

Post-Disaster Gasoline Distribution Strategies to Reduce Social-Economic Losses: Lessons from the Great Eastern Japan Earthquake

Takeshi Nagae^{a,*}, Hiromichi Yamaguchi^a, Minoru Osawa^b, Takashi Akamatsu^b

^aGraduate School of Engineering, Tohoku University
Aoba, Aramaki, Aoba, Sendai, Miyagi, 980-8579, Japan

^bGraduate School of Information Sciences, Tohoku University
Aoba, Aramaki, Aoba, Sendai, Miyagi, 980-8579, Japan

Abstract

In the Great East Japan Earthquake on 11th March, 2011, the Tohoku region was faced with serious gasoline shortages for an extended period due to the severe damage on its only oil refinery and the major oil terminals on the Pacific coast by the earthquake and subsequent tsunami. Such gasoline shortages not only hampered relief and restoration efforts, but also dampened socio-economic activities in the entire Tohoku region. In this study, using actual data, we first clarify that the fundamental reason for the gasoline shortage was the failure in adjusting the amount and shipping patterns of gasoline in response to the spatial changes in the production areas caused by the disaster. We then show that the gasoline shortage could have been reduced considerably by some post-disaster gasoline distribution strategies to redirect a certain amount of gasoline into the Tohoku region from other unaffected areas. Finally, we estimate the cost required to execute such a gasoline distribution strategy as well as its economic effect, demonstrating that although the cost is only 300 million yen, the benefit amounts to over 200 billion yen.

Keywords: the Great East Japan Earthquake, gasoline shortage, spatio-temporal analyses, demand-supply gap, gasoline logistics, post-disaster measures

1. Introduction

After the Great East Japan Earthquake on March 11, 2011, the Tohoku region was faced with serious gasoline shortages for an extended period. Many gas stations ran dry and closed for

*Corresponding author: E-mail: nagae@tm.tohoku.ac.jp, tel/fax:+81-22-795-5023
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1 business. A few gas stations that remained operational had waiting lines that extended several
2 kilometers. The gasoline shortages also spread to the region facing the Sea of Japan, where oil
3 terminals were spared from direct earthquake and tsunami damage. This situation continued for
4 over a month, and many gasoline users were unable to obtain enough supply during this time. As
5 a result, relief and restoration efforts were considerably hampered, and socio-economic activities
6 in the entire Tohoku region were dampened. In particular, the gasoline shortages directly reduced
7 labor opportunities, because the percentage of workers who commute by car is high in the Tohoku
8 region. This study clarifies that the extent of the economic loss was tremendous.

9 Using a quantitative analysis based on the following facts observed in the available data, we
10 demonstrated that the main cause of the gasoline shortages was from the supply-side, especially
11 due to the failure of the gasoline shipping strategy. 1) Gasoline sales in the Tohoku region in
12 March declined approximately 30% compared to the previous year. In particular, March gasoline
13 sales in Miyagi Prefecture located on the Pacific coast declined to half the volume of the previous
14 March. Explaining gasoline shortages of this magnitude caused only by (local and temporary)
15 panic and hoarding behavior is impossible. 2) The only oil refinery in the Tohoku region and the
16 oil terminals on the Pacific coast stopped functioning and became unavailable for an extended
17 period due to the earthquake and subsequent tsunami. As a result, the Tohoku region was forced
18 to rely on gasoline supply shipped from other, unaffected areas. 3) However, the actual amount of
19 gasoline shipped during the first month after the earthquake was insufficient from the standpoint
20 of producing and receiving capacities. Among the port facilities in the Tohoku region, the ones
21 on the coast of the Japan Sea were not directly affected by the earthquake and tsunami; therefore,
22 their capacity to receive shipments must have been restored to normal levels within a few days
23 after the earthquake. Nevertheless, when the amount of gasoline shipped into the ports on the
24 Japan Sea coast from other areas during the first month after the earthquake is compared to the
25 amount shipped in before the earthquake, the increase was approximately only 27×10^3 kL. This
26 is merely a day's worth in terms of idle daily capacity (i.e., the amount of unutilized gasoline
27 production capacity per day) in the unaffected area and only 1.17 days' worth in terms of daily
28 capacity to receive shipments (i.e., the largest amount of gasoline accepted in a day after the
29 earthquake) at the Japan Sea coastal ports. These facts suggest that the gasoline shortages (and
30 subsequent economic loss) became serious and persistent because gasoline was not shipped in
31 large quantities into the Tohoku region from other areas.

