

The matching problem using Stata

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I. Motivation

□ 21,167 people received a kidney in 2018 (USA), 2,855(ROK)

≈ **58 Kidney transplants each day**

• 6,446 from living donor. (Some through kidney exchanges)

□ Kidney waiting list: over 103,029 (23,591, ROK)

□ 4,537 people died while waiting(2014)

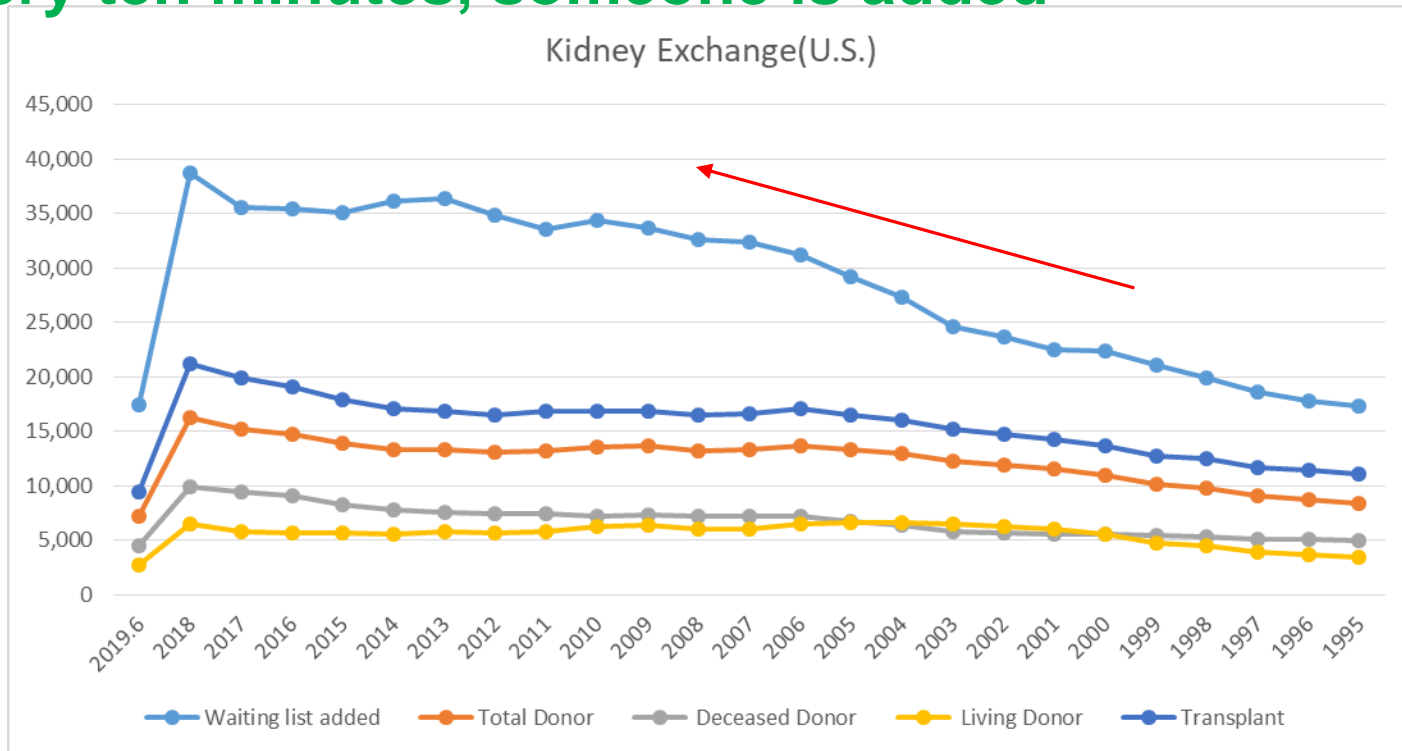
≈ **13 people die each day while waiting**

* Data source : Organ Procurement and Transplantation Network(OPTN)

I. Motivation

- 38,791 added to the national Kidney transplant waiting list in 2018 (17,397 added as of June 30 in 2019)

