

# **Bordered Matrix Methods for Large-Scale Stability Analysis using LOCA**

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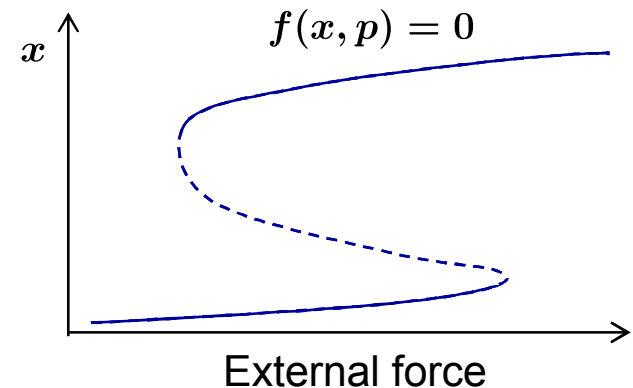
# LOCA: Library of Continuation Algorithms

## Application code provides:

- Nonlinear steady-state residual and Jacobian fill:

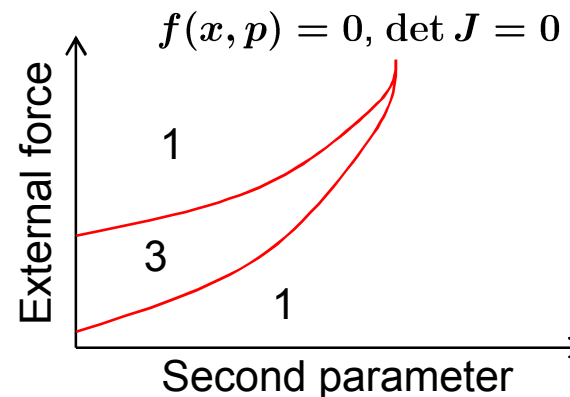
$$f(x, p) = \text{internal} - \text{external force}, \quad J = \frac{\partial f}{\partial x}$$

- Newton-like linear solves:  $J\Delta x = -f$

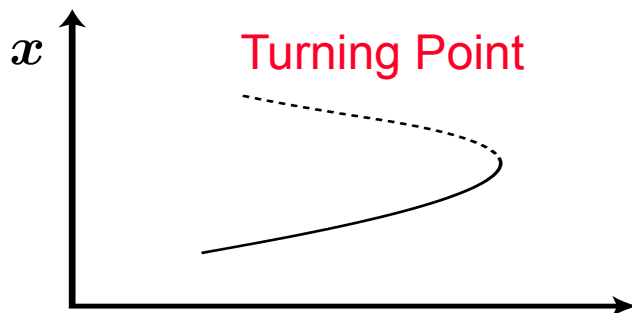


## LOCA provides:

- Parameter Continuation:** Tracks a family of steady state solutions with parameter
- Linear Stability Analysis:** Calculates leading eigenvalues via **Anasazi** (Thornquist, Lehoucq)
- Bifurcation Tracking:** Locates neutral stability point  $(x, p)$  and tracks as a function of a second parameter



