

# **Inverse Heat Conduction Problem: Filter Solution With Given Boundary Temperature History**

**JAMES V. BECK\* AND  
ROBERT McMASTERS\*\***

**\*MICHIGAN STATE UNIVERSITY**

**\*\*VIRGINIA MILITARY INSTITUTE**

**BECK ENGINEERING CONSULTANTS CO.**

# ADVANTAGES OF FILTER APPROACH

- **“EXPERT” INVERSE ASPECTS SEPARATED FROM THE APPLICATIONS ASPECTS**
- **RELATIVELY SIMPLE IMPLEMENTATION IN MANUFACTURING SETTING - CONTINUOUS**
- **GOOD FOR REPETITIVE USES**
- **POTENTIAL FOR INSTRUMENTS**
- **INTRINSIC VERIFICATION ASPECTS**

# LITERATURE REVIEW

**1981 DIEGO MURIO PUBLISHED PAPERS GIVING 4 KINDS OF INVERSE KERNELS**

**1985 BECK, BLACKWELL & ST. CLAIR BOOK ON IHCP**

**NEITHER GAVE REAL-TIME POTENTIAL OR APPLICATION TO MILDLY VARYING THERMAL PROPERTIES**

**2005 BECK DISCUSSED FILTER METHOD FOR QUENCHING OF SPHERES.  $T$ -DEPENDENT THERMAL PROPERTIES. SINGLE TEMPERATURE MEASUREMENT AT CENTER POINT (WHICH IS “INSULATED”)**

**NOW EXTEND TO  $T$  HISTORY GIVEN AT “KNOWN” SURFACE**

# OUTLINE

- **WHAT IS THE INVERSE HEAT CONDUCTION PROBLEM (IHCP)?  
PROBLEM WITH GIVEN  $T(t)$  AT  $x = L$**
- **SENSITIVITY COEFFICIENTS**
- **INVERSE SOLUTION USING WHOLE DOMAIN  
TIKHONOV REGULARIZATION, HAT FUNCTIONS**
- **FILTER CONCEPTS WITH GIVEN  $T(t)$  AT  $x = L$**
- **EXAMPLE**
- **CONCLUSIONS**

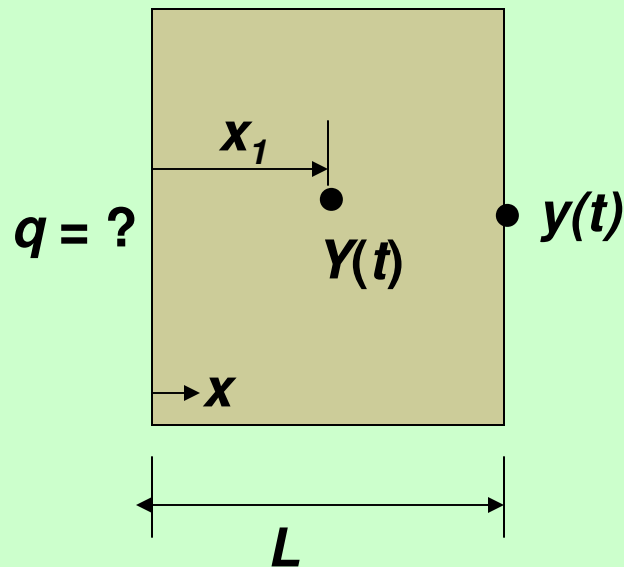
# WHAT IS THE INVERSE HEAT CONDUCTION PROB.?

$$\alpha \frac{\partial^2 T}{\partial x^2} = \frac{\partial T}{\partial t}, \quad 0 < x < L, \quad \alpha = \text{thermal diffusivity} = \text{constant}$$

$$-k \frac{\partial T}{\partial x}(0, t) = q(t) = ?, \quad T(L, t) = y(t)$$

$$T(x, 0) = T_0 = 0, \quad k = \text{thermal conductivity} = \text{constant}$$

$$T(x_1, t) = Y(t), \quad \text{given measured temp. at } x_1 = L/2$$



**X21B?-T0**

**Slide 5**

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**JVB1**

James Beck, 7/8/2006

**TEMPERATURE AT  $x_1$  SUM OF  $q$  AT  $x = 0$  AND  
TEMPERATURE HISTORY AT  $x = L$ .**

**CAN BE DESCRIBED BY GREEN'S FUNCTIONS,**

$$T(x_1, t) = \frac{\alpha}{k} \int_{\tau=0}^t q(\tau) G_{X21}(x_1, 0, t-\tau) d\tau + \alpha \int_{\tau=0}^t y(\tau) \left( -\frac{\partial G_{X21}}{\partial x'}(x_1, L, t-\tau) \right) d\tau$$

