

ΣΧΕΔΙΑΣΜΟΣ ΚΑΙ ΠΡΟΓΡΑΜ- ΜΑΤΙΣΜΟΣ ΠΑΡΑΓΩΓΗΣ

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PRODUCTION PLANNING AND SCHEDULING

Inventory Control Under Known Time-Varying Demand

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Dynamic Lot Sizing (DLS)

- **Assumptions/notation**

- Time is broken into discrete time periods $t = 1, 2, \dots, T$; T is the planning horizon
- Demand in period t : λ_t (parts), $t = 1, 2, \dots, T$
- Shortages are not permitted
- Infinite production/replenishment rate (instantaneous replenishment)
- Zero lead time
- Variable unit production/order cost in period t : c_t (€per part), $t = 1, 2, \dots, T$
- Fixed setup production/order cost in period t : K_t (€per production run/order initiated in period t), $t = 1, 2, \dots, T$
- Interest rate: i (€per €invested per period)
- Initial inventory at time zero: I_0

- **Computation**

- Inventory holding cost rate in period t : $h_t = ic_t$ (€per part) $t = 1, 2, \dots, T$

- **Decision**

- Inventory left over at the end of period t : I_t (parts), $t = 1, 2, \dots, T$
- Lot size (reorder quantity) in period t : Q_t (parts), $t = 1, 2, \dots, T$

DLS: No capacity

- **Problem formulation (no capacity limitation)**

$$\text{Minimize } G = \sum_{t=1}^T h_t I_t + K_t Y_t$$

$$\left. \begin{array}{l} \text{subject to: } I_t = I_{t-1} + Q_t - \lambda_t \\ Q_t \leq M \cdot Y_t \\ I_t, Q_t \geq 0 \\ Y_t \in \{0,1\} \end{array} \right\} t = 1, \dots, T$$

M : very BIG number

- **Next:**

- Alternative practical & heuristic lot sizing schemes
- Optimal solution

DLS: No capacity

- **Prototype example***

$$I_0 = 0$$

t	1	2	3	4	5	6	7	8	9	10	Total
λ_t	20	50	10	50	50	10	20	40	20	30	300
K_t	100	100	100	100	100	100	100	100	100	100	
h_t	1	1	1	1	1	1	1	1	1	1	

***Source:** Hopp, W. H., M. L. Spearman. 2000. *Factory Physics: Foundations of Manufacturing Management*, 2E. McGraw-Hill, Boston, MA (chapter 2).

DLS: No capacity

- **Lot-for-Lot** $Q_t = \lambda_t \Rightarrow Y_t = 1, I_t = 0, t = 1, \dots, T$

$$G = \sum_{t=1}^T K_t$$

t	1	2	3	4	5	6	7	8	9	10	Total
λ_t	20	50	10	50	50	10	20	40	20	30	300
Q_t	20	50	10	50	50	10	20	40	20	30	300
I_t											0
Y_t	1	1	1	1	1	1	1	1	1	1	10
$K_t Y_t$	100	100	100	100	100	100	100	100	100	100	1000
$h_t I_t$											0
G	100	100	100	100	100	100	100	100	100	100	1000

DLS: No capacity

- **Fixed Order Quantity (EOQ) lot sizing**

$$\text{EOQ} = \sqrt{\frac{2\bar{K}\bar{\lambda}}{\bar{h}}} = \sqrt{\frac{2(100)(30)}{(1)}} = 75.46 \approx 75$$

t	1	2	3	4	5	6	7	8	9	10	Total
λ_t	20	50	10	50	50	10	20	40	20	30	300
Q_t	75		75		75			75			300
I_t	55	5	70	20	45	35	15	50	30		325
Y_t	1		1		1			1			4
$K_t Y_t$	100		100		100			100			400
$h_t I_t$	55	5	70	20	45	35	15	50	30		325
G	155	5	170	20	145	35	15	150	30		725