# Codimension 1 Bifurcations

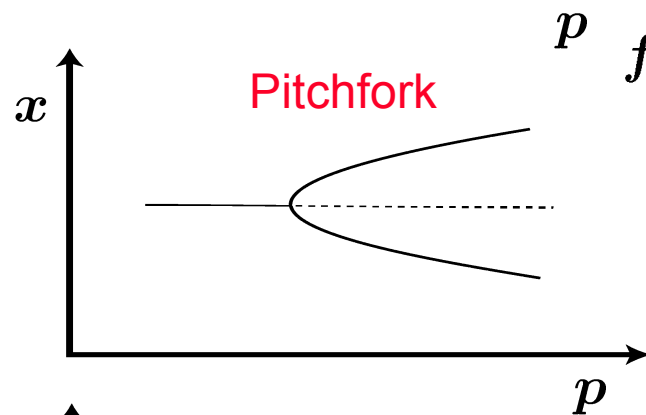


$$f(x, p) = 0$$

$$Jv = 0$$

$$\phi^T v = 1$$

- Combustion
- Buckling of an Arch



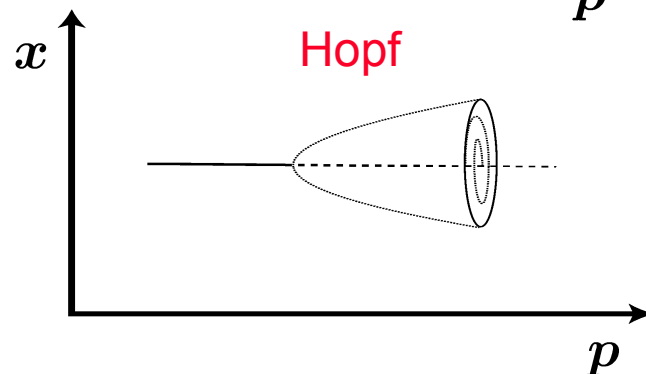
$$f(x, p) + s\psi = 0$$

$$Jv = 0$$

$$\langle x, \psi \rangle = 0$$

$$\phi^T v = 1$$

- Buckling of a Beam
- Pattern formation
- Cell differentiation (morphogenesis)



$$f(x, p) = 0$$

$$Jy - \omega Mz = 0$$

$$Jz + \omega My = 0$$

$$\phi^T y = 1$$

$$\phi^T z = 0$$

- Vortex Shedding
- Predator-Prey models
- Flutter
- El Niño



# New Features for Trilinos 7

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- Conversion to “new” LOCA framework complete, old framework removed
  - Strategies/factories
  - Multi-vector support
  - `LOCA::NewStepper` -> `LOCA::Stepper`
- Epetra support for Hopf bifurcations
  - Leverages `EpetraExt::Block{Graph, CrsMatrix, MultiVector}`
- Minimally augmented turning point formulation
  - Faster, more robust turning point method
  - Uses Householder bordered solver method

# Bordered Systems of Equations

Solving bordered systems of equations is a ubiquitous computation:

$$\begin{array}{cc} n & m \\ n \begin{bmatrix} J & A \end{bmatrix} & \begin{bmatrix} X \\ Y \end{bmatrix} \begin{array}{c} n \\ \overline{m} \end{array} \\ m \begin{bmatrix} B^T & C \end{bmatrix} & \begin{bmatrix} F \\ G \end{bmatrix} \begin{array}{c} n \\ m \end{array} \end{array}$$

$n \gg m, l$

## Bordering Algorithm

$$\begin{aligned} JX_1 &= F \\ JX_2 &= A \\ (C - B^T X_2)Y &= G - B^T X_1 \\ X &= X_1 - X_2 Y \end{aligned}$$

Only requires solves of J but

- Requires  $m+1$  linear solves
- Has difficulty when J is nearly singular

## Pseudo-Arclength Continuation

$$\begin{aligned} f(x, p) &= 0 \\ V_x^T (x - x_i) + V_p (p - p_i) &= \Delta s \end{aligned}$$

## Constraint Following

$$\begin{aligned} f(x, p) &= 0 \\ g(x, p) &= 0 \end{aligned}$$

## Turning Point Identification

$$\begin{aligned} f(x, p) &= 0 \\ \sigma(x, p) &= 0 \end{aligned}$$

# Solving Bordered Systems via QR

Extension of Householder pseudo-arclength technique by Homer Walker<sup>1</sup>

Rearranged Bordered System

$$\begin{bmatrix} C & B^T \\ A & J \end{bmatrix} \begin{bmatrix} Y \\ X \end{bmatrix} = \begin{bmatrix} G \\ F \end{bmatrix}$$

QR Factorization

$$\begin{bmatrix} C^T \\ B \end{bmatrix} = Q \begin{bmatrix} R \\ 0 \end{bmatrix}$$

Compact WY Representation<sup>2</sup>

$$Q = I + WTW^T \\ \in \mathbb{R}^{(n+m) \times (n+m)}$$

$$\begin{bmatrix} Z_Y \\ Z_X \end{bmatrix} = Q^T \begin{bmatrix} Y \\ X \end{bmatrix} \Rightarrow \begin{bmatrix} R^T & 0 \\ [A & J]Q \end{bmatrix} \begin{bmatrix} Z_Y \\ Z_X \end{bmatrix} = \begin{bmatrix} G \\ F \end{bmatrix} \Rightarrow \begin{cases} Z_Y = R^{-T}G \\ PZ_X = \tilde{F} \end{cases}$$

