma^{\ell}$$

$$T = \frac{1}{\alpha} H(zI - \frac{1}{\alpha} M)^{-1} B_0^{\frac{1}{2}};$$

$$T = \frac{1}{\alpha} H(zI - \frac{1}{\alpha} M)^{-1} B_0^{\frac{1}{2}};$$

$\begin{aligned} & \text{Ga-N} \quad c \, d \quad . \quad A^{\bullet} a^{\bullet} \quad d \quad c \quad d \quad a \\ & d \quad a \quad \text{Ead} \quad d \quad x-z \quad a \quad d \quad ba \quad c \quad c \\ & ab \quad , \quad c \quad d \quad a \quad c \, a \quad , \quad , \quad a \\ & d \quad d \quad . \end{aligned}$

4.1. $E \, e \, e \, a \, de \, g \, i$
 $\begin{aligned} & T \quad d \quad a \quad a \quad 2D \, \text{Ead} \quad d \quad [7] \quad a \quad d \quad - \\ & c \, b \, d. \, T \quad ba \, c \, a \quad b \, a \quad a \quad a \quad d \quad a \quad , \, z, \\ & a \, d \quad a \quad b \quad d \quad a \quad da \quad , \, z = \pm \frac{1}{2}. \\ & F \quad [8] \quad a \quad d \quad a \quad a \quad c \quad a \\ & c \quad (\text{QGPV}) \quad . \quad T \quad a \quad a \quad b \quad ba \\ & b \quad a \, c \, , \, b = b(x; z; t), \quad b \quad da \quad , \, z = \pm \frac{1}{2}, \, a \quad t = 0. \, T \\ & d \quad ca \quad c \quad d \quad ba \quad c \quad a \quad c- \\ & , \quad = (x; z; t), \quad c \quad a \quad fi \quad . \end{aligned}$

$$\frac{\partial^2}{\partial x^2} + \frac{\partial^2}{\partial z^2} = 0; \quad z \in [-\frac{1}{2}; \frac{1}{2}]; \, x \in [0; X]; \quad (13)$$

$b \quad da \quad c \quad d \quad$

$$\frac{\partial}{\partial z} = b; \quad z = \pm \frac{1}{2}; \, x \in [0; X]; \quad (14)$$

$\begin{aligned} P \quad ba \quad ba \, c \, a \quad a \quad ad \, c \, d \quad a \, b \quad ba \, c \, a \quad fi \\ a \, d \, c \, b \, d \, b \quad -d \quad a \, QG \quad d \, a \, c \quad a \quad : \end{aligned}$

$$\left(\frac{\partial}{\partial t} + z \frac{\partial}{\partial x} \right) b = \frac{\partial}{\partial x}; \quad z = \pm \frac{1}{2}; \, x \in [0; X]; \quad (15)$$

$\begin{aligned} T \quad a \, a \, b \quad da \quad c \, d \quad x-d \quad c \quad a \quad a \quad b \quad d \, c \\ c \quad a \, a \, a \quad , \, t, \, a \, d \quad , \, z, \, b(0; z; t) = b(X; z; t) \, a \, d \quad (0; z; t) = \\ (X; z; t). \, A \quad [8] \quad d \quad a \quad x, \, z, \, a \, d \, t. \\ I \quad a \, d \quad , \quad \text{Ead} \quad d \, d \, c \quad d \quad 11 \\ ca \quad a \quad c \quad . \, T \quad a \, 20 \, d \quad a \\ 40 \, d \quad , \quad d \quad a \quad c \quad b. \, T \quad ad \, c \quad a \\ a \, d \, c \quad d \quad a \, a \quad ad \, c \quad c \quad . \, W \quad [8] \quad , \quad a \\ d \, a \quad . \, T \quad b \quad a \quad a \quad H \quad c \quad c \quad a \quad b \quad a \quad a \\ a \quad , \quad a \quad b \quad a \, c \quad . \end{aligned}$

