



Simulating the Value of El Niño Forecasts for the Panama Canal

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FACTS

- The Panama Canal requires a supply of fresh water for operations.
- Canal fresh water storage has an operational time constant of months.
- El Niño variability strongly modulates rainfall and water supply for the Canal.
- El Niño variability is somewhat predictable at lead times of 9-12 months.
- Canal inflow is modestly predictable at lead times of months.

QUESTION

- Can routine El Niño predictions be used assist in Canal operational planning?





OUTLINE

I) DATA

II) PROJECT DESIGN

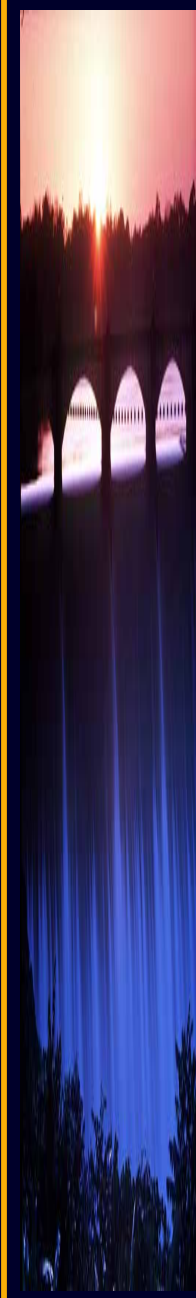
HOW TO EVALUATE THE VALUE OF EL NINO
FORECASTS

III) CLIMATOLOGY AND PREDICTABILITY

CANAL INFLOW CLIMATOLOGY

RELATIONSHIPS BETWEEN EL NINO AND INFLOW

III) RESULTS



DATA

1) CLIMATE

- * NATURAL INFLOW INTO GATUN LAKE (1906-2000)
- * NIÑO3 SST (1906-2000; Smith and Reynolds, 2004)
- * PREDICTED NIÑO3 (NCEP; 1981-97; MONTHLY)

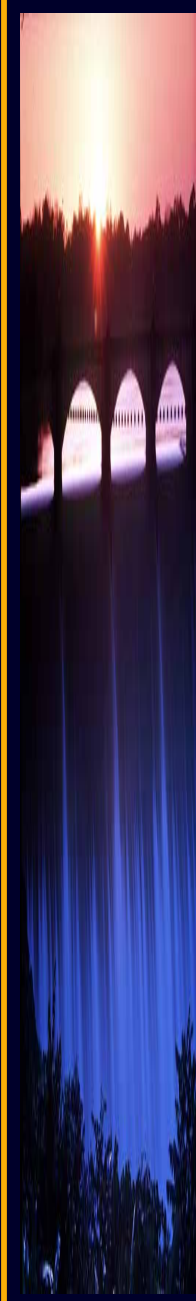
2) CANAL CHARACTERISTICS (PCA)

PROJECT DESIGN AND GOALS (1)

- 1) Build a basic, monthly timestep, model of the Canal system, embodying:
 - a) Management objectives –
 - i) Reliable lockage
 - ii) Additional income through hydro-power generation
 - iii) Low risk
 - b) Physical constraints
 - i) Gatun Lake capacity, vol. / stage, level requirements
 - ii) Lockage, hydropower, spillage discharge capacities
 - iii) Lockage and hydropower income
 - c) Inflow predictability (3 models, each with variable uncertainty)
 - i) **CLIMATE** - Assume every year inflow follows climatology
 - ii) **PERFECT** - Assume future inflows are perfectly known
 - iii) **FORECAST** - Inflow outlooks derived from El Nino forecasts

PROJECT DESIGN AND GOALS (2)

- 1) Build a basic, monthly timestep, model of the Canal system, embodying:
 - a) Management objectives
 - b) Physical constraints
 - c) Inflow predictability (3 models, each with variable uncertainty)
- 2) Operate the model using probabilistic inflow outlooks (i, ii, iii) using an optimizer to simulate management with objective forecast information.
- 3) Evaluate performance of simulated system in terms of added value and operational reliability afforded by El Nino forecast information and formal inclusion of uncertainty.



CLIMATOLOGY AND PREDICTABILITY

- ❖ CANAL INFLOWS HAVE A STRONG ANNUAL CYCLE
- ❖ EL NIÑO VARIABILITY MODULATES CANAL REGION RAINFALL AND INFLOWS.
- ❖ THE STRENGTH OF THE RELATIONSHIP BETWEEN EL NIÑO AND FLOW VARIES FROM STRONG TO VERY WEAK DURING THE YEAR.

GATUN LAKE MONTHLY INFLOW CLIMATOLOGY (1950-99)