1 It is natural to believe that the reason for unfulfilled regional gasoline shipments lies in the
2 measures executed by the Japanese government after the earthquake, which can be summarized
3 as follows. First, the Japanese government urged consumers to refrain from purchasing nonessen-
4 tial gasoline. However, because the gasoline shortages were caused mainly by reduced supply
5 rather than increased demand as described above, this measure was not a direct solution for gaso-
6 line shortages. Second, the Japanese government was entirely focused on addressing the gasoline
7 shortages locally. Specifically, in order to resolve local gasoline shortages in each municipality
8 along the Pacific coast that has been devastated by the tsunami, the government provided meticu-
9 lous support based on individual requests. However, in terms of support to the whole region, the
10 government only announced that “it would redirect 20×10^3 kL of gasoline *per day* to the Tohoku
11 region from Western Japan” without clarifying the specific method of distribution, which was left
12 to voluntary actions of private companies. In the end, only 27×10^3 kL of gasoline was redirected
13 to Tohoku *per month*, as previously mentioned. Third, the Japanese government regarded the per-
14 sistent gasoline demand as flow and focused only on the volume of shipments and sales per day,
15 which can be seen from the government reports claiming that gasoline shortages have been re-
16 solved. Specifically, the government said that the daily sales volume of gasoline reached 98% of
17 its historical average on the release dated March 25, 2 weeks after the earthquake. However, as
18 described later, this was an overstated claim that could hamper the understanding of the extent
19 of the gasoline shortages and the formulation of related solutions.

20 In total, the Japanese government was entirely focused on a bottom-up, local and microscopic
21 style of support. However, in order to execute national-scale gasoline shipments in large quan-
22 tities to a broad area immediately after an earthquake, a top-down approach is essential. First,
23 increasing the supply of gasoline rather than suppress the demand for gasoline should be the top
24 priority. Suppressing demand limits households from engaging in economic activities (e.g., by
25 limiting car commuting) and possibly increases the opportunity loss, especially when increased
26 demand is not the cause of the gasoline shortage. Second, the emphasis should be on global mea-
27 sures rather than on local ones. Specifically, to strengthen the supply system at the macro-level, it
28 is critical to devise concrete solutions that cover the entire affected region rather than responding
29 to individual requests from each municipality. Third, the government should recognize unmet
30 demand as stock and implement measures that consider the characteristics of stock. This is be-
31 cause the unmet demand for gasoline (or at least a portion of it) is stock that carries over to the

1 following day and not flow that is reset daily. In order to carry out the national-scale gasoline
2 shipment by utilizing these types of top-down measures, it is essential: (i) to understand the full
3 extent of the gasoline shortages that occurred after the Great East Japan Earthquake; and (ii) to
4 quantitatively analyze to what extent the gasoline shortages could have been feasibly reduced by
5 such national-scale gasoline shipment.

6 This study thus examines whether if or not such a national scale gasoline shipment strategy
7 could mitigate the gasoline shortages and consequent economic losses in the Tohoku region.
8 More specifically, we first estimate latent demand for gasoline in each municipality and the
9 capacity to accept inbound shipments at each port, using data on gasoline distributed in the
10 Tohoku region before and after the earthquake. Based on this estimation, we propose feasible
11 gasoline shipment strategies, each of which is to increase the amount of gasoline shipped into the
12 Japan Sea coastal ports (by redirecting supply from other areas) for a certain duration, as soon as
13 these ports resume operating. In order to analyze the gap between gasoline supply and demand
14 under these gasoline shipment strategies, we then propose a method that utilize cumulative curves
15 to represent unmet demand as stock. Subsequently, changes in the demand-supply gap caused by
16 the increases in the amount of gasoline shipped into the Japan Sea coastal ports is quantitatively
17 evaluated, using a model introduced by Akamatsu et al. (2013) that estimates the time-space
18 distribution of unmet demand. Finally, using these results, we estimate the economic effects
19 gained by mitigating the gasoline shortages (i.e., the reduction in the economic losses) and the
20 additional costs required for increased land transportation of gasoline. These estimations clarify
21 that the economic effect reach hundreds of billions of yen, although the additional cost required
22 to transport a large quantity of gasoline overland at an earlier stage is only hundreds of millions
23 of yen.