$$\text{where } \begin{cases} PZ_X \equiv [A & J]Q \begin{bmatrix} 0 \\ Z_X \end{bmatrix} \\ \tilde{F} = F - [A & J]Q \begin{bmatrix} Z_Y \\ 0 \end{bmatrix} \end{cases} \quad \text{Write } W = \begin{bmatrix} W_1 \\ W_2 \end{bmatrix} \text{ then}$$

$$P = J + (AW_1 + JW_2)(W_2T)^T = J + UV^T.$$

P is nxn, nonsingular, rank m update to J

<sup>1</sup>H.F Walker, SIAM J. Sci. Comput., 1999

<sup>2</sup>R. Schreiber, SIAM J. Stat. Comput., 1989



# Implementing Householder Bordered Solver Method in LOCA

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- All steps in bordered solver algorithm can be done generically except solve

$$PZ_X = \tilde{F}, \quad P = J + UV^T$$

- Solving P is linear algebra dependent
- Two Epetra implementations of P
  - J is an Epetra\_Operator, P is an Epetra\_Operator
  - J is an Epetra\_RowMatrix, P is an Epetra\_RowMatrix
    - Include  $UV^T$  terms for nonzeros of J for preconditioning
    - Appropriate for Epetra\_RowMatrix based preconditioners
- If J is an Epetra\_CrsMatrix, also can overwrite J with  $J + UV^T$  for Epetra\_CrsMatrix preconditioners



# Calling the Householder Bordered Solver Method in LOCA

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- Methods for solving bordered systems encapsulated in
  - LOCA::BorderedSolver::AbstractStrategy
  - LOCA::BorderedSolver::Factory
  - Selected by parameter lists
- Householder requires LOCA Epetra Factory

```
// Create parameter list
Teuchos::RefCountPtr<Teuchos::ParameterList> paramList = Teuchos::rcp(new Teuchos::ParameterList);
Teuchos::ParameterList& locaParamsList = paramList->sublist("LOCA");
Teuchos::ParameterList& locaStepperList = locaParamsList.sublist("Stepper");
locaStepperList.set("Continuation Method", "Arc Length");           // Default
locaStepperList.set("Bordered Solver Method", "Householder");      // Householder QR method
locaStepperList.set("Include UV In Preconditioner", true);         // Include U*V in preconditioner for P = J+U*V
locaStepperList.set("Use P For Preconditioner", true);              // true for RowMatrix-based preconditioners,
                                                                    // false for CrsMatrix precs (Ifpack_CrsRiluk)

// Create Epetra factory
Teuchos::RefCountPtr<LOCA::Abstract::Factory> epetraFactory = Teuchos::rcp(new LOCA::Epetra::Factory);

// Create global data object
Teuchos::RefCountPtr<LOCA::GlobalData> globalData = LOCA::createGlobalData(paramList, epetraFactory);

// Create the stepper
LOCA::Stepper stepper(globalData, grp, combo, paramList);
```

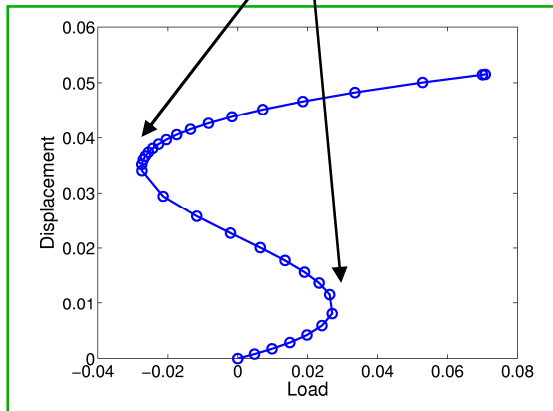


# Turning Point Identification

## Moore-Spence Formulation

### Turning Point Bifurcation

$$\begin{aligned} f(x, p) &= 0 \\ Jv &= 0 \\ \phi^T v &= 1 \end{aligned}$$



### Full Newton Algorithm

$$\begin{bmatrix} J & 0 & f_p \\ (Jv)_x & J & (Jv)_p \\ 0 & \phi^T & 0 \end{bmatrix} \begin{bmatrix} \Delta x \\ \Delta v \\ \Delta p \end{bmatrix} = - \begin{bmatrix} f \\ Jv \\ \phi^T v - 1 \end{bmatrix}$$

### Bordering Algorithm

$$\begin{aligned} Ja &= -f \\ Jb &= -f_p \\ Jc &= -(Jv)_x a - Jv \\ Jd &= -(Jv)_x b - (Jv)_p \end{aligned} \quad \begin{aligned} \Delta p &= \frac{1 - \phi^T v - \phi^T c}{\phi^T d} \\ \Delta x &= a + \Delta p b \\ \Delta v &= c + \Delta p d \end{aligned}$$

... but 4 solves of J per Newton iteration are used to drive J singular!