**$T(x_1, t)$  = "MEASURED" TEMP., ALSO DENOTED  $Y(t)$**

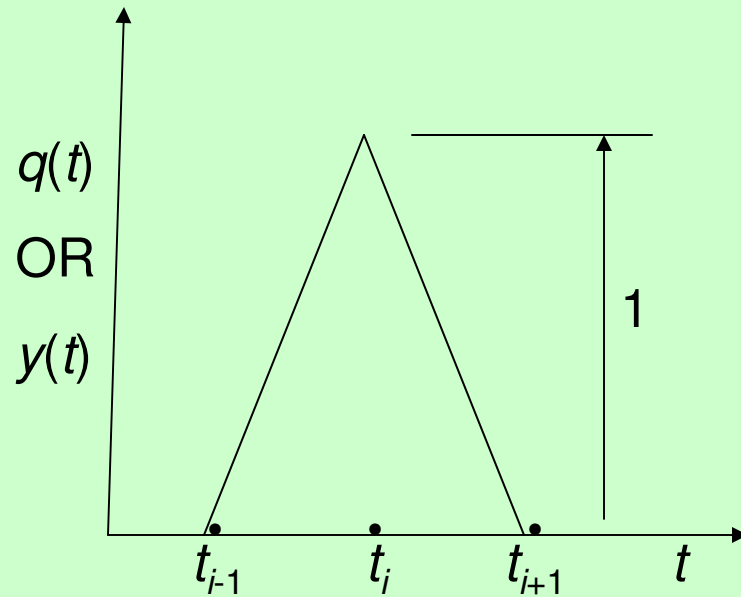
**$q(t)$  = UNKNOWN HEAT FLUX TO BE ESTIMATED**

**$G(\cdot)$  = GREEN'S FUNCTION**

**$y(t)$  = GIVEN TEMPERATURE HISTORY AT  $x = L$**

**WE APPROXIMATE USING "HAT" FUNCTIONS.**

# HAT BASIS FUNCTION FOR $q(t)$ OR $y(t)$



$$t_i = i\Delta t$$



**FOR LINEARLY INCREASING  $q$  AT  $x = 0$ ,**

$$\eta_i = \frac{L}{k} \frac{L^2}{\alpha \Delta t} \left\{ \left( 1 - \frac{x_1}{L} \right) \frac{\alpha i \Delta t}{L^2} - \frac{1}{6} \left[ \left( \frac{x_1}{L} \right)^3 - 3 \left( \frac{x_1}{L} \right)^2 + 2 \right] + 2 \sum_{m=1}^{\infty} e^{-\beta_m^2 \frac{\alpha i \Delta t}{L^2}} \frac{\cos \left( \beta_m \frac{x_1}{L} \right)}{\beta_m^4} \right\}$$

$$\beta_m = (m-1/2)\pi, \quad \text{FOR } x_1 = L/2,$$

$$\eta_i = \frac{L}{k} \frac{L^2}{\alpha \Delta t} \left\{ \frac{1}{2} \frac{\alpha i \Delta t}{L^2} - \frac{11}{48} + 2 \sum_{m=1}^{\infty} e^{-\beta_m^2 \frac{\alpha i \Delta t}{L^2}} \frac{\cos \left( \frac{\beta_m}{2} \right)}{\beta_m^4} \right\}$$

**INTRINSIC VERIFICATION POTENTIAL FOR  $\alpha i \Delta t / L < 0.003$**

# HAT FUNCTIONS (CONTINUED)

**LINEARLY INCREASING  $q$  BOUNDARY CONDITION:**

$$-k \frac{\partial \eta}{\partial x}(0, t_i) = \frac{t_i}{\Delta t} = i, \quad \eta \text{ units: K/(W/m}^2\text{)}$$

**LET:**  $\eta_1 = T(L/2, \Delta t)|_{q_1=1}$ ,  $\eta_2 = T(L/2, 2\Delta t)|_{q_1=1, q_2=2}$ ,  $\eta_i = T(L/2, i\Delta t)|_{q_1=1, q_2=2, \dots, q_i=i}$

**THEN FOR  
“HAT” BASIS  
FUNCTION**

$$T_{q,M} = \sum_{i=1}^M q_i \delta^2 \eta_{M-i} = \sum_{i=1}^M q_i X_{M-i+1}$$

$$\delta^2 \eta_M = \eta_{M-1} - 2\eta_M + \eta_{M+1} = X_{M+1}$$

$$\partial T_{q,M} / \partial q_i = X_{M-i+1} = \text{SENS. COEF.}$$

**SIMILARLY FOR THE  $x = L$  BOUNDARY CONDITION**

$$\theta(L, t_i) = \frac{t_i}{\Delta t} = i, \quad \theta \text{ is dimensionless}$$

## HAT FUNCTIONS (CONTINUED)

LET:  $\theta_1 = T(L/2, \Delta t)|_{T_1=1}$ ,  $\theta_2 = T(L/2, 2\Delta t)|_{T_1=1, T_2=2}$ ,  $\theta_i = T(L/2, i\Delta t)|_{T_1=1, T_2=2, \dots, T_i=i}$

THEN FOR  
“HAT” BASIS  
FUNCTION

$$T_{T,M} = \sum_{i=1}^M y_i \delta^2 \theta_{M-i} = \sum_{i=1}^M y_i Z_{M-i+1}$$

$$\delta^2 \theta_M = \theta_{M-1} - 2\theta_M + \theta_{M+1} = Z_{M+1}$$

THEN FOR BOTH CONTRIBUTIONS ( $q$  AT  $x = 0$ ,  $T$  AT  $x = L$ )

$$T_M = \sum_{i=1}^M q_i X_{M-i+1} + \sum_{i=1}^M y_i Z_{M-i+1}$$

# MATRIX FORM OF TEMP., LINEAR ANALYSIS

$\mathbf{T} = \mathbf{X}\mathbf{q} + \mathbf{Z}\mathbf{y}$  WHERE THE INITIAL TEMPERATURE = 0