DLS: No capacity

- **Fixed Order Period (EOQ period) lot sizing**

$$EOQ = \sqrt{\frac{2K\bar{\lambda}}{h}} = \sqrt{\frac{2(100)(30)}{(1)}} = 75.46 \approx 75 \Rightarrow T_{EOQ} = \frac{EOQ}{\bar{\lambda}} = \frac{75}{30} = 2.5 \approx 2$$

$$Q_t = \sum_{n=t}^{t+T_{EOQ}-1} \lambda_n, \quad t = 1, T_{EOQ} + 1, 2T_{EOQ} + 1, \dots; \quad 0, \text{ otherwise}$$

t	1	2	3	4	5	6	7	8	9	10	Total
λ_t	20	50	10	50	50	10	20	40	20	30	300
Q_t	70		60		60		60		50		300
I_t	50		50		10		40		30		180
Y_t	1		1		1		1		1		5
$K_t Y_t$	100		100		100		100		100		500
$h_t I_t$	50		50		10		40		30		180
G	150		150		110		140		130		680

DLS: No capacity

- Part Period Balancing

Idea: Myopic balancing of inventory cost and setup cost

$G_t^h(n) \equiv$ Total inventory holding cost if order placed in period t
 spans the next n periods, i.e., $Q_t = \lambda_t + \lambda_{t+1} + \dots + \lambda_{t+n-1}$

e.g., $G_1^h(3) = (\lambda_1)(0) + (\lambda_2)(h_1) + (\lambda_3)(h_1 + h_2) = (20)(0) + (50)(1) + (10)(2) = 70$

$n^*(t) \equiv n$ that most closely matches $G_t^h(n)$ and K_t

t	1	2	3	4	5	6	7	8	9	10	Total
λ_t	20	50	10	50	50	10	20	40	20	30	300
$n = 1$	0	} $G_1^h(n)$		0			0			0	
$n = 2$	50			50			40				
$n = 3$	70			70			80				
$n = 4$	220			130			170				
Q_t	80			110			80			30	300
				130							

DLS: No capacity

- Part Period Balancing (cont'd)

t	1	2	3	4	5	6	7	8	9	10	Total
λ_t	20	50	10	50	50	10	20	40	20	30	300
Q_t	80			110			80			30	300
I_t	60	10		60	10		60	20			220
Y_t	1			1			1			1	4
$K_t Y_t$	100			100			100			100	400
$h_t I_t$	60	10		60	10		60	20			220
G	160	10		160	10		160	20		100	620

DLS: No capacity

- Silver-Meal Heuristic**

Idea: Myopic minimization of average cost per period

$\bar{G}_t(n) \equiv$ Average inventory holding cost plus setup cost per period if order placed in period t spans the next n periods, i.e., $Q_t = \lambda_t + \lambda_{t+1} + \dots + \lambda_{t+n-1}$

e.g.,
$$\bar{G}_1(3) = \frac{K_1 + (\lambda_2)(h_1) + (\lambda_3)(h_1 + h_2)}{3} = \frac{100 + (50)(1) + (10)(2)}{3} = 56.66$$

$n^*(t) \equiv$ smallest n such that $\bar{G}_t(n) \leq \bar{G}_t(n+1)$

t	1	2	3	4	5	6	7	8	9	10	Total
λ_t	20	50	10	50	50	10	20	40	20	30	300
$n = 1$	100			100			100			100	
$n = 2$	75			75			70				
$n = 3$	56.66			56.66			60				
$n = 4$	80			57.5			67.5				
Q_t	80			110			80			30	300

DLS: No capacity

- Silver-Meal Heuristic (cont'd)

t	1	2	3	4	5	6	7	8	9	10	Total
λ_t	20	50	10	50	50	10	20	40	20	30	300
Q_t	80			110			80			30	300
I_t	60	10		60	10		60	20			220
Y_t	1			1			1			1	4
$K_t Y_t$	100			100			100			100	400
$h_t I_t$	60	10		60	10		60	20			220
G	160	10		160	10		160	20		100	620

Coincidentally, it yields the same total cost as part period balancing

DLS: No capacity

- Least Unit Cost**

Idea: Myopic minimization of average cost per **part**

$\bar{G}_t(n) \equiv$ Average inventory holding cost plus setup cost per part if order placed in period t spans the next n periods, i.e., $Q_t = \lambda_t + \lambda_{t+1} + \dots + \lambda_{t+n-1}$

e.g.,
$$\bar{G}_1(3) = \frac{K_1 + (\lambda_2)(h_1) + (\lambda_3)(h_1 + h_2)}{80} = \frac{100 + (50)(1) + (10)(2)}{80} = 2.125$$