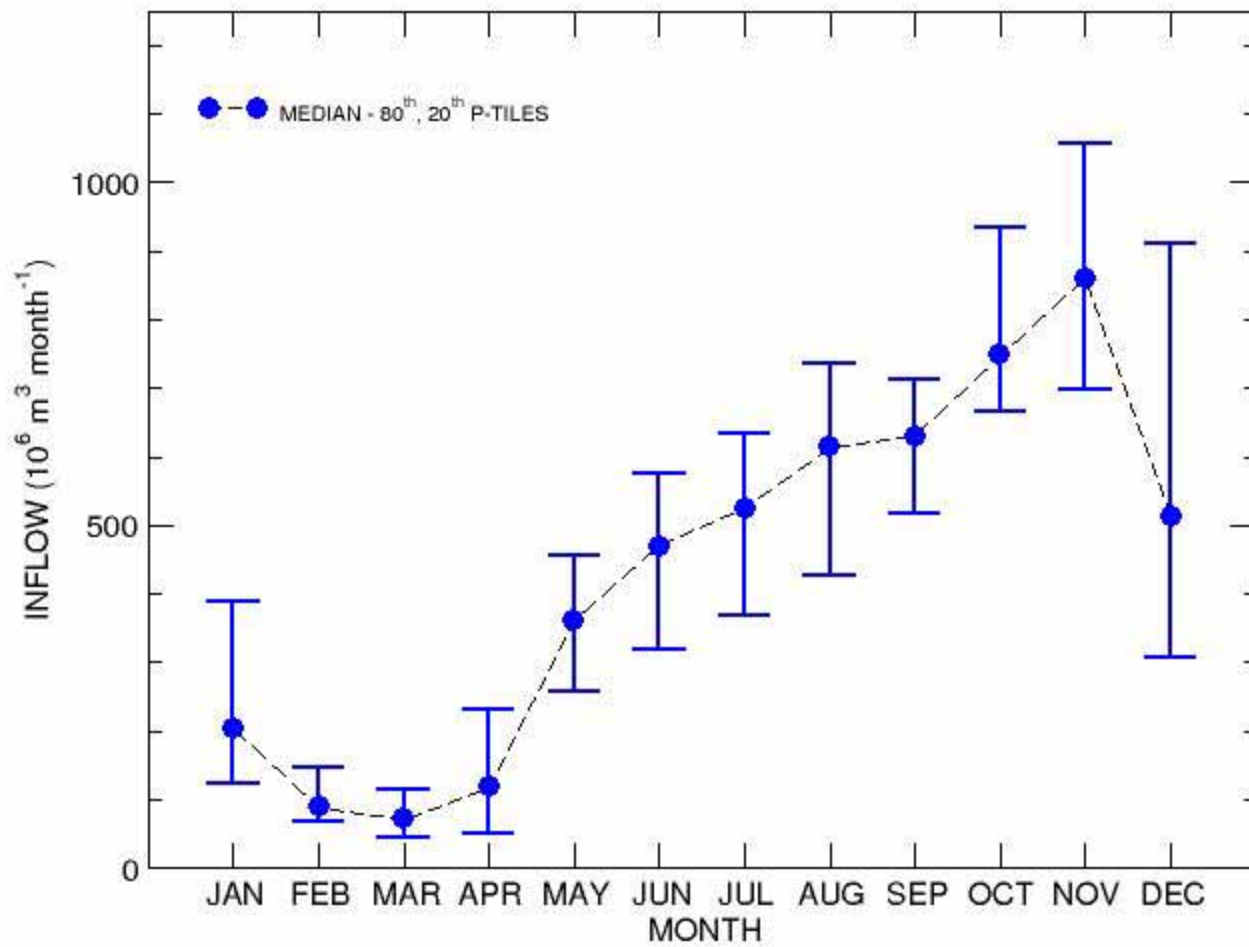


FIG. 2



**CORRELATIONS:
WATER YEAR GATUN INFLOW vs NINO3 SST
1915-1999**

CORRELATIONS: APR-MAR GATUN INFLOW vs NINO3 SST - 1915-99

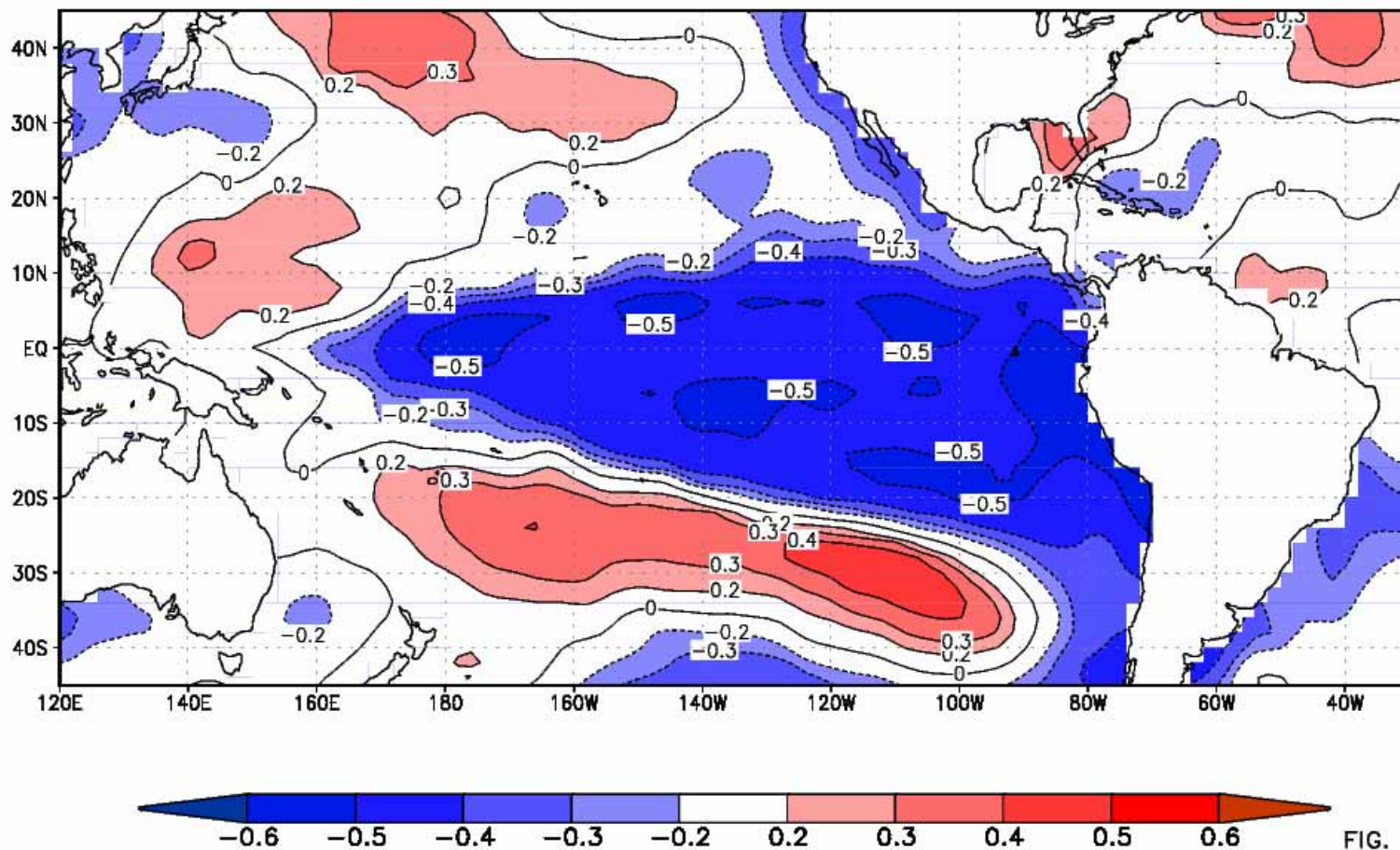