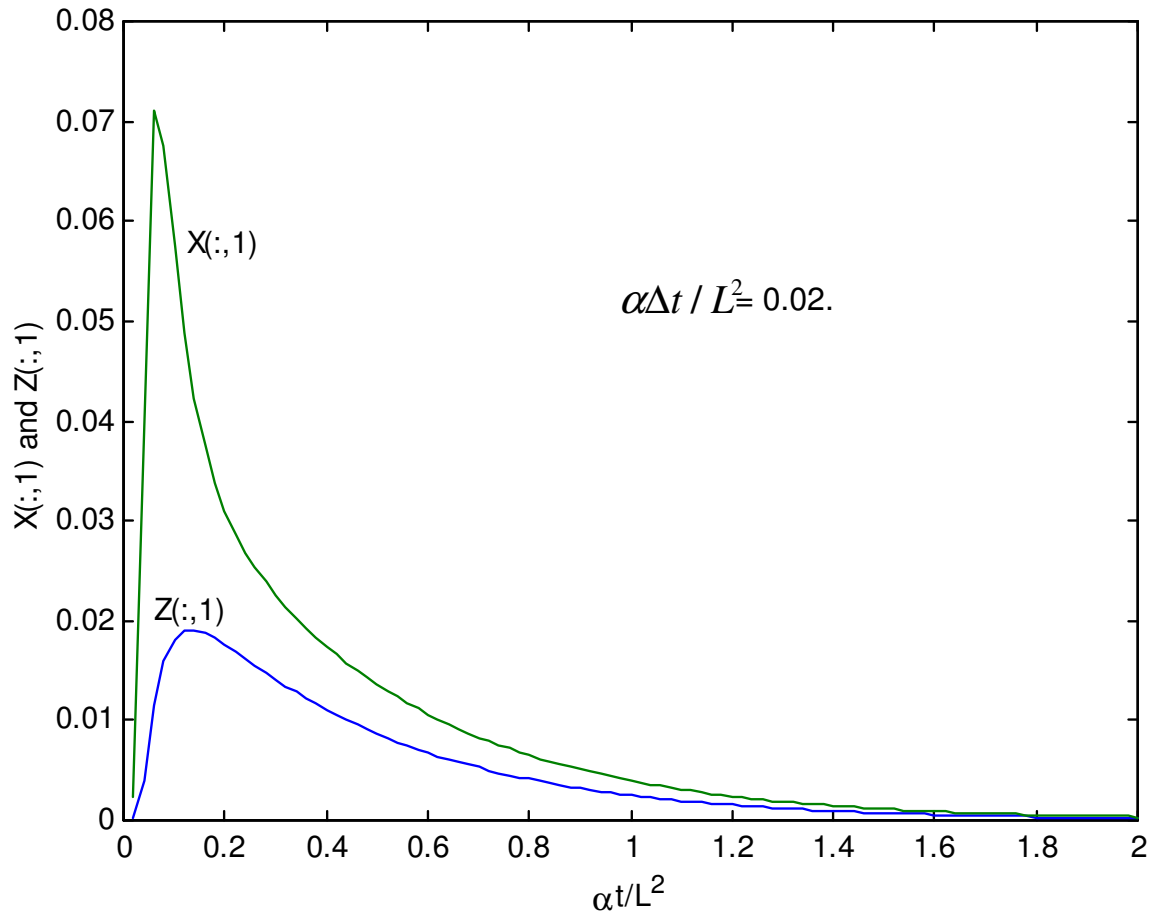
$$\mathbf{T} = \begin{bmatrix} T_1 \\ T_2 \\ \vdots \\ T_N \end{bmatrix}, \quad \mathbf{q} = \begin{bmatrix} q_1 \\ q_2 \\ \vdots \\ q_N \end{bmatrix}, \quad \mathbf{X} = \begin{bmatrix} X_1 & \mathbf{0} & \mathbf{0} & \cdots & \mathbf{0} & \mathbf{0} \\ X_2 & X_1 & \mathbf{0} & \cdots & \mathbf{0} & \mathbf{0} \\ X_3 & X_2 & X_1 & \cdots & \mathbf{0} & \mathbf{0} \\ \vdots & \vdots & \vdots & \vdots & \vdots & \vdots \\ X_N & X_{N-1} & X_{N-2} & \cdots & X_2 & X_1 \end{bmatrix}$$

Hat basis function:  $X_i = \delta^2 \eta_{i-1}$

**SIMILAR MATRICES FOR Z AND y.**

$\mathbf{T} = \mathbf{X}\mathbf{q}$

# SENSITIVITY COEFFICIENTS, HAT BASIS FUNCTION



$X(:,1)$  for hat  $q$  at  $x = 0$  and  $Z(:,1)$  for hat  $T$  at  $x = L$ .  $x = L/2$ .

# 1<sup>ST</sup> ORDER TIKHONOV REGULARIZATION

**SUM OF SQUARES (WHOLE TIME DOMAIN)**

$$\begin{aligned} S &= (\mathbf{Y} - \mathbf{T})^T (\mathbf{Y} - \mathbf{T}) + \alpha_T \mathbf{q}^T \mathbf{H}^T \mathbf{H} \mathbf{X} \mathbf{q} \\ &= (\mathbf{Y} - \mathbf{X} \mathbf{q} - \mathbf{Z} \mathbf{y})^T (\mathbf{Y} - \mathbf{X} \mathbf{q} - \mathbf{Z} \mathbf{y}) + \alpha_T \mathbf{q}^T \mathbf{H}^T \mathbf{H} \mathbf{q} \end{aligned}$$

**$\alpha_T$  IS TIKHONOV REGULARIZATION PARAMETER, H HAS -1 ON MAIN DIAGONAL AND 1 ON DIAGONAL JUST ABOVE.**

**MINIMIZING SUM OF SQUARES GIVES**

$$\hat{\mathbf{q}} = [\mathbf{X}^T \mathbf{X} + \alpha_T \mathbf{H}^T \mathbf{H}]^{-1} (\mathbf{X}^T \mathbf{Y} - \mathbf{Z}^T \mathbf{y})$$