24 The remainder of this paper is organized as follows: Section 2 provides an overview of the
25 extent to which the gasoline supply system in the Tohoku region was compromised because of
26 the Great East Japan Earthquake and then describes the data used in the subsequent analysis.
27 Based on this data, Section 3 explains the growth in the size of the gap between the gasoline
28 supply and demand in the Tohoku region after the earthquake. In the next three sections, we
29 estimate the extent to which an appropriate shipping strategy improves the gap between gasoline
30 supply and demand and, in turn, the extent to which an improved demand-supply gap would have
31 reduced the economic loss. Specifically, an estimation model is formulated in Section 4. Section

1 5 describes the method for analyzing the shipping strategies. Finally, Section 6 estimates the
2 effects and costs of each shipping strategy. Section 7 presents concluding remarks. This study
3 takes the position of fully using existing infrastructure (e.g., the capacity of oil terminals and
4 road networks), because optimizing the contingent operation is necessary to address the situation
5 that arises after a disaster before the long-term implementation of advanced measures, such as
6 increasing gasoline storage facilities and earthquake-proofing key roads, is an option.

7 **2. Background**

8 *2.1. Outline of Fuel Transportation in Japan*

9 We briefly explain the supply flow of petroleum products in Japan. First, crude oil is refined
10 in a refinery to create petroleum products. The supply flow from refineries to retailers such as
11 gas stations can be roughly grouped into two patterns. In the first pattern, tanker trucks deliver
12 products directly to gas stations and other retailers from the refinery. In the second pattern,
13 products travel through shipping hubs called oil terminals. In this scenario, the products are
14 transported to oil terminals from refineries mainly using tank ships. However, railroad tankers
15 are used when oil terminals are located inland, and tanker trucks are then used to ship the products
16 from oil terminals to gas stations.

17 *2.2. Damage to Japan's refineries*

18 The locations of refineries in Japan can be divided into five areas, as shown in Figure 1.
19 Among these areas, many refineries are concentrated in western Japan and the Kanto region. In
20 addition, there is only one refinery, Sendai Refinery, in the Tohoku region.

21 The damage sustained by oil refineries as a result of the Great East Japan Earthquake can be
22 briefly summarized as follows. First, the Sendai refinery, the only refinery in the Tohoku region,
23 was damaged, and its operation was suspended for an extended period. Otherwise, throughout
24 Japan, five refineries in the Kanto region suspended their operation because of the disaster. How-
25 ever, three out of those five sites resumed their operation within a few days after the earthquake,
26 because their damage was minimal. Ultimately, a total of three refineries in the Tohoku and
27 Kanto regions, accounting for approximately 13% of the total crude oil processing capacity in
28 Japan, were forced to suspend their operation over a long period because of the disaster.

29 Based on the damage situation previously described, the long-term refinery capacity loss was
30 limited and the refineries affected by the disaster were not the root cause of the petroleum product

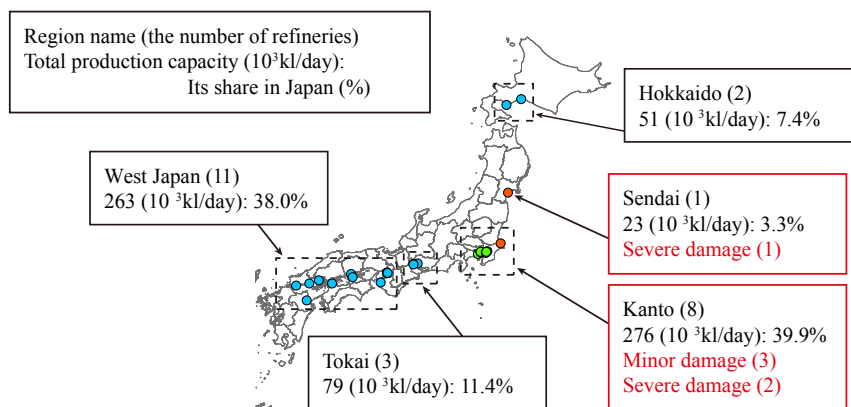


Figure 1: Refineries in Japan and their damage. Blue: no damage, green: minor damage, red: severe damage

1 shortages. Prior to the earthquake, Japan had excess refining capacities because of declining
 2 demand for petroleum products resulting from energy conservation and alternative energy usage,
 3 and the capacity utilization rate had been below 80% in the prior years^{6,7}. Thus, Japan would
 4 have been able to address the affected refineries and secure petroleum products by increasing the
 5 capacity utilization rate at the unaffected refineries. Presumably, the fundamental reason for the
 6 oil shortage after the Great East Japan Earthquake was the lack of changes in the amount and
 7 shipping patterns of oil in response to the spatial changes in the production areas caused by the
 8 disaster.