FIG. 3



NINO3 SST vs GATUN LAKE INFLOW: JULY-DECEMBER 1914-98

R=0.56

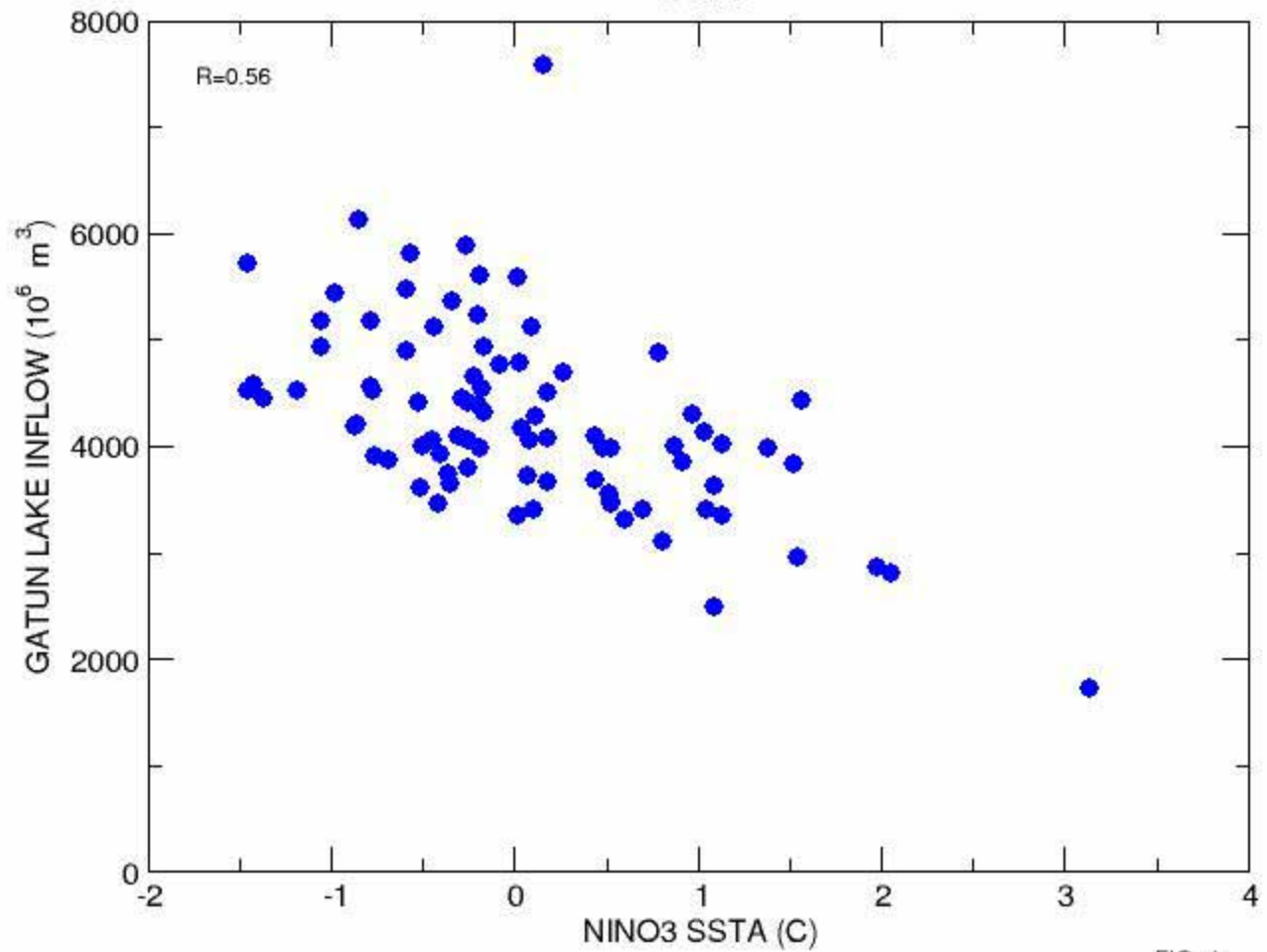
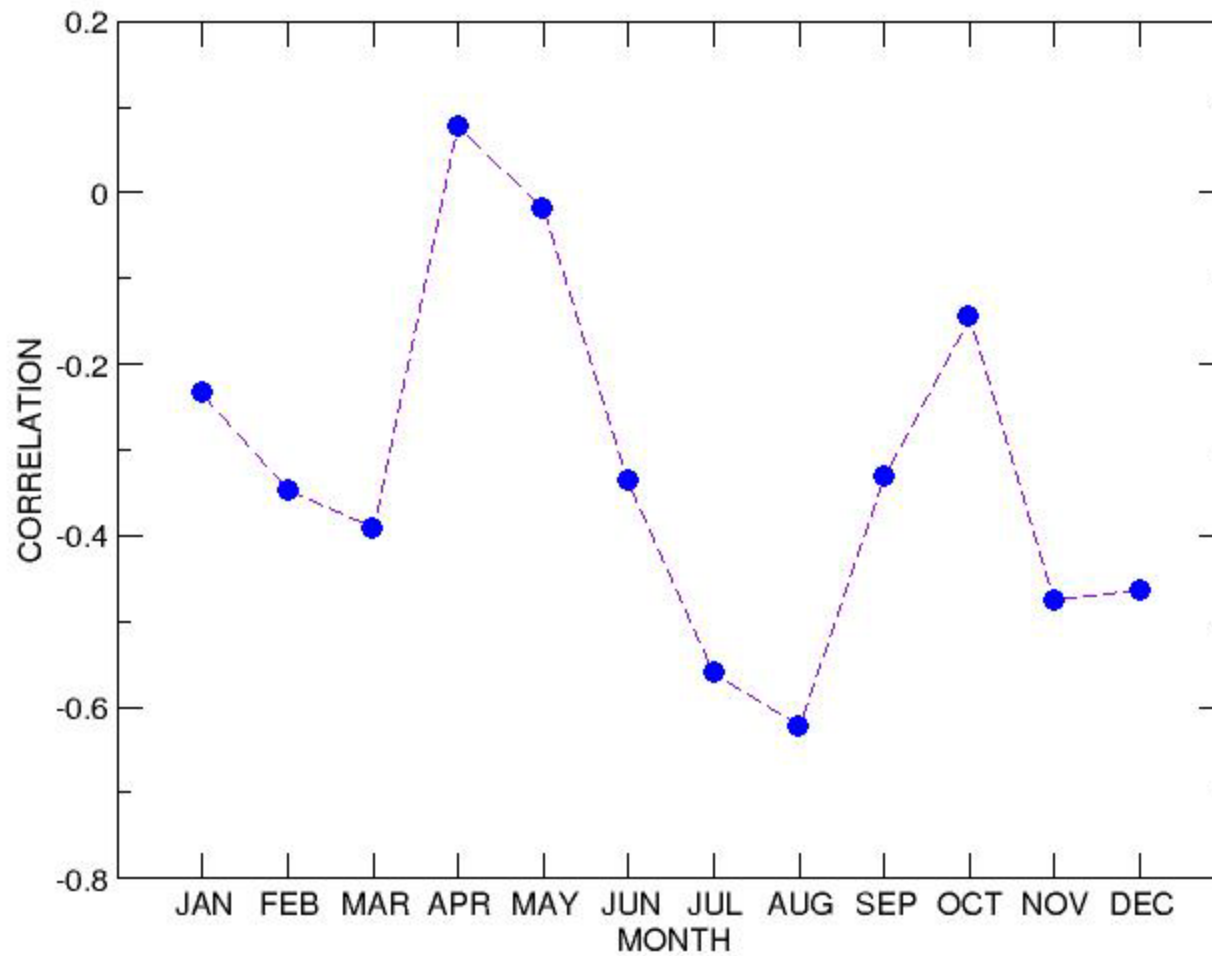
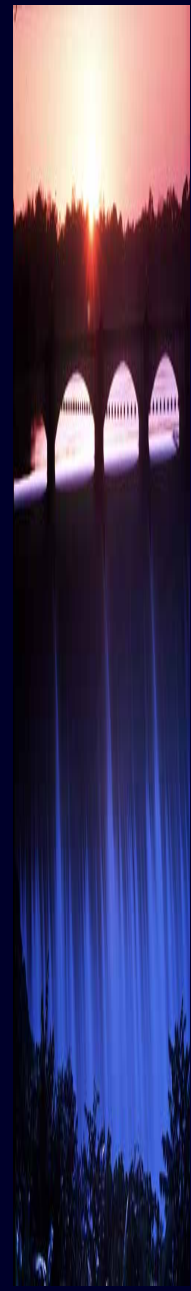