**NOTICE: ESTIMATES LINEAR FUNCTIONS OF Y & y. SUGGESTS USE OF FILTER COEFFICIENTS**

# FILTER COEFFICIENTS - DERIVATION

## TRANSIENT HEAT CONDUCTION USING CONVOLUTION INTEGRALS & FUTURE INFO.

$$\hat{q}_M = \sum_{j=1}^{m_p+m_f} \left( f_j Y_{m_f+M-j} + g_j y_{m_f+M-j} \right)$$

$\hat{q}_M$  is heat flux at time  $t_M$

$f_j$  and  $g_i$  are filter coefficients

$m_p$  is for the past time steps

$m_f$  is for the future time steps

**THE EQUATION IS THE BASIC ONE FOR FILTER ALGORITHM.  
FOR GIVEN PROBLEM,  $f_j$  AND  $g_j$  FOUND ONCE FOR ALL**

## HOW ARE $f_j$ AND $g_j$ FOUND?

$$\begin{aligned}\hat{q}_M &= \sum_{j=1}^{m_p+m_f} f_j Y_{m_f+M-j} + \sum_{j=1}^{m_p+m_f} g_j y_{m_f+M-j} \\ &= f_1 Y_{m_f+M-1} + f_2 Y_{m_f+M-2} + \cdots + f_{m_p+m_f} Y_{M-m_p} + g_1 y_{m_f+M-1} + \cdots + g_{m_p+m_f} y_{M-m_p}\end{aligned}$$

**LET**  $Y_j = y_j = 0$  for all  $j$  except  $Y_{m_f} = 1$

**USE LINEAR IHCP ALGORITHM (Funct. Spec., TIKHONOV REG.,...) TO GET ALL  $q_i$  ESTIMATES**

**SET  $M = 1$ :**  $\hat{q}_1 = f_1 Y_{m_f} + 0 = f_1 \cdot 1 = f_1, f_1 = \hat{q}_1$

**SET  $M = 2$ :**  $\hat{q}_2 = f_2 Y_{m_f} + 0 = f_2 \cdot 1 = f_2, f_2 = \hat{q}_2$

**SET  $j = M$ :**  $\hat{q}_M = \sum_{j=1}^{m_p+m_f} f_j Y_{m_f+M-j} = f_M Y_{m_f} = f_M, f_M = \hat{q}_M$



## FILTER COEFFICIENTS (CONTINUED)

**LET**  $Y_j = y_j = 0$  for all  $j$  except  $y_{m_f} = 1$

**SET**  $M = 1$ :  $\hat{q}_1 = g_1 y_{m_f} + 0 = g_1 \cdot 1 = g_1$ ,  $g_1 = \hat{q}_1$

**SET**  $M = 2$ :  $\hat{q}_2 = g_2 y_{m_f} + 0 = g_2 \cdot 1 = g_2$ ,  $g_2 = \hat{q}_2$

**SET**  $j = M$ :  $\hat{q}_M = \sum_{j=1}^{m_p+m_f} g_j y_{m_f+M-j} = g_M y_{m_f} = g_M$ ,  $g_M = \hat{q}_M$

**UNITS:  $T = Xq + Zy$**

$T$  in K or C,  $y$  in same units, K or C.  $q$  in W/m<sup>2</sup>,  
 $X$  in K/(W/m<sup>2</sup>),  $Z$  is dimensionless.  
 $f$  and  $g$  have same units of W/m<sup>2</sup>-K.

**EXAMPLE: PLATE  $0 < x < L$  ,  $T(L,t) = y(t)$ ,  
 $T(L/2,t) = Y(t)$**

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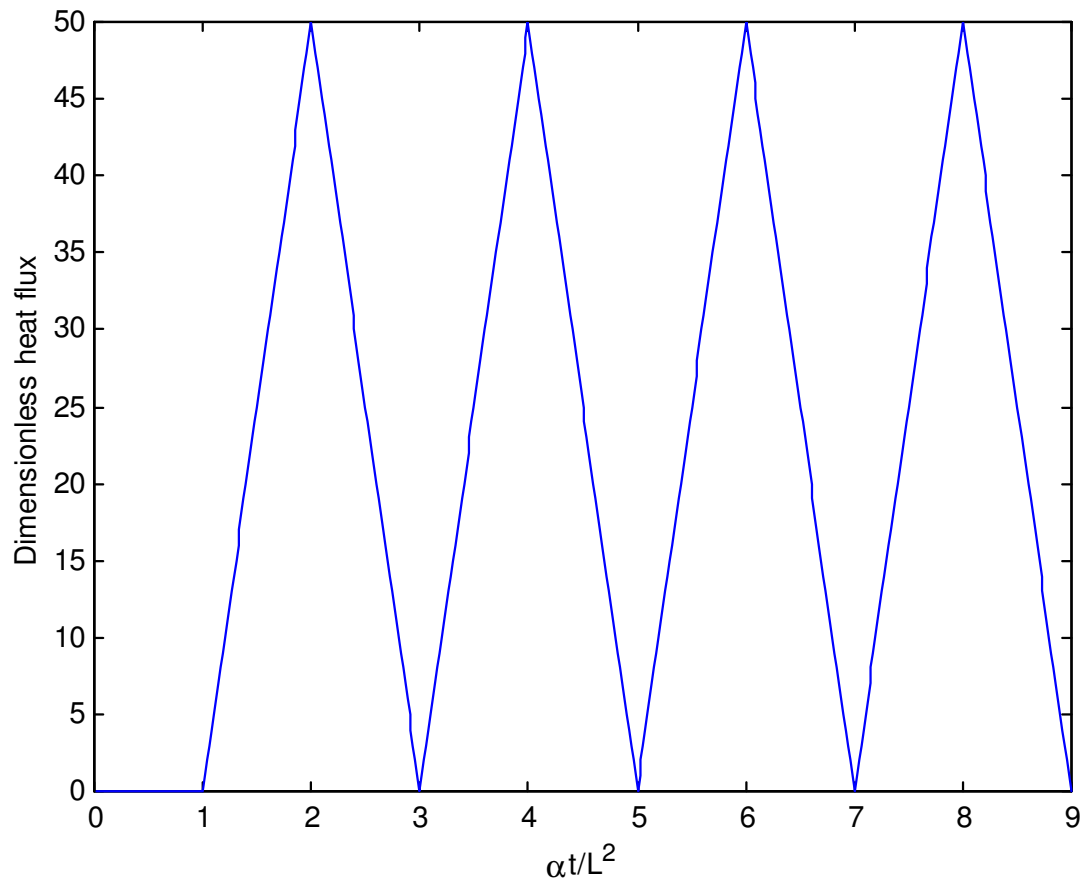
**DIMENSIONLESS CASE:  $L = 1$  m,  $k = 1$  W/m-K,  
 $\alpha = 1$  m<sup>2</sup>/s**