9 2.3. Damage to major oil terminals in Tohoku

10 Under typical circumstances, gas stations and other retailers in the Tohoku region receive
 11 direct supply of petroleum products by tanker trucks from Sendai Refinery or receive supply
 12 from other areas via oil terminals in the Tohoku region. The locations of the main oil terminals
 13 in the Tohoku region are shown in Figure 2. Oil terminals are often located in ports, where they
 14 can receive petroleum products from refineries by ship. Regarding oil terminals that are located
 15 inland such as P-5 and P-2, petroleum products are shipped from refineries in other areas using
 16 railroads. Because direct supply from a refinery became unavailable in the Tohoku region after
 17 the earthquake because of the damage at Sendai Refinery, all necessary petroleum products had
 18 to be transported from refineries in other areas.

19 The damage to the oil terminals in the Tohoku region caused by the Great East Japan Earth-
 20 quake is summarized as follows. Figure 2 shows that according to the date inbound shipments

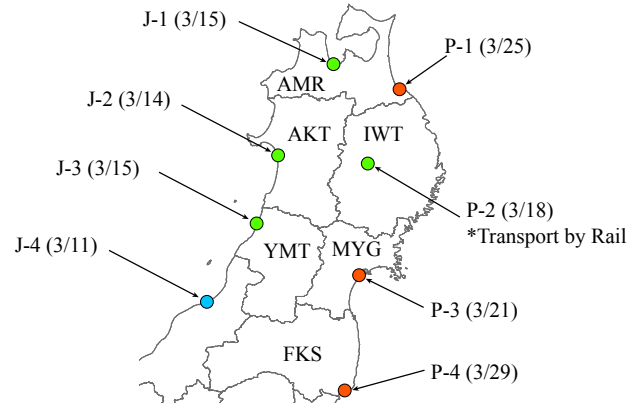


Figure 2: Major oil terminals in Tohoku region and their resumption date. Blue: no damage, green: resumed within a week, red: resumed later. AMR: Aomori, AKT: Akita, IWT: Iwate, YMT: Yamagata, MYG: Miyagi, FKS: Fukushima.

1 were resumed, every oil terminal except for J-4 in the Tohoku region became temporarily unable
 2 to receive petroleum products after the earthquake. During this period, transporting products
 3 from Niigata and other areas using tanker trucks was the only option. However, given the capac-
 4 ity constraints and the number of tanker trucks⁴, assuming they were able to transport a limited
 5 amount is natural. Oil terminals J-1, J-2, and J-3, which were adjacent to a Japan Sea coastal
 6 port, resumed inbound shipments in 3 to 4 days after the earthquake. Because of the damage, at
 7 least 10 days were required to resume inbound shipments for the oil terminals adjacent to ports
 8 on the Pacific coast, such as P-1, P-3, and P-4. In other words, there was a period in which the
 9 only means of supplying petroleum products to the Pacific coast was to forward them from Japan
 10 Sea coastal oil terminals.

11 2.4. Available Data

12 In Section 3, we use sales and shipping data on petroleum products to understand the shipping
 13 situations and the gap between supply and demand. First, the petroleum product sales data
 14 indicate the amount of petroleum products sold each month to consumers at gas stations and
 15 other retailers by prefecture, which is a section of the natural resources and energy statistics
 16 Ministry of Economy and Industry (2011) compiled by the Ministry of Economy, Trade, and
 17 Industry (METI). Next, the petroleum product shipping data indicate detailed origin–destination
 18 transportation by ship. This data indicate the date, volume, and classes of petroleum products
 19 shipped by oil tankers to the ports in the Tohoku region from refineries in other areas.