≈ **Every ten minutes, someone is added**



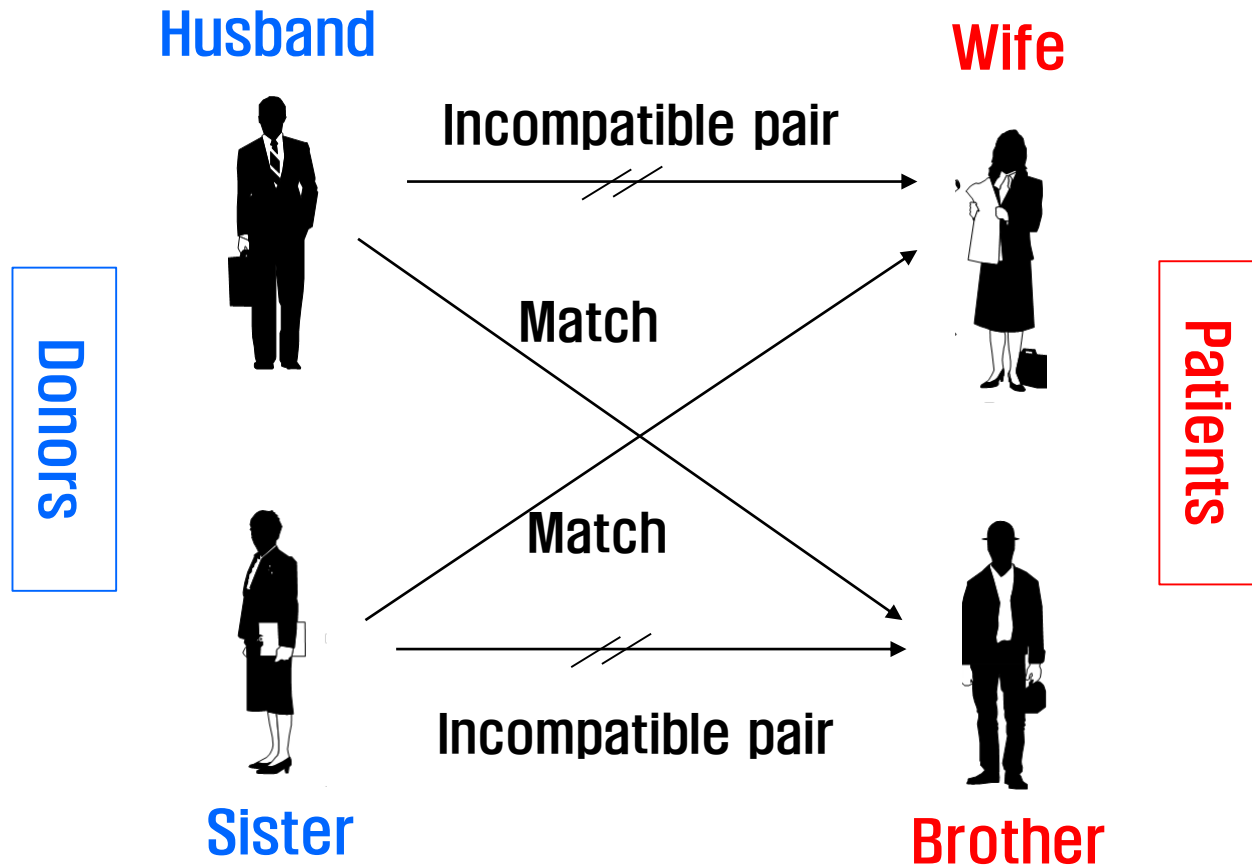
Matching organs. Saving lives.

* Data source : Organ Procurement and Transplantation Network(OPTN)