**WE CONSIDER A HEAT FLUX FORMED BY A  
SERIES OF HAT (TRIANGLES) FUNCTIONS,  
EACH  $\alpha t / L^2 = 2$  LONG.**

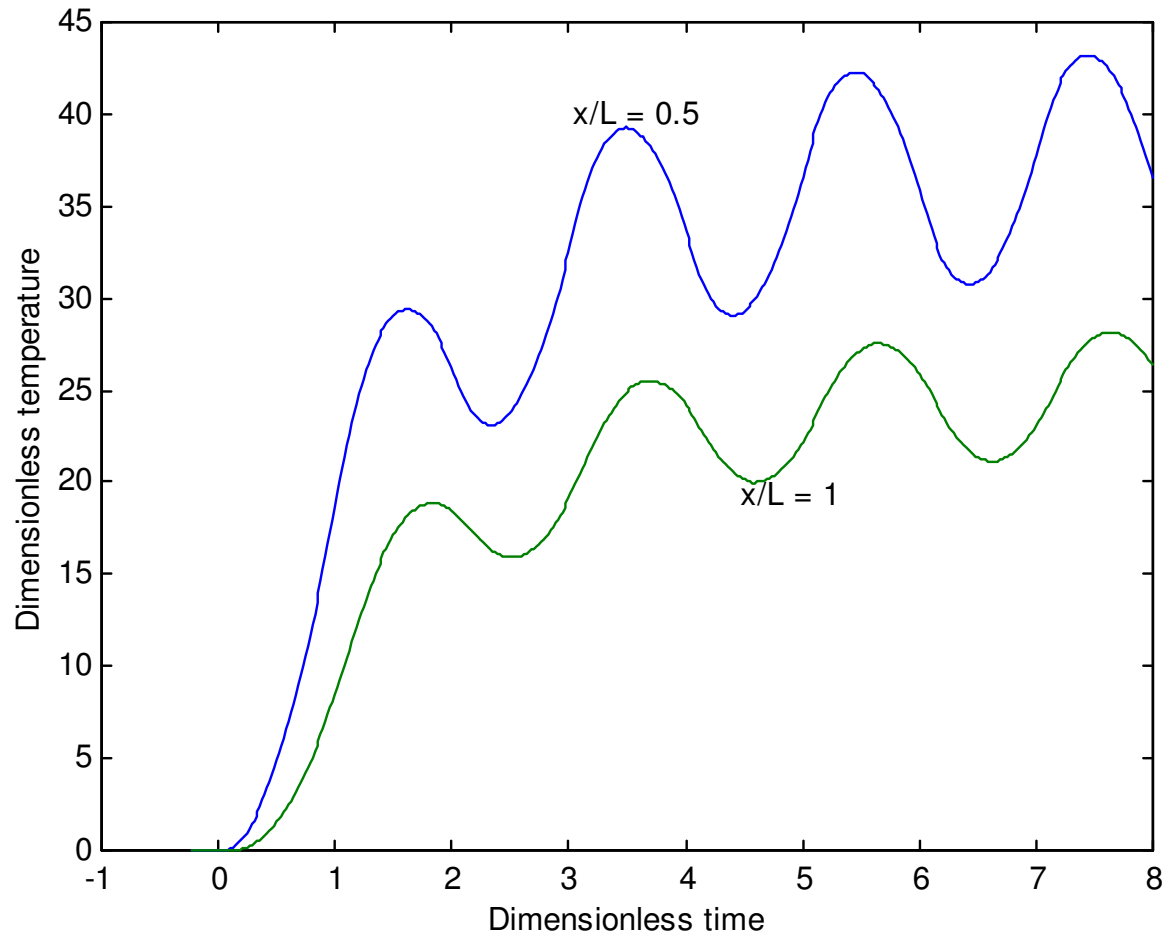
**CALCULATE THE TEMPERATURE HISTORY USING  
EXACT SOLUTION FOR LENGTH =  $2L$ .**