FIG. 4



CORRELATIONS: GATUN LAKE INFLOW WITH NINO3 SST





EL NIÑO VARIABILITY IS PREDICTABLE
OPERATIONAL NINO3 SST PREDICTION CORRELATIONS
1981-1998

FORECAST LEAD TIME (MONTHS)

V E R I F I C A T I O N M O N T H

	1	2	3	4	5	6	7	8	9	10	11
1	98	96	98	95	86	86	73	81	52	54	33
2	98	94	94	92	92	79	83	72	81	63	41
3	96	90	94	94	85	79	76	62	74	83	67
4	92	89	84	81	73	73	54	48	64	71	68
5	96	86	83	81	70	62	34	64	40	47	72
6	96	89	91	76	77	61	49	24	72	19	36
7	97	93	78	80	65	60	60	53	26	52	27
8	97	92	90	77	71	71	41	71	48	19	55
9	97	86	82	85	65	49	75	37	65	32	9
10	98	91	78	80	87	60	58	76	29	63	34
11	99	97	89	85	84	88	56	63	55	34	55
12	99	98	94	86	82	78	85	57	65	47	36





EL NINO PREDICTIONS REDUCE UNCERTAINTY IN INFLOW OUTLOOKS

FRACTIONAL REDUCTIONS IN INFLOW UNCERTAINTY (RMS)
COMPARED WITH CLIMATOLOGY

USING OPERATIONAL NINO3 SST PREDICTIONS
1981-1998

V
E
R
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H

FORECAST LEAD TIME (MONTHS)

	1	2	3	4	5	6
1	92	94	93	93	95	96
2	89	81	85	83	81	91
3	88	90	89	89	90	86
4	100	100	100	97	95	96
5	99	99	99	99	99	99
6	103	97	101	97	103	97
7	83	84	82	86	90	100
8	75	75	70	75	78	76
9	94	96	94	94	96	100
10	99	99	97	97	98	96
11	83	85	83	80	85	78
12	76	78	77	85	88	84





CANAL SIMULATION SYSTEM

- ☼ INITIAL STATE (GATUN LAKE VOLUME)
- ☼ GATUN LAKE CAPACITY – LEVEL / VOLUME RELATIONSHIP
- ☼ LOCKAGE REQUIREMENTS, WATER USE
- ☼ HYDROPOWER REQUIREMENTS, WATER USE
- ☼ SPILL LEVEL, POSSIBLE RANGES
- ☼ EVAPORATION, MUNICIPAL WATER REQUIREMENTS
- ☼ EXISTING RULE CURVE

- ☼ LOCKAGE INCOME
- ☼ HYDROPOWER INCOME

- ☼ PROBABILISTIC INFLOW PROJECTIONS (6 MONTH HORIZON)

- ☼ OPTIMIZER and VIRTUAL MANAGER



PANAMA CANAL SIMULATION SYSTEM

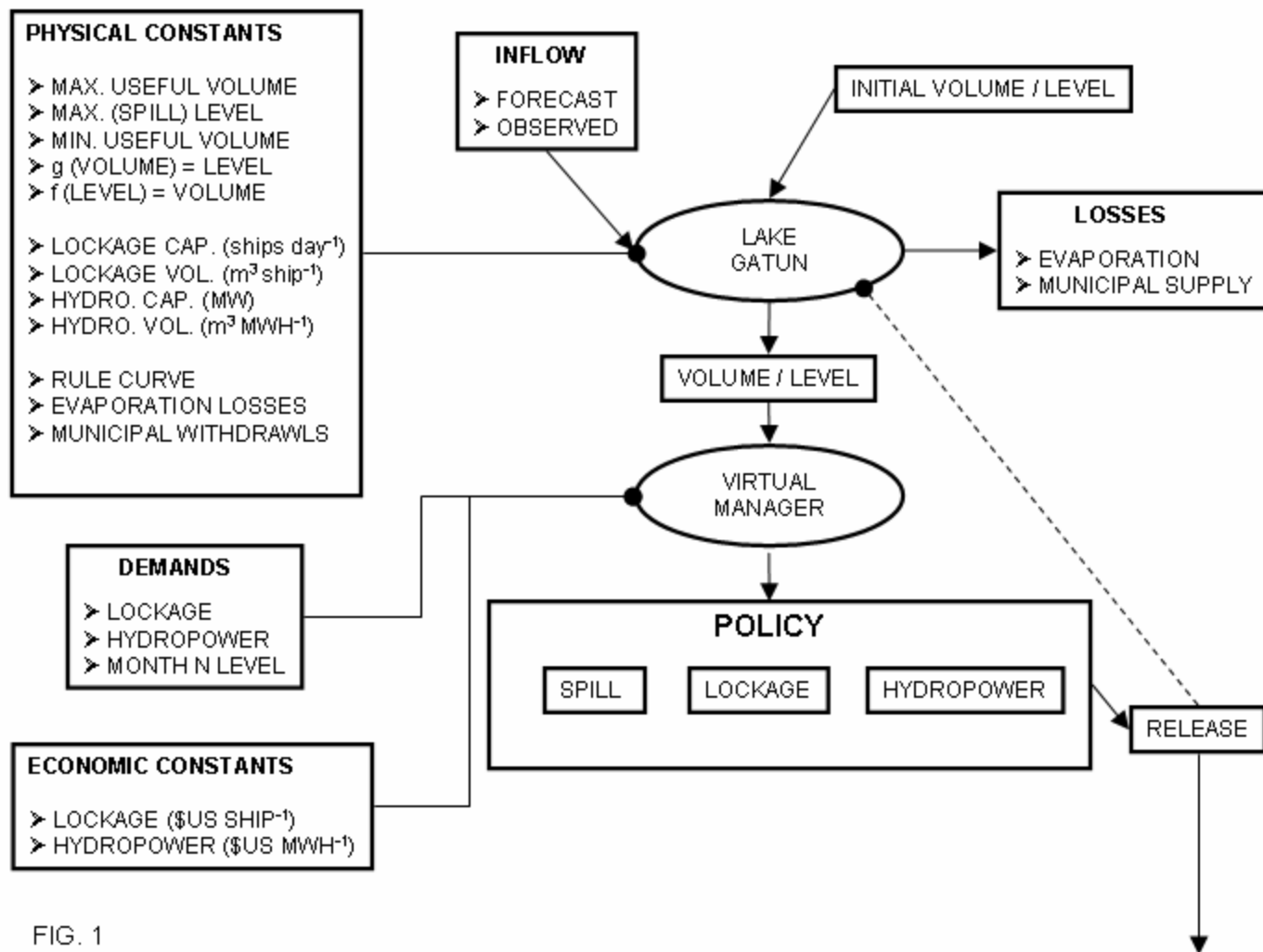
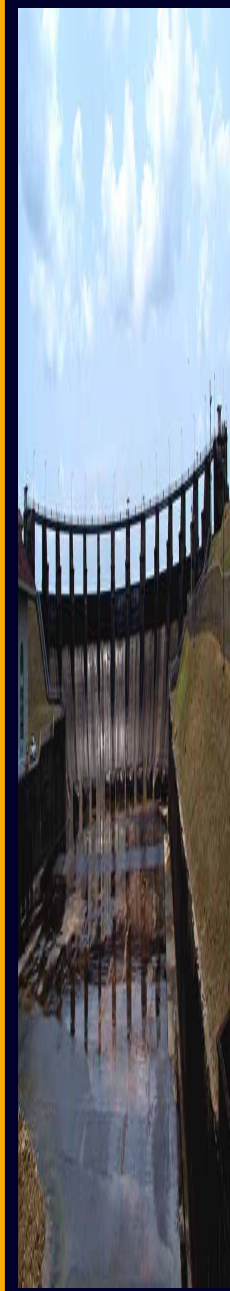