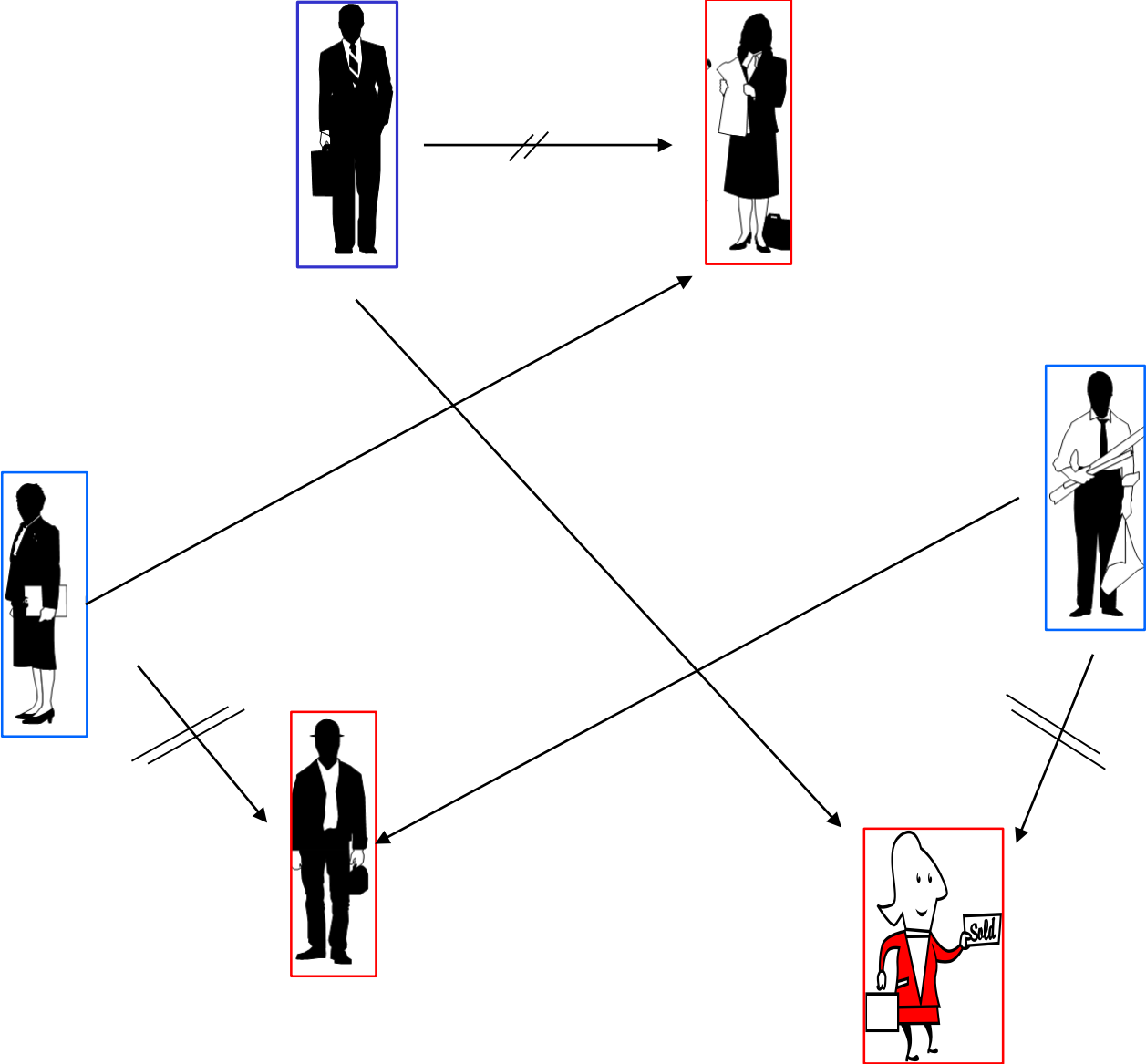
I. Motivation

- Kidney Exchange (Living donor kidney matching) Types
 - Two-way exchange (all surgeries must be executed simultaneously)