**SIMULATED TIME STEPS,  $\alpha \Delta t / L^2 = 0.02$**

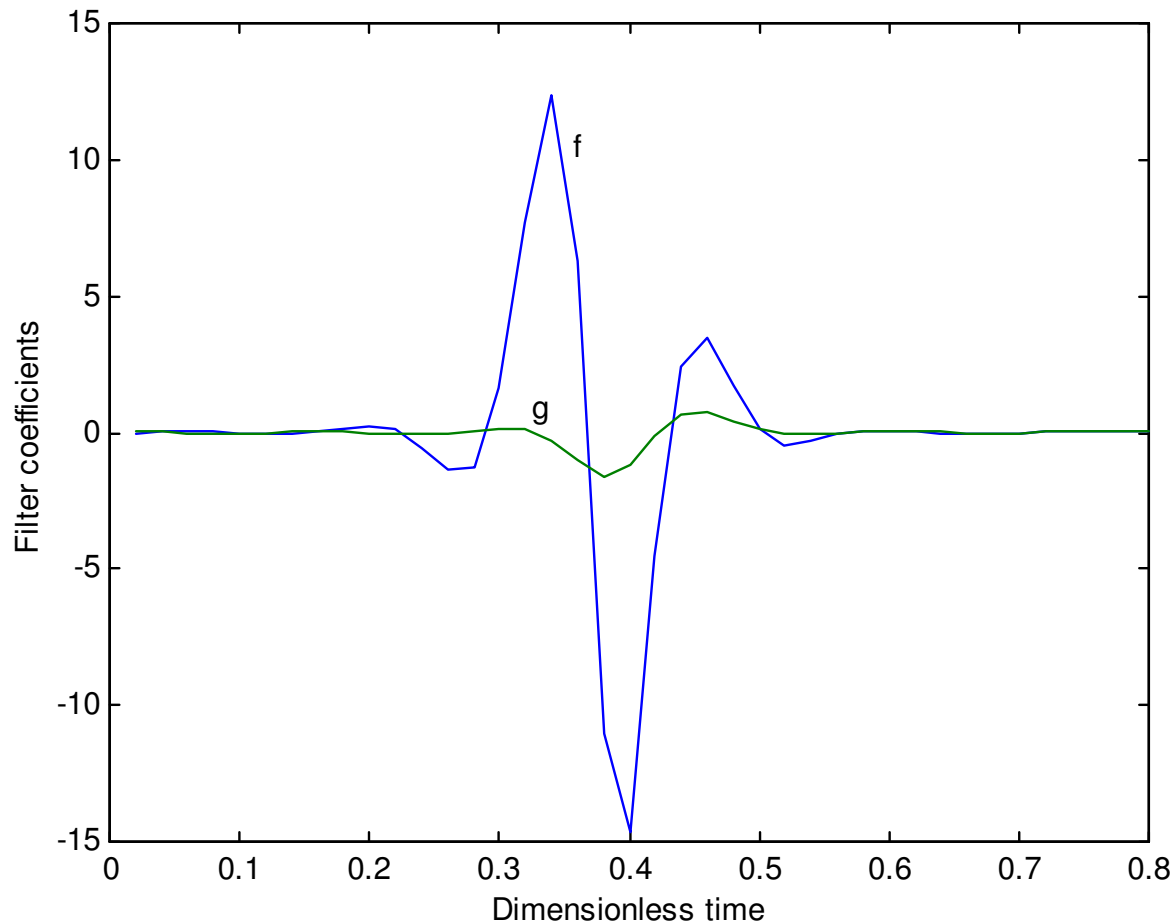
# HEAT FLUX HISTORY FOR EXAMPLE



# TEMPERATURE HISTORIES IN PLATE

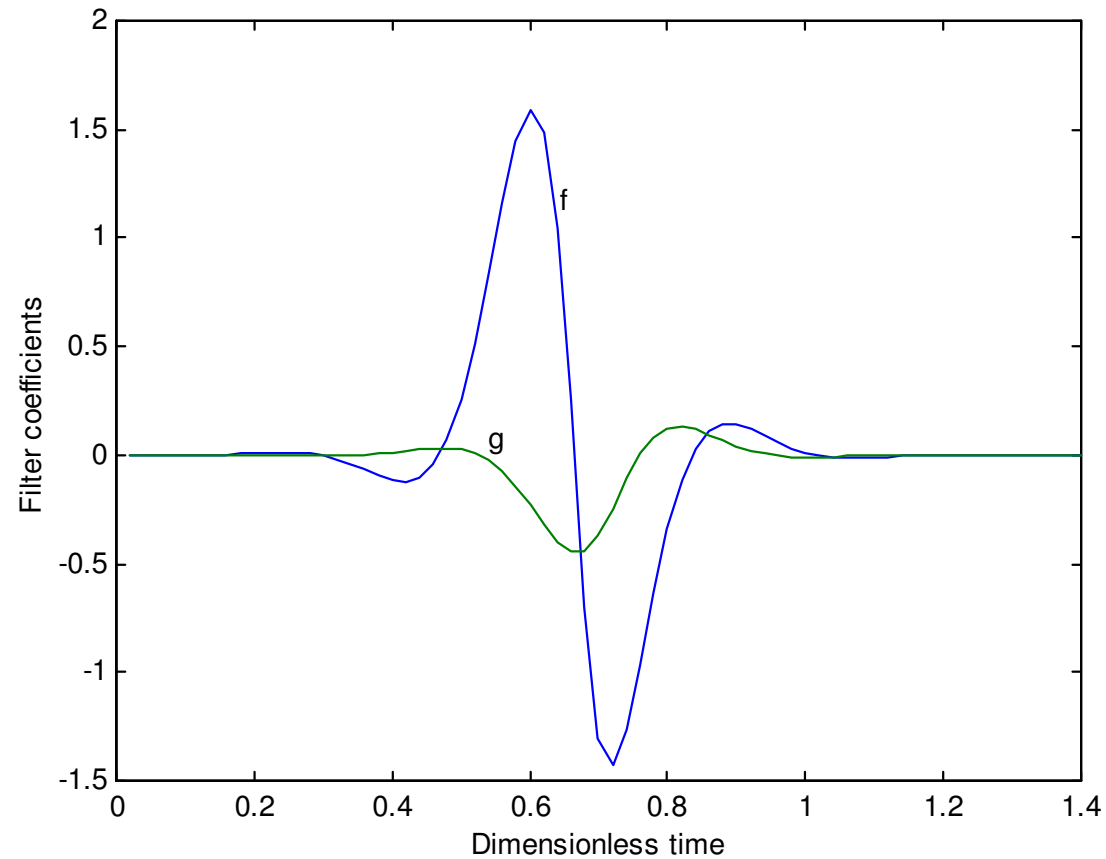


# TIKHONOV IHCP FILTER COEFS., $\alpha_T = 0.0001$



**SUM( $f$ )= 1.9997, SUM( $g$ ) = -1.9999,  $x_1 = L/2 = 1/2$ .**

# TIKHONOV IHCP FILTER COEFS., $\alpha_T = 0.01$



**$SUM(f) = 2.0024$ ,  $SUM(g) = -1.9999$ ,  $x_1 = L/2 = 1/2$ .**

# INTRINSIC VERIFICATION USING SUMS

CAN THE SUM OF THE  $f$  AND  $g$  TERMS BE ANALYTICALLY DETERMINED?

STEADY-STATE PROBLEMS SOLVED WITH FILTER EQUATION.

FOR STEADY-STATE,  $Y_j = Y_{SS}$ ,  $y_j = y_{SS}$

$$\hat{q}_M = \sum_{j=1}^{m_p+m_f} \left( f_j Y_{m_f+M-j} + g_j y_{m_f+M-j} \right) = Y_{SS} \sum_{j=1}^{m_p+m_f} f_j + y_{SS} \sum_{j=1}^{m_p+m_f} g_j$$