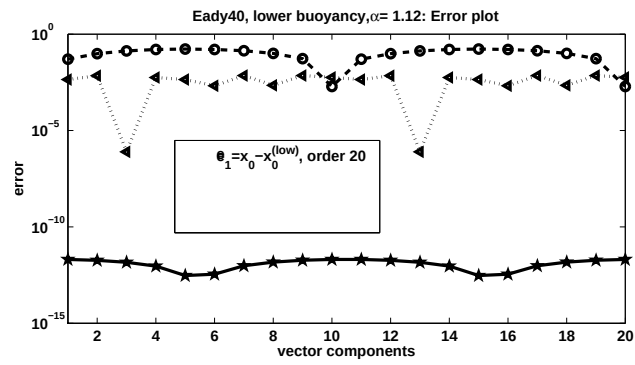
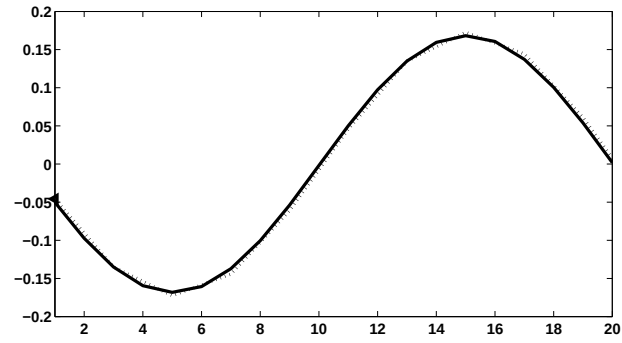
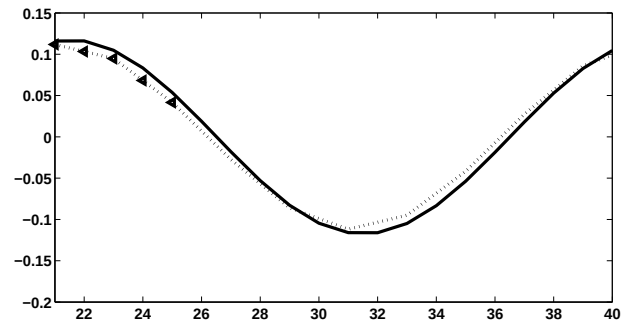


Figure 1: Comparison of low resolution (dotted line with triangles), standard balanced truncation (dashed line with circles), and high resolution (solid line with squares) methods. The x-axis represents the number of modes k (ranging from 0 to 100), and the y-axis represents the error (ranging from 0 to 10). The low resolution method shows a sharp increase in error after $k=20$, while the standard balanced truncation method shows a more gradual increase. The high resolution method maintains a low error across all k .

10 d a d acc a .



(a) Solution on upper boundary

(b) Error on upper boundary

Figure 2: Comparison of low resolution (dotted line with triangles), standard balanced truncation (dashed line with circles) and α -bounded balanced truncation (solid line with stars) approximations to the buoyancy on the upper boundary

T a c . T b fi ca b d a b a c d c d d a W α -b d d d b a c fica a d a d a da d ba c d ca d F 3(a) a (c) F 3(b), 4(a) a d 4(b) a d ff d a a T α -b d d a a d a c a c F 3(b),

b a , a , a a a , a
 d . I 4D-Va d ac d b
 a a a b c a d b a d a
 a d c b a , a I
 a a a ca , c b d a
 a a Ga-N c d . Eac a d
 c a a a b b c a d a
 a a d (TLM). T TLM d d c d, a a
 a d a b ab a fi d . T a c a
 d d a d, a a a d ab.
 U a TLM a a d b a d a a a
 I a a d a d d c d , α-
 b d d ba c d ca a b d b a b a a-
 ab TLM Ga-N c d . T d
 d c c c a d a a TLM
 ca c a I ca b a d d d
 b , ab , d c , a
 ba b d ca b d.
 T d d d c a a , a d
 d d d a , ab, a a , H ,
 b a d ac ca b
 K b ac c fi d c
 W a c a d α-b d d ba c d ca d
 a da d ba c d ca a ac , ab a d
 a a ca a 2-d a
 Ead d T Ead d a d , ba c c ab ,
 c d a c a , a d d
 I ca d a ca α-
 b d d a a d . I ca d a b a ,
 d d . T d a a b a c
 a d b da a d ab, d d . I
 a d , a d b a a d
 a d a a a c

T a d a b NERC Na aC , Ea
 Ob a .

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