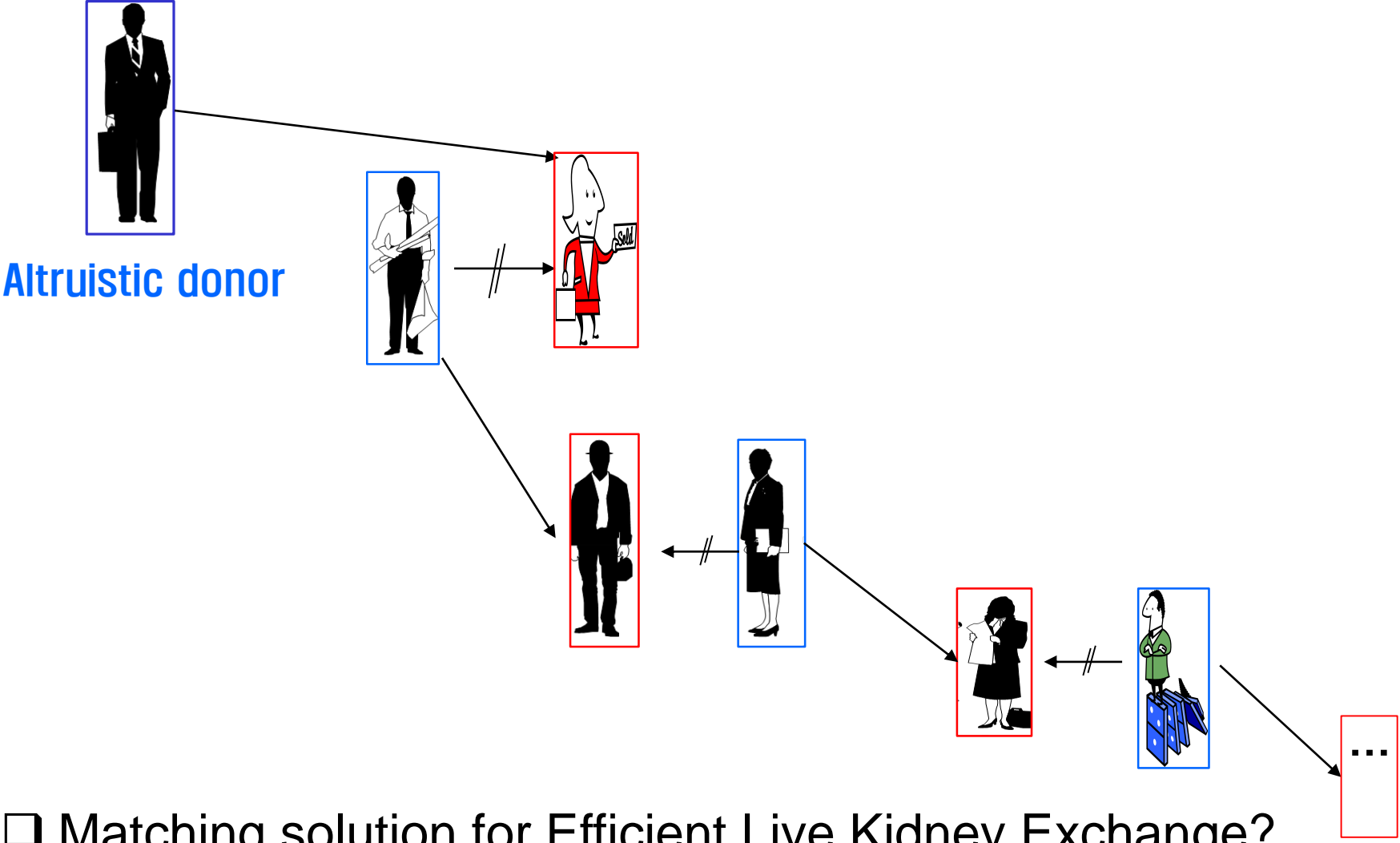
I. Motivation

- Three-way exchange(all surgeries must be executed simultaneously)



I. Motivation

- Chain (Simultaneous surgeries not required)

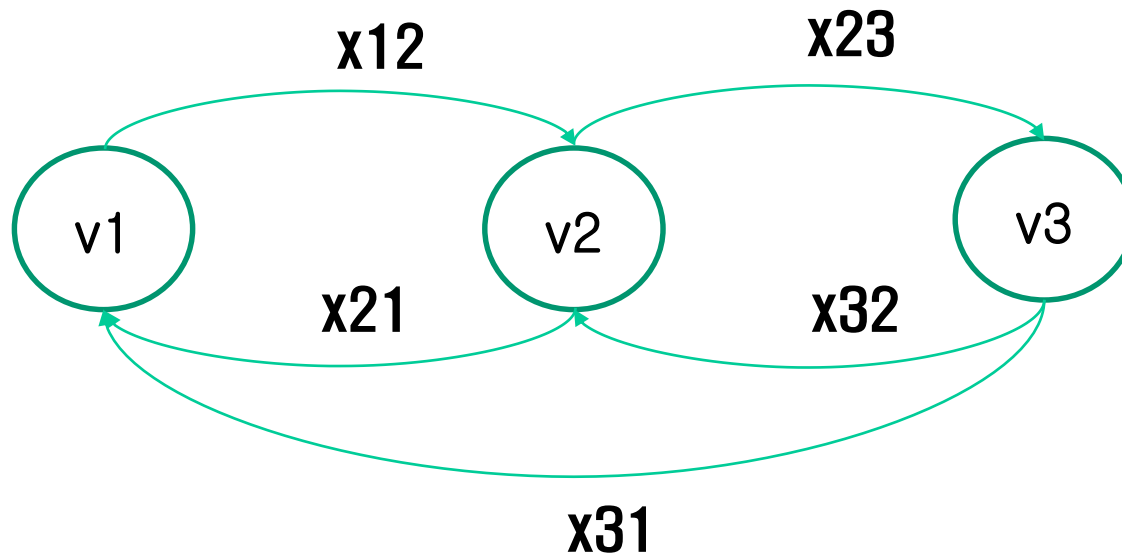


□ Matching solution for Efficient Live Kidney Exchange?