ALSO STEADY- STATE HEAT CONDUCTION EQ. GIVES

$$\hat{q}_M = k \frac{Y_{SS} - y_{SS}}{L - x} = Y_{SS} \sum_{j=1}^{m_p+m_f} f_j + y_{SS} \sum_{j=1}^{m_p+m_f} g_j$$
$$Y_{SS} \left[ \frac{k}{L - x} - \sum_{j=1}^{m_p+m_f} f_j \right] - y_{SS} \left[ \frac{k}{L - x} + \sum_{j=1}^{m_p+m_f} g_j \right] = 0$$

## INTRINSIC VERIFICATION (CONTINUED)

SINCE  $Y_{SS}$  &  $y_{ss}$  ARE INDEPENDENT,

$$\sum_{j=1}^{m_p+m_f} f_j = \frac{k}{L-x}, \quad \sum_{j=1}^{m_p+m_f} g_j = -\frac{k}{L-x}$$

NOW  $k = 1$ ,  $L = 1$ ,  $x = 1/2$ , THEN

$$\sum_{j=1}^{m_p+m_f} f_j = 2, \quad \sum_{j=1}^{m_p+m_f} g_j = -2$$

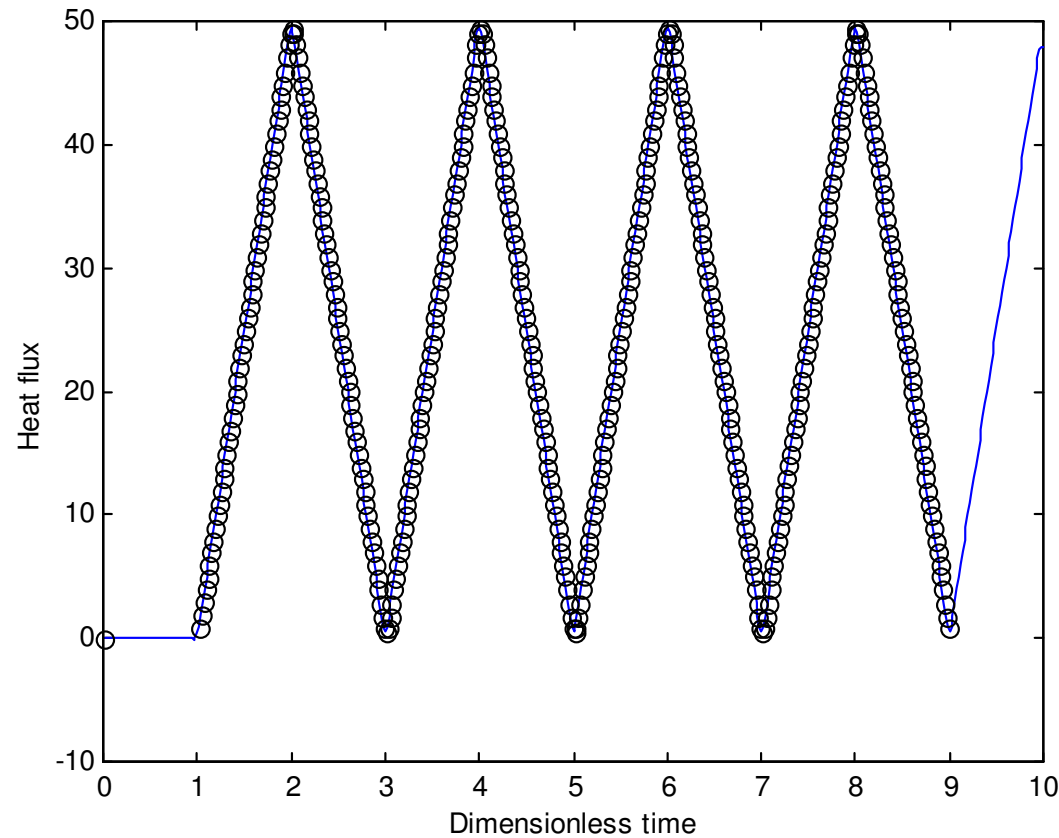
NUMERICALLY EVALUATING THESE SUMS SHOULD GIVE ABOUT THE SAME VALUES.