$n^*(t) \equiv$ smallest n such that $\bar{G}_t(n) \leq \bar{G}_t(n+1)$

t	1	2	3	4	5	6	7	8	9	10	Total
λ_t	20	50	10	50	50	10	20	40	20	30	300
$n = 1$	5			2		10			5		
$n = 2$	2.142			1.5		4			2.6		
$n = 3$	2.125			1.545		2.857					
$n = 4$	2.462					2.888					
Q_t	80			100		70			50		300

DLS: No capacity

- **Least Unit Cost (cont'd)**

t	1	2	3	4	5	6	7	8	9	10	Total
λ_t	20	50	10	50	50	10	20	40	20	30	300
Q_t	80			100		70			50		300
I_t	60	10		50		60	40		30		220
Y_t	1			1		1			1		4
$K_t Y_t$	100			100		100			100		400
$h_t I_t$	60	10		50		60	40		30		250
G	160	10		150		160	40		130		650

DLS: No capacity

- **Optimal Solution**

$$\text{Minimize } G = \sum_{t=1}^T h_t I_t + K_t Y_t$$

$$\left. \begin{array}{l} \text{subject to: } I_t = I_{t-1} + Q_t - \lambda_t \\ Q_t \leq M Y_t \\ I_t, Q_t \geq 0 \\ Y_t \in \{0,1\} \end{array} \right\} t = 1, \dots, T$$

M : very BIG number

Wagner-Whitin property

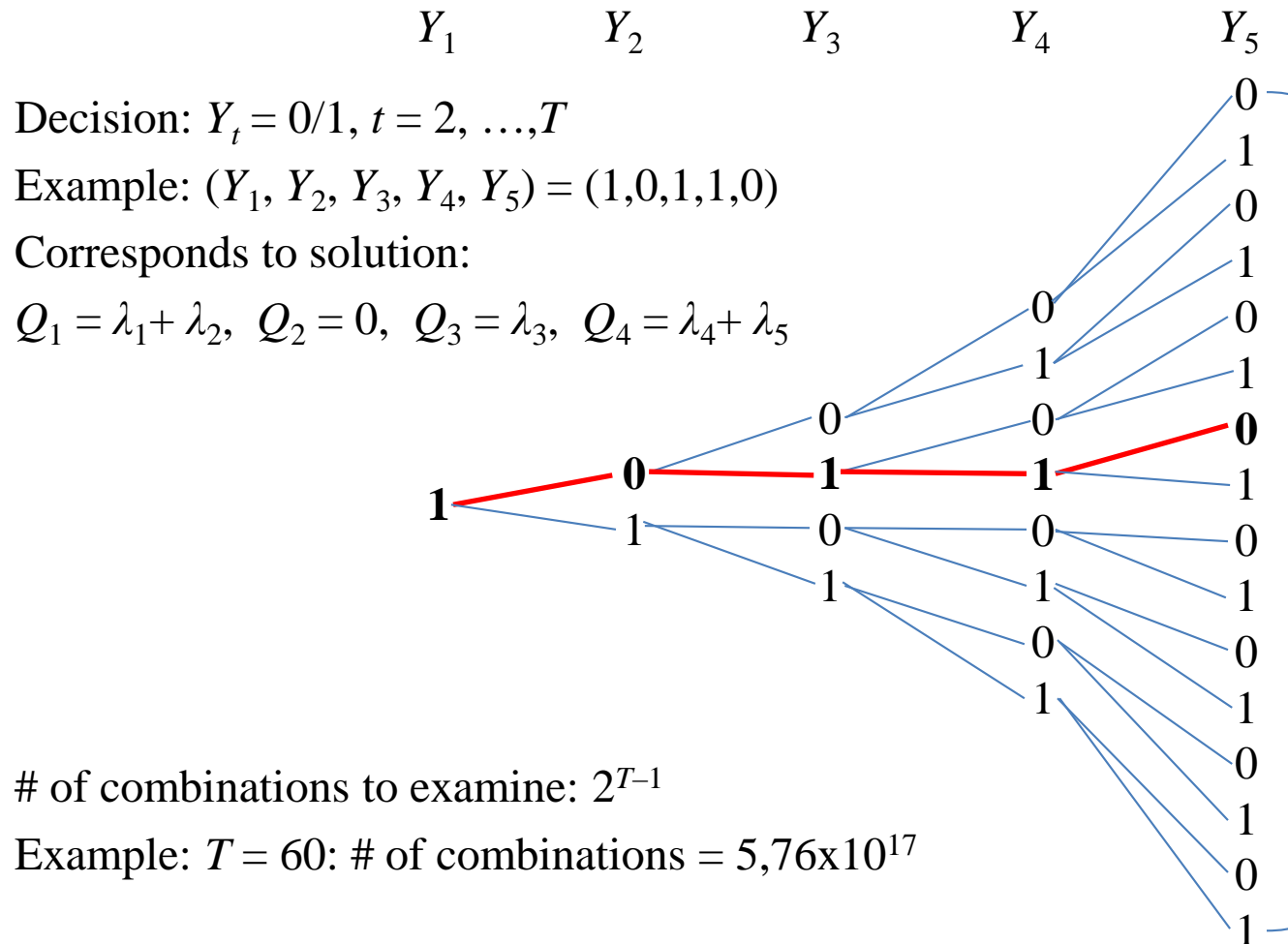
$$Q_t = 0 \text{ or } Q_t = \lambda_t \text{ or } Q_t = \lambda_t + \lambda_{t+1} \text{ or } \dots \text{ or } Q_t = \lambda_t + \lambda_{t+1} + \dots + \lambda_{t+T}$$