FIG. 1



PARAMETERS FOR SIMULATED PANAMA CANAL SYSTEM

GATUN LAKE PARAMETERS

Useful volume (VU) – 766 Mm³
Lowest useful level (HL) – 24.84 m
Maximum (spill) level (HU) – 26.67 m
Evaporation and Municipal withdrawal (E) 6.16 Mm³ month⁻¹
Maximum spill rate (RUS) – 13358.30 Mm³ month⁻¹
Actual spill rate per month (RS) Mm³
Rule curve level for a particular month (H*m) m
Actual level for a particular month (H*m) m

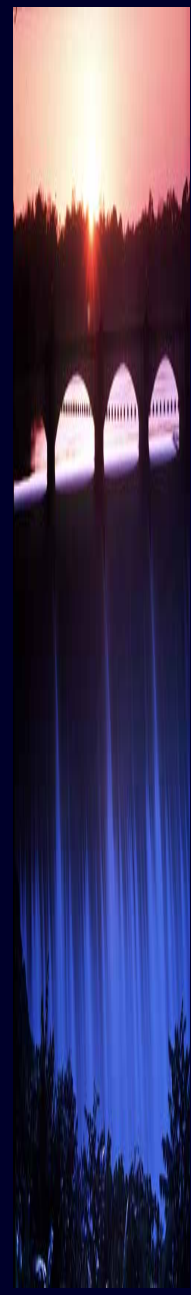
CANAL PARAMETERS

Volume required per unit ship passage (VL) – 196,820 m³ ship⁻¹
Maximum number of ships per month (SU) – 1200 ships month⁻¹
Maximum lockage volume per month (RUL) – 236.18 Mm³ month⁻¹
Actual lockage volume per month (RL)
Volume required per unit MWH hydropower production (VH) – 19,114 m³ MWH⁻¹
Maximum hydropower production per month – 17,280 MWH month⁻¹
Maximum hydropower volume per month (RUH)– 330.29 Mm³ month⁻¹
Actual hydropower volume per month (RH)

INCOME PARAMETERS

Income per ship passage (iL) – \$US 50,000
Maximum lockage income per month (IUL) - \$US 60M
Actual lockage income per month (IL)
Income per MWH (iH) - \$US 50
Maximum hydropower income per month (IUH)- \$US 864,000
Actual hydropower production per month (IH)
Maximum possible total income per month (IMAX) - \$US 60.864M





ASSESSING PERFORMANCE OF CANAL SIMULATIONS

- Start with initial state at time t (Gatun Lake volume)
- Use inflow outlook (probabilistic) for next 6 months
- Derive optimal feasible policy (lockage, hydropower, spill) for next 6 months.
- Execute optimal feasible policy for **ONE** month (to $t+1$)
- Tabulate results with respect to objectives
- Update state (Gatun Lake volume) with OBSERVED inflow
- Repeat



ASSESSING PERFORMANCE OF CANAL SIMULATIONS

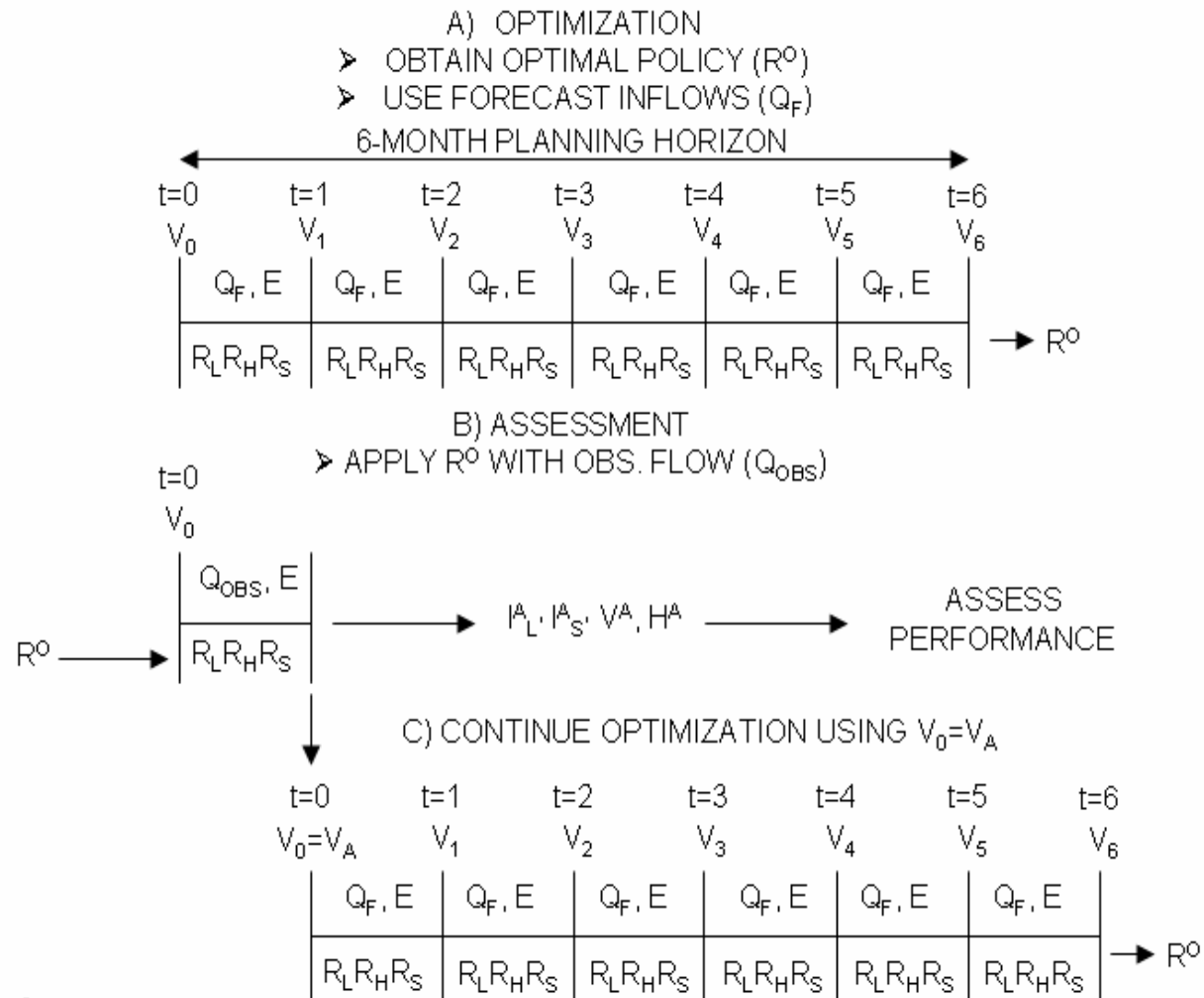
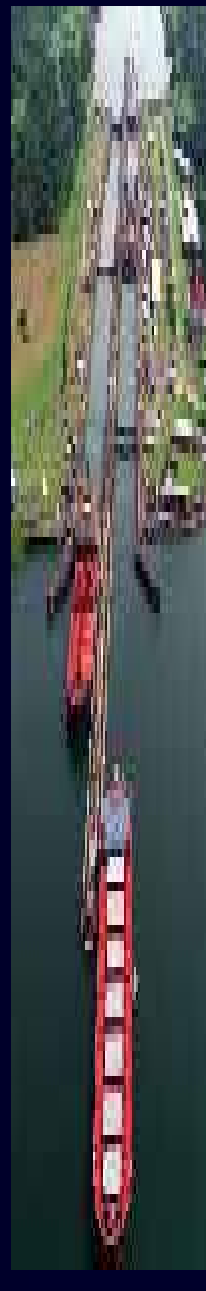


FIG. 6



RESULTS

3 SETS OF SIMULATIONS

1) PERFECT – PERFECT FORESIGHT.