II. Paired Live Kidney Exchange: exemplary solution

□ Problem Considered

○ Find maximum matching sets with certain cycle constraints(considering simultaneous surgery capacity).



- v : incompatible donor-patient pair
- x_{ij} : takes value 1 if matched and included in cycle. Otherwise 0. The same weight for x_{ij} is assumed.
- k : maximum number of cycle allowed

II. Paired Live Kidney Exchange: exemplary solution

○ Problem Formulation

$$\text{Max } \sum_{i,j \in N} x_{i,j} \quad (1)$$

s.t.

$$\sum_{j \in N} x_{i,j} \leq 1 \quad \forall i, j \in N \quad (2)$$

$$\sum_{j \in N} x_{i,j} = \sum_{j \in N} x_{j,i} \quad \forall i \in N \quad (3)$$

$$x_{i_1 i_2} + x_{i_2 i_3} + \dots + x_{i_k i_{k+1}} \leq k - 1 \quad (4)$$

II. Paired Live Kidney Exchange: exemplary solution

○ Problem Arrangement

$$\mathbf{(1)} \quad z = x_{12} + x_{21} + x_{23} + x_{32} + x_{31}$$

(2)

$$x_{12} \leq 1$$

$$x_{21} + x_{23} \leq 1$$

$$x_{32} + x_{31} \leq 1$$

(3)

$$x_{21} + x_{31} = x_{12}$$

$$x_{12} + x_{32} = x_{21} + x_{23}$$

$$x_{32} = x_{32} + x_{31}$$

(4)

$$x_{12} + x_{23} + x_{31} \leq 2$$

$$x_{12} + x_{21} \leq 2$$

$$x_{23} + x_{32} \leq 2$$

II. Paired Live Kidney Exchange: exemplary solution

□ Solution using the user written Command “lp”

○ Data Input

x12	x21	x23	x32	x31	rel	rhs
1	0	0	0	0	<=	1
0	1	1	0	0	<=	1
0	0	0	1	1	<=	1
-1	1	0	0	1	=	0
1	-1	-1	1	0	=	0
0	0	1	-1	-1	=	0
1	0	1	0	1	<=	2
1	1	0	0	0	<=	2
0	0	1	1	0	<=	2

II. Paired Live Kidney Exchange: exemplary solution

○ Program Syntax

`lp varlists [if] [in] [using/] [, rel(varname)
rhs(varname) min max intvars(varlist) tol1(real)
tol2(real) saving(filename)]`

- `rel(varname)` specifies the variable with the relationship symbols. The default option is `rel`.
- `rhs(varname)` specifies the variable with constants in the right hand side of equation. The default option is `rhs`.
- `min` and `max` are case sensitive. `min(max)` is to minimize(maximize) the objective function.
- `intvars(varlist)` specifies variables with integer value.
- `tol1(real)` sets the tolerance of pivoting value. The default value is $1e-14$. `tol2(real)` sets the tolerance of matrix inverse. The default value is $2.22e-12$.

II. Paired Live Kidney Exchange: exemplary solution

○ Result: lp with maximization option.

. lp x12 x21 x23 x32 x31, max intvars(x12 x21 x23 x32 x31) rel(rel) rhs(rhs)

Input Values:

	z	x12	x21	x23	x32	x31	s1	s2	s3	s4	s5	a1	a2	a3	rhs
r1	1	1	0	0	0	0	0	0	0	0	0	1	1	1	1
r2	0	0	1	1	0	0	1	0	0	0	0	0	0	0	1
r3	0	0	0	0	1	1	0	1	0	0	0	0	0	0	1
r4	0	-1	1	0	0	1	0	0	0	0	0	1	0	0	0
r5	0	1	-1	-1	1	0	0	0	0	0	0	0	1	0	0
r6	0	0	0	1	-1	-1	0	0	0	0	0	0	0	1	0
r7	0	1	0	1	0	1	0	0	1	0	0	0	0	0	2
r8	0	1	1	0	0	0	0	0	0	1	0	0	0	0	2
r9	0	0	0	1	1	0	0	0	0	0	1	0	0	0	2

LP Results: options(max)

	z	x12	x21	x23	x32	x31	s1	s2	s3	s4	s5
opt_val	1	1	1	0	0	0	0	1	1	0	2

- The solution maximizes the total number of transplants performed. Two way matching solutions are possible and (x12, x21) is one of the solution.
- Different weights for x_{ij} can result different solutions.