- **Reference**

Wagner, H.M., T.M. Whitin. 1958. [Dynamic version of the economic lot sizing model](#). Management Science 5 (1) 89-96

DLS: No capacity

- Problem is a pure combinatorial problem



of combinations to examine: 2^{T-1}

Example: $T = 60$: # of combinations = $5,76 \times 10^{17}$

DLS: No capacity

- **Wagner-Whiting procedure**

Forward algorithm: Consider successively t -period problems, $t = 1, \dots, T$

For each problem compute:

$Z_t^* \equiv$ minimum cost in the t -period problem

$j_t^* \equiv$ last period of production in the t -period problem

To compute Z_t^* and j_t^* , define:

$G_t(n) \equiv$ Total inventory holding cost plus setup cost if order placed in period t spans the next n periods, i.e., $Q_t = \lambda_t + \lambda_{t+1} + \dots + \lambda_{t+n-1}$

e.g., $G_2(3) = K_2 + \lambda_3 h_2 + \lambda_4 (h_2 + h_3)$

Computation of Z_t^* and j_t^* :

$$Z_0^* = 0, \quad j_0^* = 1$$

$$Z_t^* = \min_{i=j_{t-1}^*, \dots, t} \{Z_{i-1}^* + G_i(t-i+1)\}, \quad j_t^* = \arg \min_{i=j_{t-1}^*, \dots, t} \{Z_{i-1}^* + G_i(t-i+1)\}, \quad t = 1, \dots, T$$

DLS: No capacity

- Wagner-Whitin procedure (cont'd)

t	1	2	3	4	5	6	7	8	9	10	
λ_t	20	50	10	50	50	10	20	40	20	30	
Last period with production	1	100	150	170	320						
	2		200	210	310						
	3			250	300						
	4				270	320	340	400	560		
	5					370	380	420	540		
	6						420	440	520		
	7							440	480	520	610
	8								500	520	580
	9									580	610
	10										620
Z_t^*	100	150	170	270	320	340	400	480	520	580	
j_t^*	1	1	1	4	4	4	4	7	7/8	8	

DLS: No capacity

- Wagner-Whiting procedure (cont'd)

Computations :

$$Z_0^* = 0, \quad j_0^* = 1$$

$$Z_1^* = \min \left\{ Z_0^* + G_1(1) = G_1(1) = K_1 = 100, \text{ produce in period } \mathbf{1} \right\}, \quad j_1^* = \mathbf{1}$$

$$Z_2^* = \min \left\{ \begin{array}{l} Z_0^* + G_1(2) = K_1 + h_1 \lambda_2 = 100 + 1 \cdot 50 = \mathbf{150} \text{ produce in period } \mathbf{1} \\ Z_1^* + G_2(1) = Z_1^* + K_2 = 100 + 100 = 200 \text{ produce in period } \mathbf{2} \end{array} \right\}, \quad j_2^* = \mathbf{1}$$