NOMINAL UNCERTAINTY: ~ZERO

2) FORECAST – USE INFLOWS DERIVED FROM EL NIÑO FORECASTS.

NOMINAL UNCERTAINTY: MEAN-SQUARE FORECAST ERROR.

3) CLIMATE – INFLOWS ARE FROM LONG-TERM CLIMATOLOGY.

NOMINAL UNCERTAINTY: MEAN-SQUARE CLIMATOLOGY ERROR

EACH SET OF SIMULATIONS IS ASSIGNED THE NOMINAL UNCERTAINTY,
AND ALSO VALUES RANGING FROM SMALL TO LARGE.

THIS ALLOW US TO SEE THE SENSIVITY TO CHANGES IN:

A) THE SKILL OF THE MEAN PREDICTION

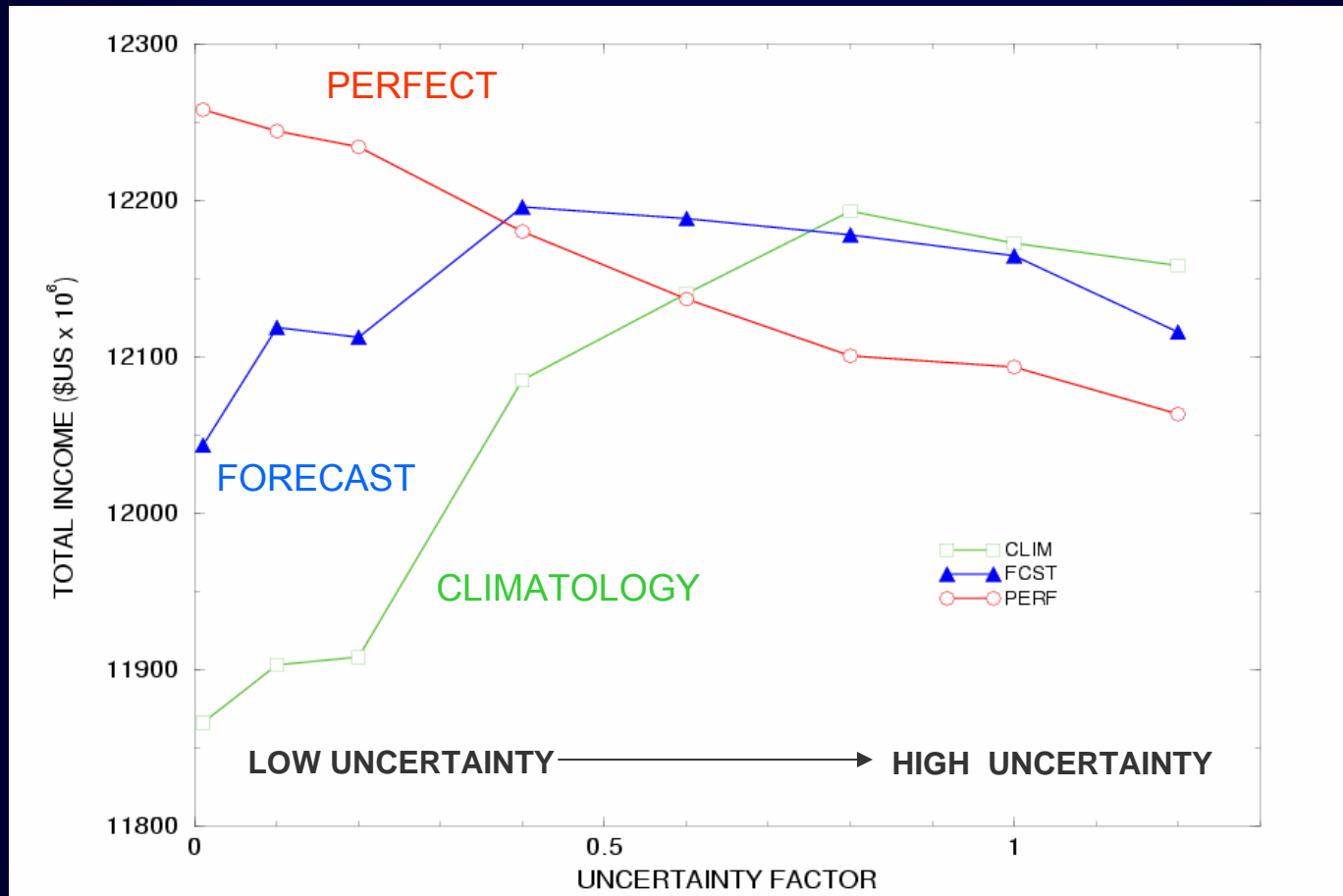
B) THE ASSOCIATED UNCERTAINTY



UNCERTAINTY vs TOTAL CANAL INCOME (1981-1997)

DOES EL NIÑO FORECAST INFORMATION HELP?

NOTICE THE EFFECT ON INCORRECTLY SPECIFIED UNCERTAINTY

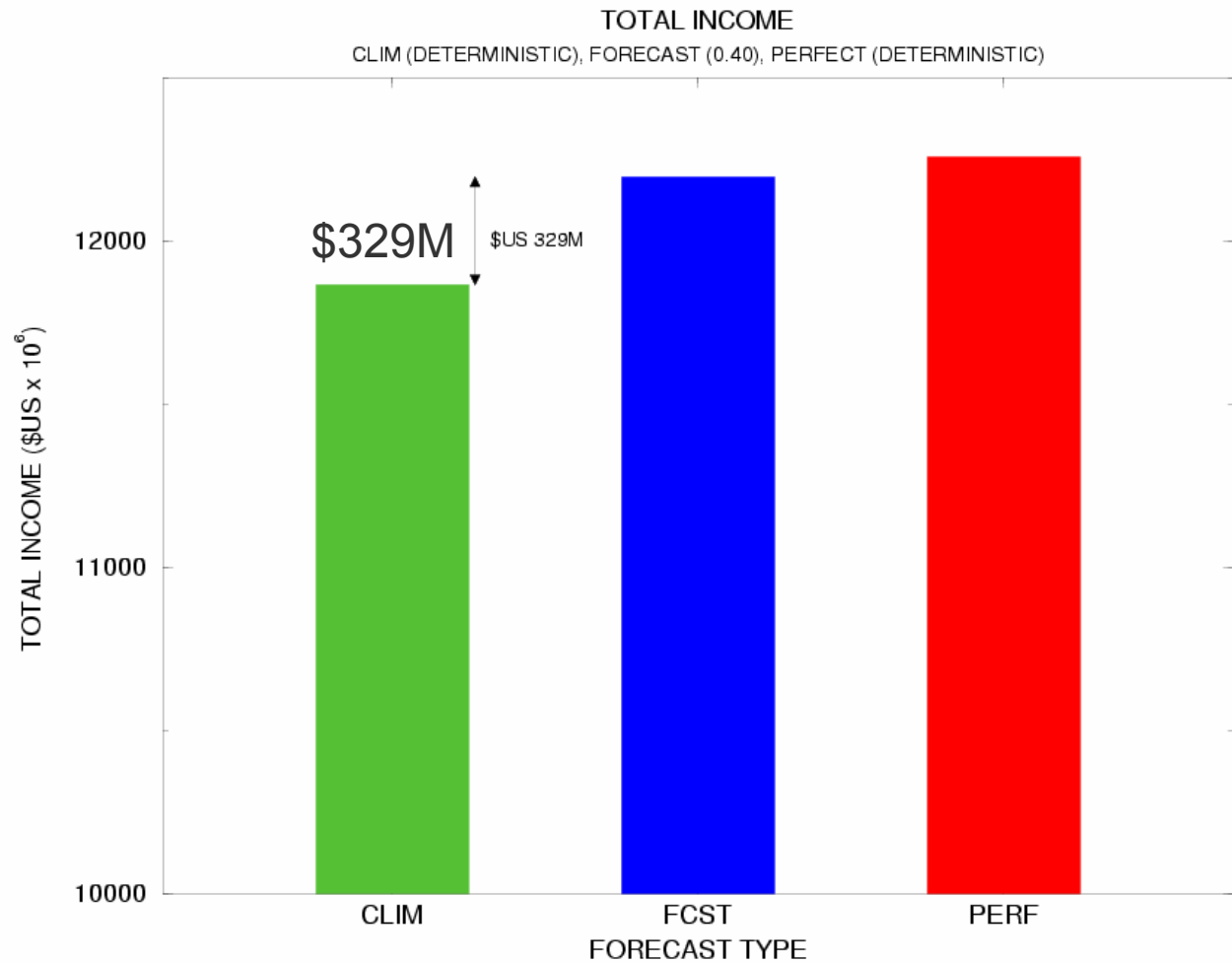


COMPARISON OF TOTAL INCOME (1981-1997)