FOR  $\alpha_T = 0.0001$ , SUM(f) = 1.9997 AND SUM(g) = -1.9999.

HENCE, WE HAVE SHOWN **INTRINSIC VERIFICATION**.

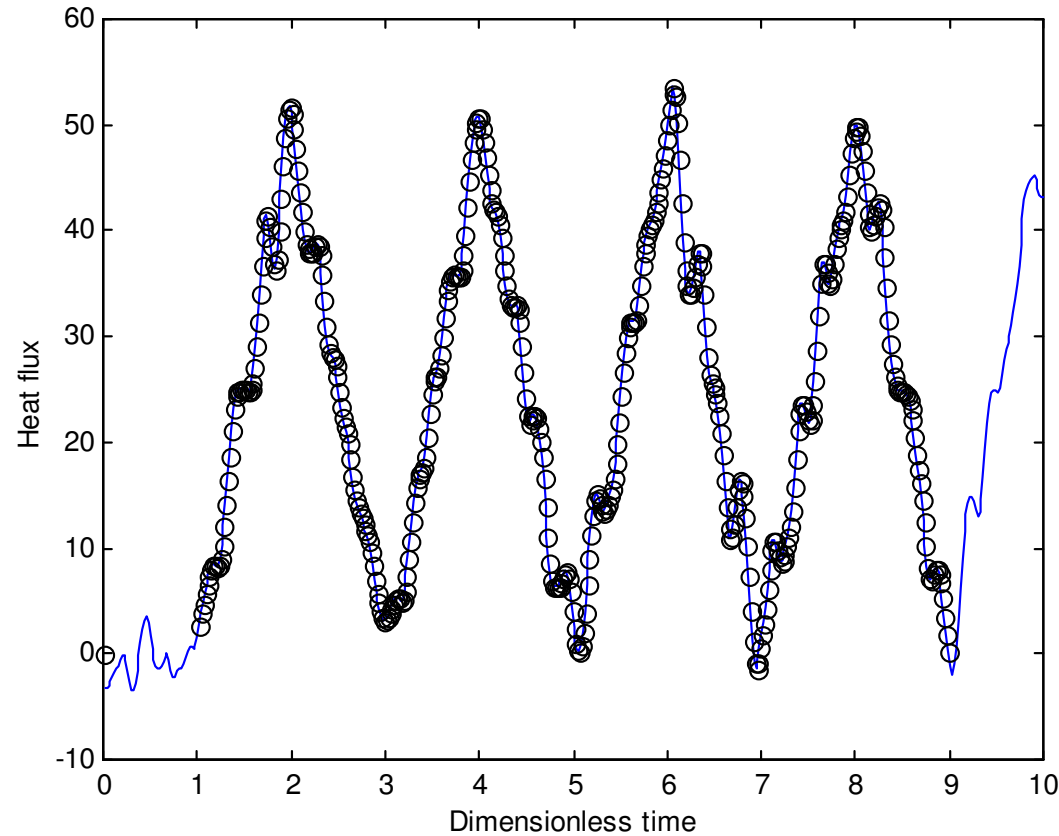


# COMPARISON OF WHOLE-DOMAIN & FILTER ANAL.



**ERRORLESS DATA,  $\alpha_T = 0.0001$ ,  
STD TIK = 0.0856, STD FILTER = 0.0859**

# COMPARISON CONTINUED. DATA WITH ERRORS



**ERRORS WITH STD. STATISTICAL ASSUMPTIONS,  
 $\sigma = 0.5$ ,  $\alpha_T = 0.01$ , STD TIK = STD FILTER = 2.2814**

## **OBSERVATIONS**

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**THE NUMERICAL VALUES ARE ALMOST IDENTICAL FOR THE WHOLE-DOMAIN ANALYSIS AND THE FILTER ANALYSIS.**

**COMPUTATIONALLY THE FILTER ANALYSIS IS MUCH MORE EFFICIENT.**

**APPLYING THE FILTER METHOD WITH KNOWN FILTER COEFFICIENTS IS MUCH EASIER THAN THE WHOLE-DOMAIN METHOD. MANY FEWER DECISIONS.**

**CAN MAKE AN INSTRUMENT TO DO THE FILTERING**

# CONCLUSIONS

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**METHOD FOR TREATING  $T$  BOUNDARY CONDITION**

**INITIAL CONDITION NOT NEEDED**

**WELL-SUITED FOR REPETITIVE TESTS OR  
CONTINUOUS USE**

**MAIN SKILL LEVEL NEEDED IN THE INVERSE  
ALGORITHM. LESS SKILL FOR FILTER SOL.**

**INTRINSIC VERIFICATION POSSIBLE**