$$Z_3^* = \min \left\{ \begin{array}{l} Z_0^* + G_1(3) = K_1 + h_1 \lambda_2 + (h_1 + h_2) \lambda_3 = 100 + 1 \cdot 50 + 2 \cdot 10 = \mathbf{170} \text{ produce in period } \mathbf{1} \\ Z_1^* + G_2(2) = Z_1^* + K_2 + h_2 \lambda_3 = 100 + 100 + 1 \cdot 10 = 210 \text{ produce in period } \mathbf{2} \\ Z_2^* + G_3(1) = Z_2^* + K_3 = 150 + 100 = 250 \text{ produce in period } \mathbf{3} \end{array} \right\}, \quad j_3^* = \mathbf{1}$$

$$Z_4^* = \min \left\{ \begin{array}{l} Z_0^* + G_1(4) = G_1(4) = 320 \text{ produce in period } \mathbf{1} \\ Z_1^* + G_2(3) = 100 + G_2(3) = 310 \text{ produce in period } \mathbf{2} \\ Z_2^* + G_3(2) = 150 + G_3(2) = 300 \text{ produce in period } \mathbf{3} \\ Z_3^* + G_4(1) = 170 + 100 = \mathbf{270} \text{ produce in period } \mathbf{4} \end{array} \right\}, \quad j_4^* = \mathbf{4}$$

DLS: No capacity

- **Wagner-Whiting procedure (cont'd)**

Computations :

$$Z_5^* = \min \left\{ \begin{array}{l} Z_3^* + G_4(2) = 170 + 150 = 320 \text{ produce in period 4} \\ Z_4^* + G_5(1) = 270 + 100 = 370 \text{ produce in period 5} \end{array} \right\}, \quad j_5^* = 4$$

$$Z_6^* = \dots$$

⋮

$$Z_{10}^* = \dots$$

Construct solution going backwards :

$$t=10: \quad j_{10}^* = 8 \quad \Rightarrow \quad Q_8 = \lambda_8 + \lambda_9 + \lambda_{10} = 90, \quad Q_9 = Q_{10} = 0 \quad \Rightarrow \quad \text{GOTO } t=7$$

$$t=7: \quad j_7^* = 4 \quad \Rightarrow \quad Q_4 = \lambda_4 + \lambda_5 + \lambda_6 + \lambda_7 = 130, \quad Q_5 = Q_6 = Q_7 = 0 \quad \Rightarrow \quad \text{GOTO } t=3$$

$$t=3: \quad j_3^* = 1 \quad \Rightarrow \quad Q_1 = \lambda_1 + \lambda_2 + \lambda_3 = 80, \quad Q_2 = Q_3 = 0$$

DLS: No capacity

- **Wagner-Whiting procedure (cont'd)**

t	1	2	3	4	5	6	7	8	9	10	Total
λ_t	20	50	10	50	50	10	20	40	20	30	300
Q_t	80			130				90			300
I_t	60	10		80	30	20		50	30		280
Y_t	1			1				1			3
$K_t Y_t$	100			100				100			300
$h_t I_t$	60	10		80	30	20		50	30		280
G	170	10		180	30	20		150	30		580

DLS: Finite capacity

- **Problem formulation (capacity limitation)**

$$\text{Minimize } G = \sum_{t=1}^T h_t I_t + K_t Y_t$$

$$\left. \begin{array}{l} \text{subject to: } I_t = I_{t-1} + Q_t - \lambda_t \\ Q_t \leq C_t \cdot Y_t \\ I_t, Q_t \geq 0 \\ Y_t \in \{0,1\} \end{array} \right\} t = 1, \dots, T$$

C_t : maximum production capacity in period t

- **Feasibility condition:**

$$\sum_{i=1}^t C_i \geq \sum_{i=1}^t \lambda_i, \quad t = 1, \dots, T$$

- Not obvious how to get a feasible solution

DLS: Finite capacity

- **2-step heuristic procedure for solving the problem**

Step 1: Obtain an initial feasible solution

1. Start with a lot-for-lot initial solution
2. Starting from the first period and working forward, backshift demand from periods in which demand exceeds capacity to prior periods in which there is capacity
3. Repeat for each period in which demand exceeds capacity until schedule is feasible