20 In this paper, we define gasoline—a fuel for transportation and general household use—as

Table 1: Sales volume of gasoline in March: Comparison between 2010 and 2011 (10³kL)

	Aomori	Iwate	Miyagi	Yamagata	Akita	Total
[A] 2010	36	37	81	32	29	214
[B] 2011	33	27	39	28	23	150
[B]/[A](%)	90	72	48	87	82	70

1 a class of petroleum products for analysis. In addition, we analyze five Tohoku prefectures
 2 excluding Fukushima (Aomori, Iwate, Miyagi, Akita, and Yamagata). Fukushima Prefecture
 3 is excluded because many people traveled because of the impact of the nuclear accident, and
 4 estimating the demand for gasoline in that area after the earthquake is difficult.

5 **3. Demand-Supply Gaps of Gasoline in Tohoku Region after The Earthquake**

6 *3.1. Volume of Gasoline Sales in the Tohoku Region*

7 We first examine the impact of the Great East Japan Earthquake by comparing March 2011
 8 sales of gasoline with March 2010 sales. Focusing on the portion of March sales recorded after
 9 the disaster (March 11–31), the results are as shown in Table 1. In the table, [B] denotes estimated
 10 sales from March 11–31, 2011, while [A] denotes estimated sales for the same period in 2010.
 11 From Table 1, it can be observed that March sales volumes were down in all five prefectures
 12 following the earthquake. Total sales of gasoline throughout the Tohoku region had fallen to
 13 approximately 70% of the previous year’s sales, indicating that the situation in post-disaster
 14 Tohoku was extremely serious. Sales in Miyagi Prefecture on the Pacific coast were particularly
 15 low, at less than 50% of the previous year’s figure.

16 In explaining the dramatic decrease in sales volumes, it may be possible that consumer de-
 17 mand for oil declined as a result of damage to cars, the psychological impact of the disaster,
 18 or other factors. Yet it is difficult to imagine that these factors alone could have caused such
 19 dramatic changes. It would be more natural instead to suppose that supplies were insufficient in
 20 these regions because of damage to supply facilities, and as a result of the limited supply, the
 21 volume of demand expected under normal circumstances failed to materialize. Or, to express it
 22 another way: Sales volume = Supply volume < Volume of demand under normal circumstances.
 23 This interpretation is supported by the fact that the drops in sales volumes were relatively small
 24 in Akita and Aomori Prefectures, which suffered only minor damage to oil terminals and other
 25 oil supply facilities. This will be discussed in more depth in 3.2 and 3.3.

1 *3.2. Volume of Gasoline Shipments to the Tohoku Region*

2 We then examine the pattern of shipments of gasoline from oil refineries nationwide to oil
3 terminals in the Tohoku region following the earthquake by using port outbound and inbound
4 shipment data. In addition, it examines how that pattern changed over time.

5 *3.2.1. Volume of outbound shipments from ports in other regions*

6 Table 2 lists the volumes of outbound shipments of gasoline from refineries (ports) in other
7 regions to the Tohoku region within a month before and after the earthquake. The table indicates
8 that the volume and patterns of outbound shipments of gasoline significantly changed after the
9 earthquake. First, shipments of gasoline sharply dropped following the earthquake. Second, the
10 volume of outbound shipments from the Kanto region, which accounted for more than half of
11 the outbound shipments before the earthquake, dropped to approximately one third. This can
12 be attributed to the severe damage sustained by oil refineries on the Pacific coast in the Kanto
13 region. Third, the volumes of outbound shipments from the Hokkaido, Tokai, and Western Japan
14 regions rose after the earthquake. Thus, the decline in outbound shipments from the Kanto region
15 may have been compensated to some degree by an increase in outbound shipments from these
16 regions. In particular, there was a marked increase in shipments from the Hokkaido region,
17 whereas the increase from the other regions was relatively small. This implies the surprising fact
18 that the press conference convened by METI on March 17, 2011 and the subsequent press release
19 issued by METI were totally inconsistent with the actual situation: the Ministry announced that
20 approximately 20,000 kL per day of gasoline and related products, which covers the majority
21 of the amount required in the Tohoku region, would be shipped to the Tohoku region from oil
22 refineries in Western Japan; however, as Table 2 illustrates, the volumes of gasoline shipped from
23 Western Japan in the month following the earthquake was less than one-tenth of that stated in the
24 government's announcement. This fact apparently indicates that there were coordination failures
25 between METI and the private oil companies that actually undertook the gasoline shipment plan.