# Minimally Augmented Turning Point Algorithm

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- Widely used algorithm for small systems:

$$\begin{bmatrix} J & a \\ b^T & 0 \end{bmatrix} \begin{bmatrix} v \\ s \end{bmatrix} = \begin{bmatrix} 0 \\ 1 \end{bmatrix}, \quad \begin{bmatrix} J^T & b \\ a^T & 0 \end{bmatrix} \begin{bmatrix} u \\ t \end{bmatrix} = \begin{bmatrix} 0 \\ 1 \end{bmatrix}$$
$$\implies s = t = -u^T J v$$

- J is singular if and only if  $s = 0$

- Turning point formulation:

$$f(x, p) = 0$$

$$s(x, p) = 0$$

- Newton's method:

$$\begin{bmatrix} J & f_p \\ s_x & s_p \end{bmatrix} \begin{bmatrix} \Delta x \\ \Delta p \end{bmatrix} = - \begin{bmatrix} f \\ s \end{bmatrix},$$
$$s_x = -(u^T J v)_x = -(u^T J)_x v.$$

- 3 linear solves per Newton iteration
  - 4 for bordering
  - Symmetric problems reduces to 2 solves.



# Calling the Householder Bordered Solver Method in LOCA

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```
// Create parameter list
Teuchos::RefCountPtr<Teuchos::ParameterList> paramList = Teuchos::rcp(new Teuchos::ParameterList);
Teuchos::ParameterList& locaParamsList = paramList->sublist("LOCA");
Teuchos::ParameterList& locaStepperList = locaParamsList.sublist("Stepper");
locaStepperList.set("Continuation Method", "Arc Length");
locaStepperList.set("Bordered Solver Method", "Nested");

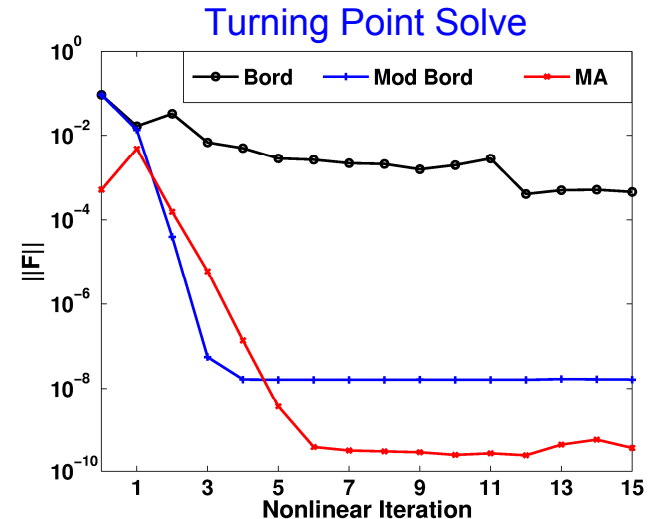
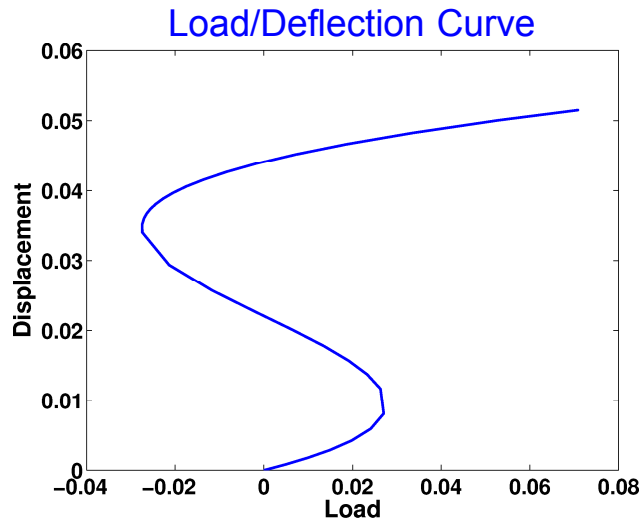
Teuchos::ParameterList& nestedList = locaStepperList.sublist("Nested Bordered Solver");
nestedList.set("Bordered Solver Method", "Householder");
nestedList.set("Include UV In Preconditioner", true);
nestedList.set("Use P For Preconditioner", true);