III. Remarks

□ Remarks

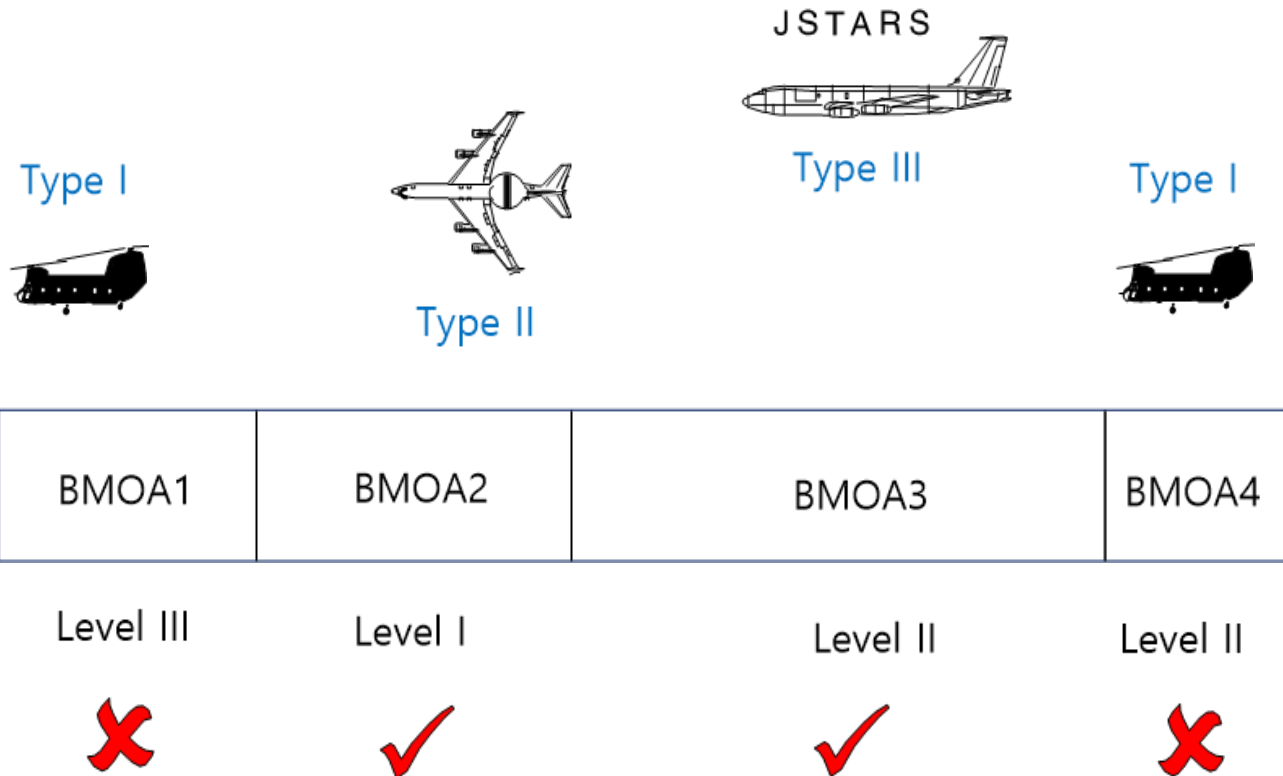
○ Attempt for matching problem to determine the efficient live kidney matching set is valuable and the following information are generally required.

- a list of altruistic donators
- a list of patient–donor pairs
- the compatibility information between all donors and patients
- the “weight,” or priority, of each potential transplant, and
- a bound on the maximum cycle length.

III. Remarks

□ Remarks

○ Real-time matching of target with assets?



○ Some theoretical topics of matching problem in the reference.

References

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- ❖ Acknowledgement : especially thank you to Sung-hoon Hong of KIPF for discussion and inspiration for the matching problem.

Thank You !