CLIMATOLOGY - DETERMINISTIC

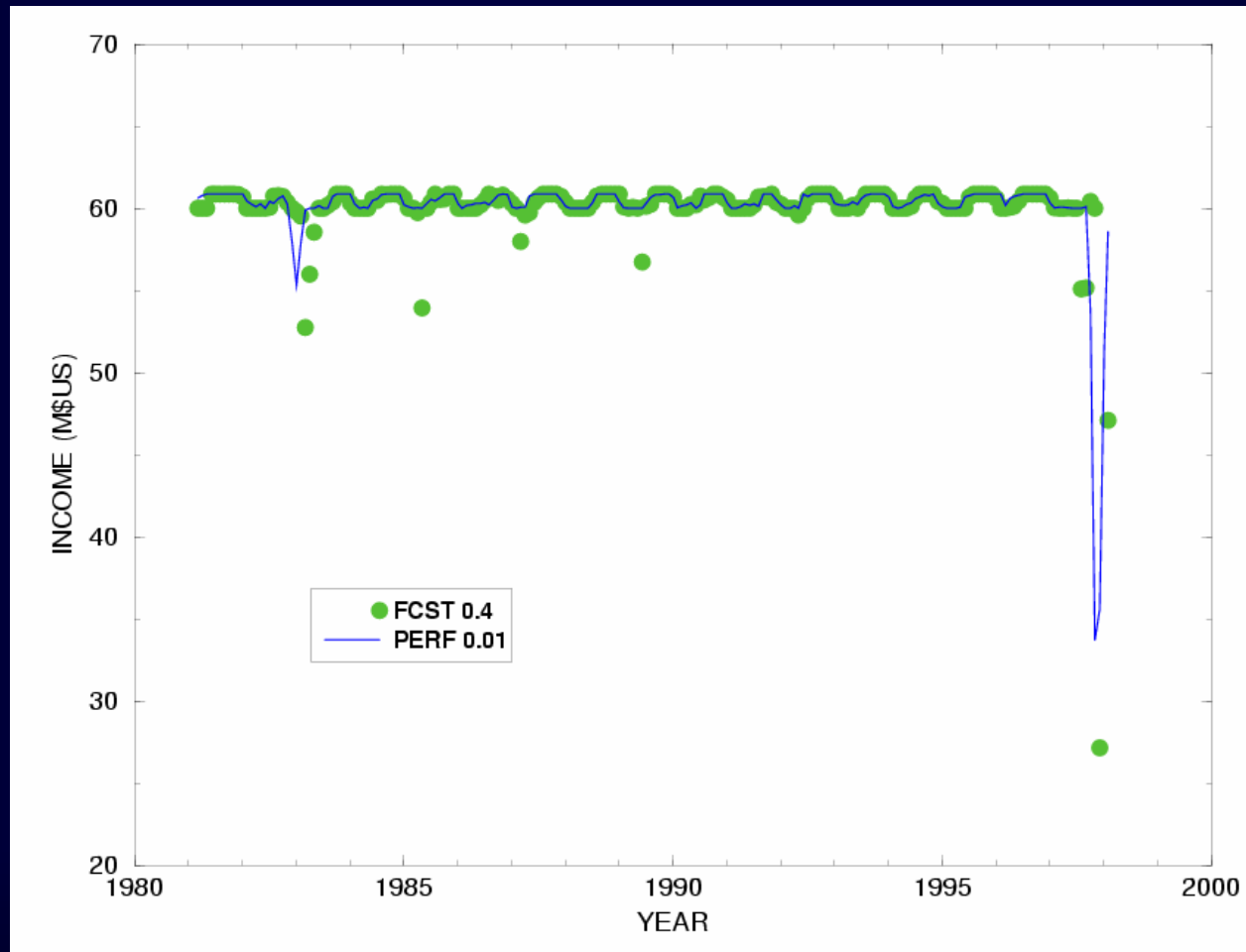
FORECAST - UNCERTAINTY 0.4

PERFECT - DETERMINISTIC

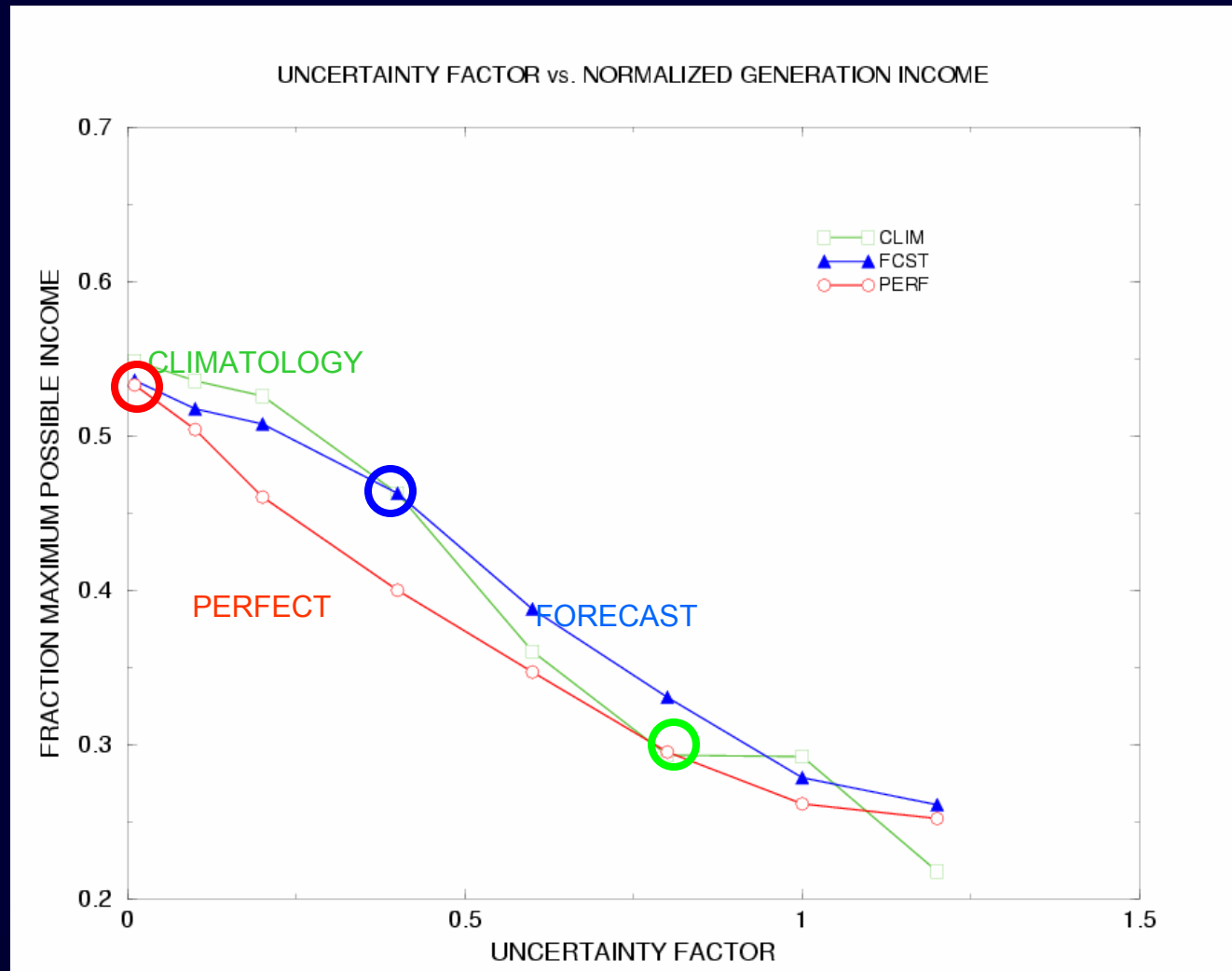


EXAMPLE OF MONTHLY INCOMES: PERFECT AND FORECAST MODELS

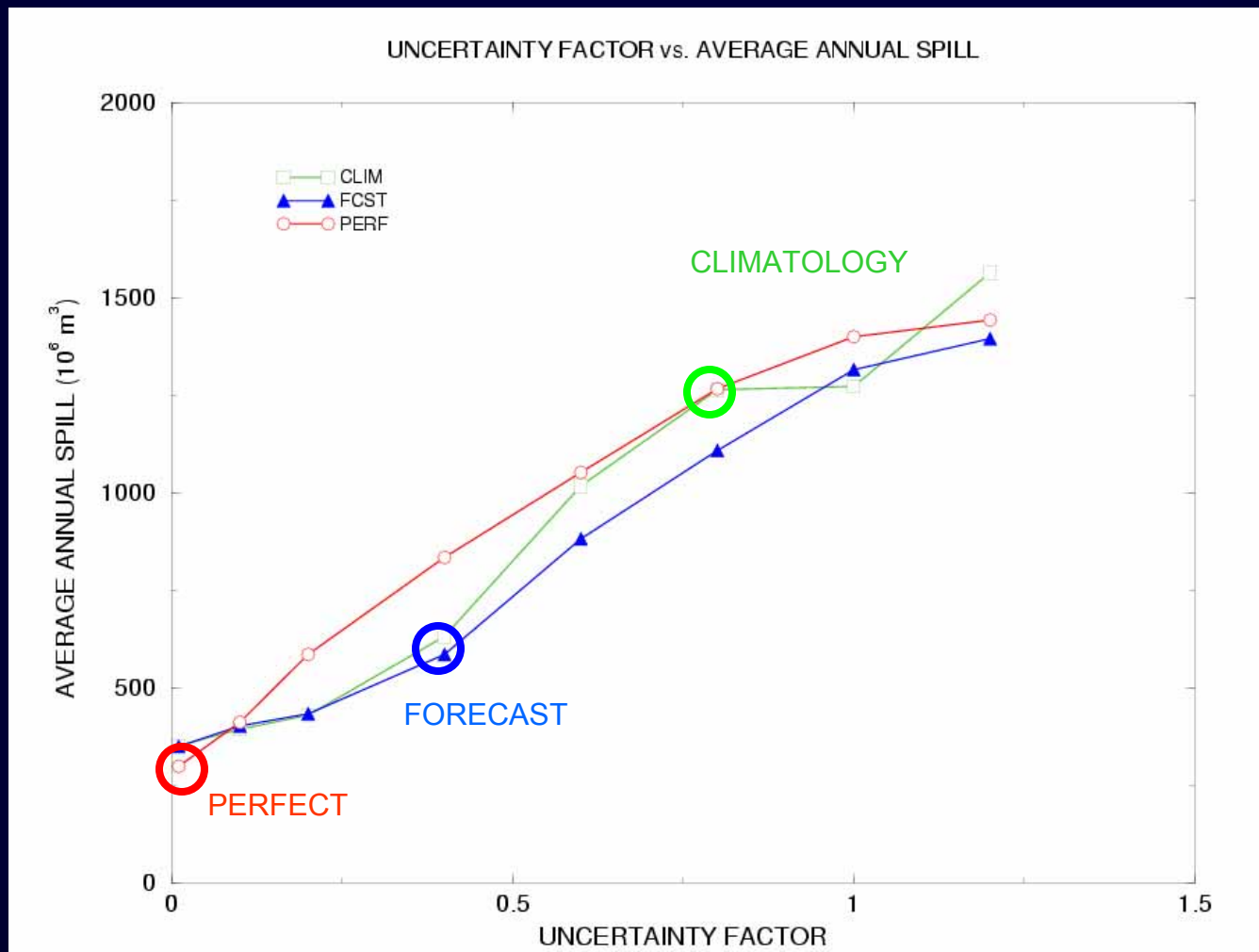
IN GENERAL, THE CANAL PERFORMS ROBUSTLY



NORMALIZED HYDRO-POWER INCOME



AVERAGE SPILL



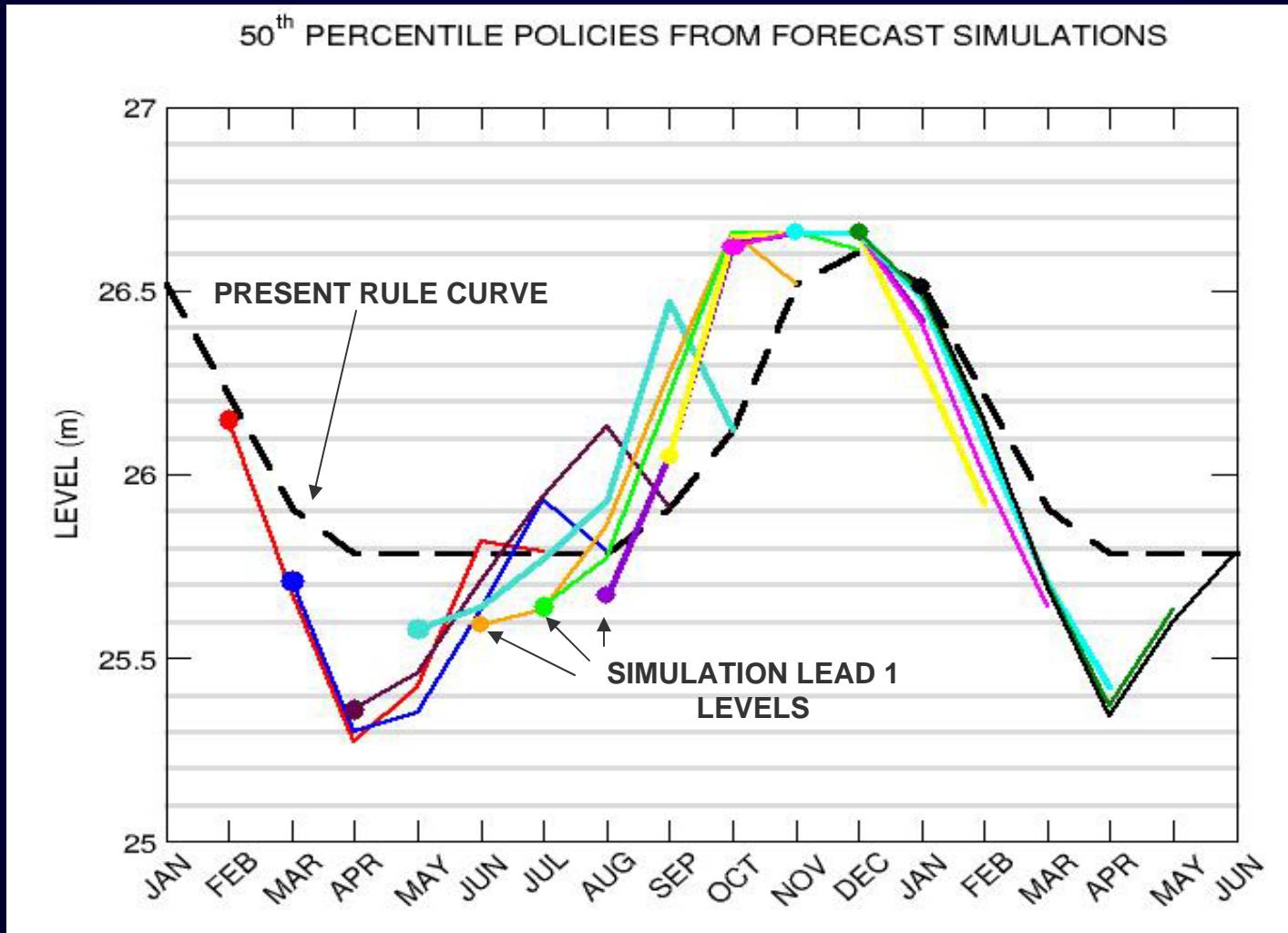
COMPARISON OF BEHAVIOR:

EXISTING RULE CURVE vs FORECAST SIMULATION

EFFECT IS TO TAKE BETTER ADVANTAGE OF EXISTING SUPPLY



CIRCLES INDICATE MONTH 1 (VERIFICATION) LEVELS FOR EACH CALENDER MONTH



TEST BEHAVIOR OF CANAL TO INCREASED LOCKAGE DEMAND

40 SHIPS PER DAY

48 SHIPS PER DAY

56 SHIPS PER DAY

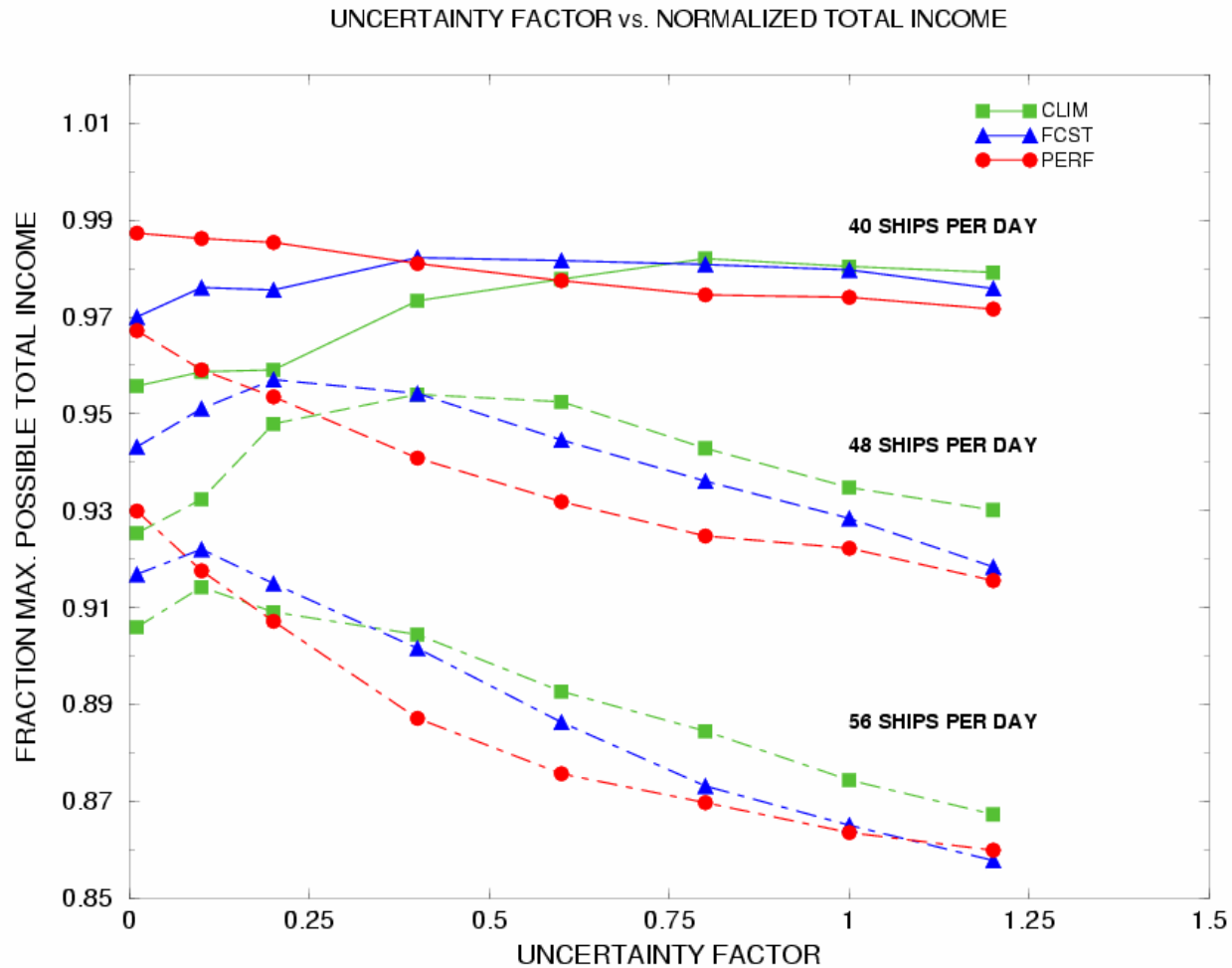
EFFECT IS TO INCREASE THE SENSITIVITY TO UNCERTAINTY SPECIFICATION



TEST BEHAVIOR OF CANAL TO INCREASED LOCKAGE DEMAND

N = 40 , 48, 56 SHIPS PER DAY

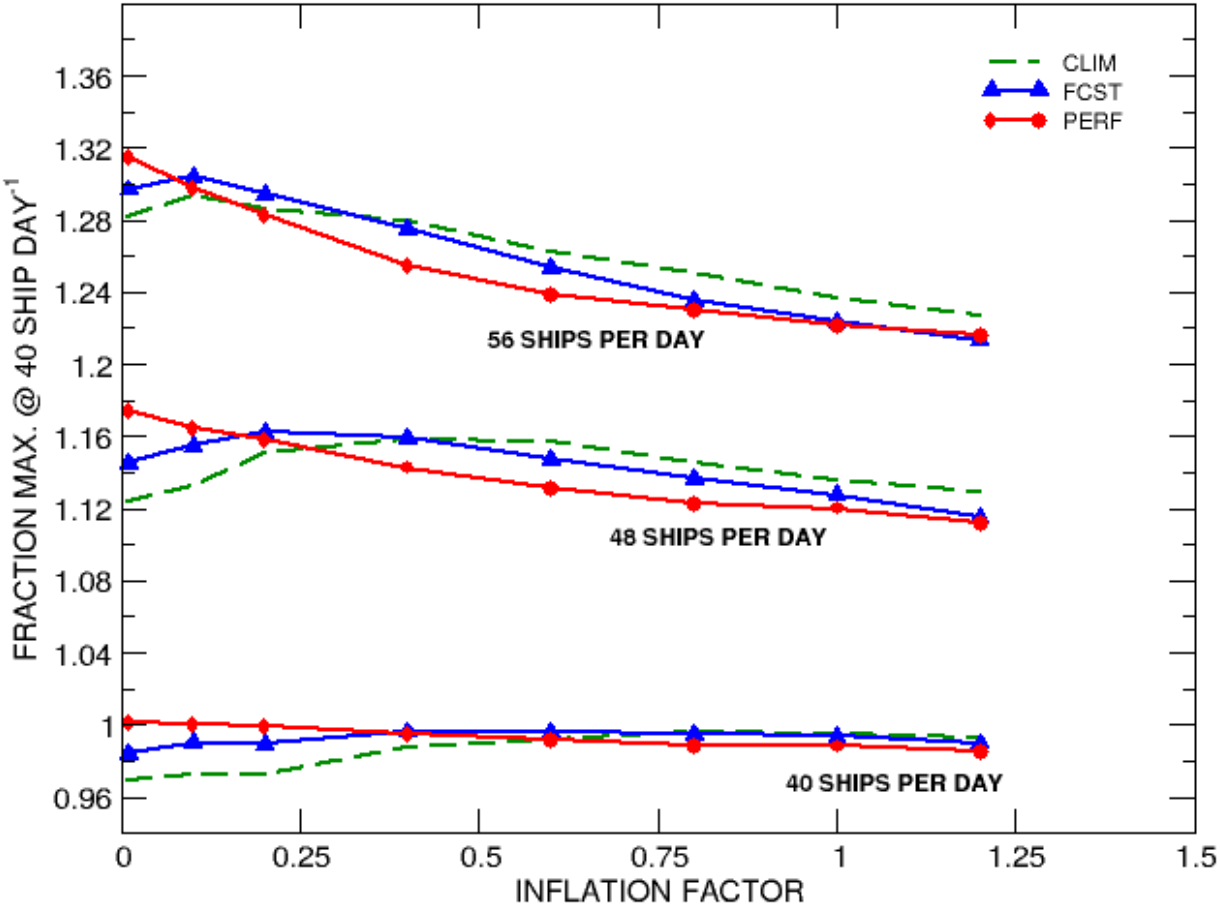
AS FRACTION OF MAXIMUM POSSIBLE INCOME FOR N SHIPS DAY⁻¹

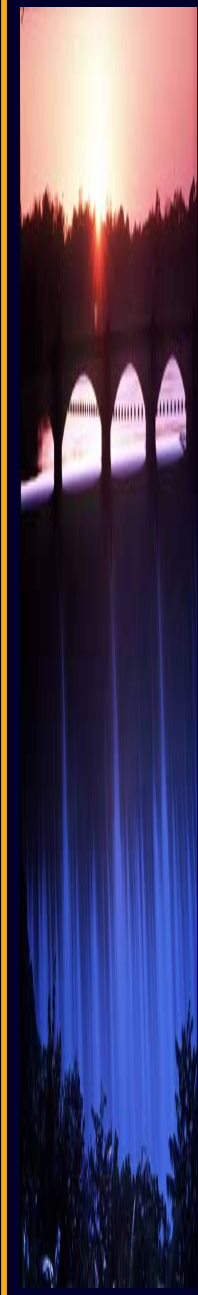


**TEST BEHAVIOR OF CANAL TO INCREASED LOCKAGE DEMAND
AS FRACTION OF MAXIMUM POSSIBLE INCOME FOR 40 SHIPS DAY⁻¹**

NOTE STEEPER DEPENDENCE ON UNCERTAINTY

VARIABILITY INFLATION FACTOR vs. SHIP INCOME (FRAC. 40 SHIPS)





SUMMARY

- 1) ROUTINE EL NIÑO FORECASTS CAN BE USED TO REDUCE THE UNCERTAINTY IN GATUN INFLOW PROJECTIONS AT LEAD TIMES OF MONTH.
- 2) THE USE OF THIS INFORMATION INCREASES SIMULATED CANAL INCOME IN COMPARISON TO CLIMATOLOGICAL EXPECTATIONS. VALUE = \$322M.
- 3) THE VALUE OF FORECAST INFORMATION INCREASES AS THE DEMANDS ON CANAL RESOURCES ARE INCREASED.
- 2) OPTIMAL CANAL OPERATION IS VERY SENSITIVE TO CORRECT SPECIFICATION OF UNCERTAINTY.

**INACCURATE FORECASTS WITH CORRECT UNCERTAINTY
BETTER THAN
ACCURATE FORECASTS WITH INCORRECT UNCERTAINTY**



- THANK YOU -

*Graham, Georgakakos, Vargas, Echevers, 2006:
Advances in Water Resources, in press.*