// Create bifurcation sublist
Teuchos::ParameterList& bifurcationList = locaParamsList.sublist("Bifurcation");
bifurcationList.set("Type", "Turning Point");
bifurcationList.set("Bifurcation Parameter", "Right BC");
bifurcationList.set("Formulation", "Minimally Augmented");
bifurcationList.set("Symmetric Jacobian", false);
bifurcationList.set("Update Null Vectors Every Continuation Step", true);
bifurcationList.set("Transpose Solver Method", "Explicit Transpose");
//bifurcationList.set("Transpose Solver Method", "Transpose Preconditioner");
//bifurcationList.set("Transpose Solver Method", "Left Preconditioning");
bifurcationList.set("Initial Null Vector Computation", "Solve df/dp");

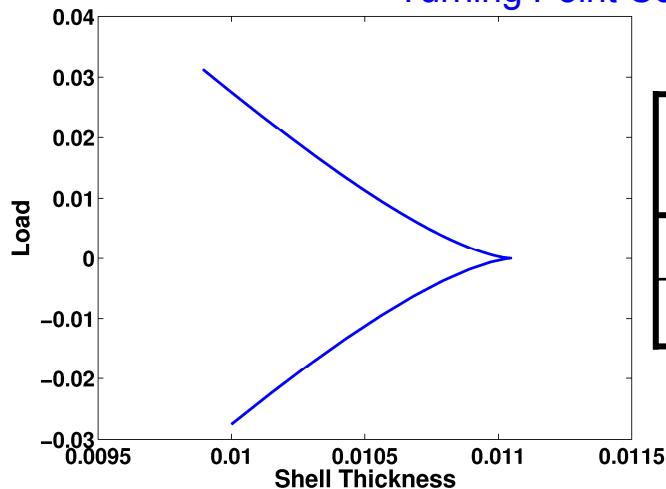
bifurcationList.set("Bordered Solver Method", "Householder");
bifurcationList.set("Include UV In Preconditioner", true);
bifurcationList.set("Use P For Preconditioner", true);
```

# Snap-through Buckling of a Symmetric Cap

## (Salinas/FEI, 200K unknowns, 16 procs)



Turning Point Continuation



| Method         | Total Time (hrs) |
|----------------|------------------|
| Mod. Bordering | 4.2              |
| Min. Augmented | 1.2              |

- Provides robust buckling info almost 4 times faster than previous best method
- Increases scalability
- Clear how to extend this to other bifurcations



# Summary

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- QR approach provides a convenient way to solve bordered systems
  - Nonsingular
  - Only involves one linear solve
  - Only requires simple vector operations
  - Doesn't change dimension of the linear system
  - Become a workhorse tool in LOCA
- Highly encouraged by minimally augmented turning point formulation
  - No singular matrix solves
  - Improves robustness, scalability and accuracy
  - Requires linear algebra-specific implementation
- Future work
  - Minimally augmented pitchfork, Hopf bifurcations
  - Preconditioners for  $J + UV^T$ .



# Points of Contact

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- LOCA: Trilinos continuation and bifurcation package
  - Sub-package of NOX
  - Andy Salinger ([agsalin@sandia.gov](mailto:agsalin@sandia.gov))
  - Eric Phipps ([etphipp@sandia.gov](mailto:etphipp@sandia.gov))
  - [www.software.sandia.gov/nox](http://www.software.sandia.gov/nox)
- NOX: Trilinos nonlinear solver package
  - Roger Pawlowski ([rppawlo@sandia.gov](mailto:rppawlo@sandia.gov))
  - Tammy Kolda ([tgkolda@sandia.gov](mailto:tgkolda@sandia.gov))
  - [www.software.sandia.gov/nox](http://www.software.sandia.gov/nox)