Step 2: Improve initial feasible solution

1. Start with the feasible lot-for-lot solution developed in step 1
2. Starting from the last period and working backward, determine if it is cheaper to produce the units composing that lot by shifting production to prior periods in which there is excess capacity

DLS: Finite capacity

- **Example***

t	1	2	3	4	5	6	7	8	9	Total
λ_t	100	79	230	105	3	10	99	126	40	792
C_t	120	200	200	400	300	50	120	50	30	
K_t	450	450	450	450	450	450	450	450	450	
h_t	2	2	2	2	2	2	2	2	2	
$\sum_{i=1}^t \lambda_i$	100	179	409	514	517	527	626	752	792	
$\sum_{i=1}^t C_i$	120	320	520	920	1220	1270	1390	1440	1470	

- Feasibility test satisfied: $\sum_{i=1}^t C_i \geq \sum_{i=1}^t \lambda_i, \quad t = 1, \dots, T$

***Source:** Nahmias, S. 2009. Production and Operations Analysis, 6E. McGraw Hill, Boston MA (chapter 7).

DLS: Finite capacity

- **Step 1:** Obtain an initial feasible solution

t	1	2	3	4	5	6	7	8	9	Total
λ_t	100	79	230	105	3	10	99	126	40	792
C_t	120	200	200	400	300	50	120	50	30	
		+30	-30							
$\lambda_t(1)$	100	109	200	105	3	10	99	126	40	
					+15	+40	+21	-76		
$\lambda_t(2)$	100	109	200	105	18	50	120	50	40	
					+10				-10	
$\lambda_t(3)$	100	109	200	105	28	50	120	50	30	
Q_t	100	109	200	105	28	50	120	50	30	

DLS: Finite capacity

- **Step 1:** Obtain an initial feasible solution

t	1	2	3	4	5	6	7	8	9	Total
λ_t	100	79	230	105	3	10	99	126	40	792
Q_t	100	109	200	105	28	50	120	50	30	792
I_t		30			25	65	86	10		216
Y_t	1	1	1	1	1	1	1	1	1	
$K_t Y_t$	450	450	450	450	450	450	450	450	450	4050
$h_t I_t$		60			50	130	172	20		432
G	450	510	450	450	500	580	622	470	450	4482

DLS: Finite capacity

- **Step 2:** Improve initial feasible solution

t	1	2	3	4	5	6	7	8	9	Cost improvement
λ_t	100	109	200	105	28	50	120	50	30	
C_t	120	200	200	400	300	50	120	50	30	
Q_t	100	109	200	105	28	50	120	50	30	
EC	20	91		295	272					
					+30				-30	$450 - 2 \cdot 30 \cdot 4 = 210$
$Q_t(1)$	100	109	200	105	58	50	120	50	0	
EC	20	91		295	242				30	
					+50			-50		$450 - 2 \cdot 50 \cdot 3 = 150$
$Q_t(2)$	100	109	200	105	108	50	120	0		
EC	20	91		295	192			50	30	
					+120		-120			$450 - 2 \cdot 120 \cdot 2 = -30$
					+50	-50				$450 - 2 \cdot 50 \cdot 1 = 350$
$Q_t(3)$	100	109	200	105	158	0	120			
EC	20	91		295	142	50		50	30	

DLS: Finite capacity

- **Step 2:** Improve initial feasible solution (cont'd)

t	1	2	3	4	5	6	7	8	9	Cost improvement
λ_t	100	109	200	105	28	50	120	50	30	
C_t	120	200	200	400	300	50	120	50	30	
$Q_t(3)$	100	109	200	105	158	0	120			
EC	20	91		295	142	50		50	30	
				+158	-158					450 - 2 158 1 = 134
$Q_t(4)$	100	109	200	263	0		120			
EC	20	91		137	300	50		50	30	

DLS: Finite capacity

- Evaluate improved solution

t	1	2	3	4	5	6	7	8	9	Total
λ_t	100	79	230	105	3	10	99	126	40	792
Q_t	100	109	200	263			120			792
I_t		30		158	155	145	166	40		694
Y_t	1	1	1	1			1			
$K_t Y_t$	450	450	450	450			450			2250
$h_t I_t$		60		316	310	290	332	80		1388
G	450	510	450	766	310	290	782	80		3638