26 Changes in outbound shipment volumes over time can be seen from Figure 3, which shows
27 the weekly volumes of outbound gasoline shipments from the country's oil refineries to oil ter-
28 minals in the Tohoku region during the five-week period following the earthquake. First, it is
29 evident from Figure 3 that the volume of outbound shipments was particularly low in the two
30 weeks following the earthquake compared with normal demand for gasoline in the Tohoku re-
31 gion. Only 20% of the normal weekly demand (red dashed line in the figure) was shipped in the

Table 2: Comparison of outbound shipment volumes of gasoline from ports in other regions one month before and after the earthquake (10^3kL)

	Hokkaido	Kanto	Tokai	West Japan	Others	Total
Before	84	145	7	9	12	257
After	132	53	15	19	1	219
Increase	48	-92	8	10	-11	-38

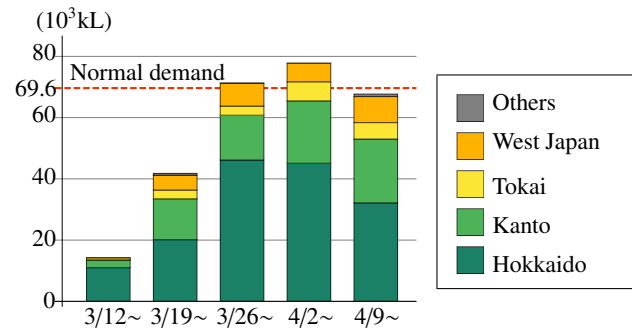


Figure 3: Changes in weekly volume of outbound gasoline shipments from ports in other regions following the earthquake.

1 first week and about 60% in the second week. Second, the volume of shipments recovered to
 2 levels exceeding normal demand in the third and fourth weeks following the earthquake. This
 3 recovery from the disaster in the third and fourth weeks was mainly attributable to increased
 4 shipments from the Hokkaido region. There were also shipments from the West Japan region
 5 from the second week following the disaster, but their contributions were modest compared with
 6 the increase from the Hokkaido region. Third, the volume of shipments from the Kanto region
 7 witnessed continuous growth. However, as we have seen in Table 2, the volume of outbound
 8 shipments in the first month following the earthquake declined significantly from standard levels
 9 before its incidence.

10 3.2.2. Volume of inbound shipments to ports in the Tohoku region

11 Table 3 compares the volumes of inbound shipments at each oil terminal in the Tohoku region
 12 during the month before and after the earthquake. First, they illustrate that the volume of inbound
 13 shipments sharply dropped at ports P-1 and P-3 on the Pacific Ocean that had been damaged by
 14 the tsunami. In the month before the earthquake, these two ports accounted for approximately
 15 half of the volume of inbound shipments of gasoline products to the Tohoku region, while in
 16 the month after the earthquake, they accounted for only about one-fifth of the total. Second, the

Table 3: Comparison of inbound shipment volumes of gasoline to ports in the Tohoku Region one month before and after the earthquake (10³kL)

	J-1 (Aomori)	J-2 (Akita)	J-3 (Sakata)	P-1 (Hachinohe)	P-3 (Sendai-Shiogama)	Total
Before	52	45	18	54	89	257
After	51	72	19	16	62	219
Increase	-1	27	1	-38	-27	-38

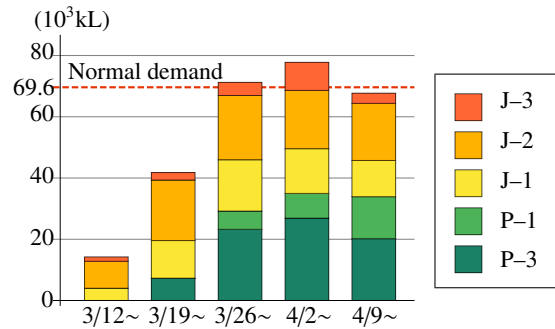


Figure 4: Changes in weekly volume of inbound gasoline shipments to the Tohoku Region following the earthquake.

1 volume of inbound shipments of gasoline increased at ports J-1, J-2 and J-3 on the Japan Sea.
 2 However, these increases were insufficient to compensate for the deficit at the ports on the Pacific
 3 Ocean. Third, at the port P-3 (Sendai-Shiogama), where inbound shipments were interrupted for
 4 approximately ten days after the earthquake, shipments of gasoline significantly decreased.

5 Figure 4 shows the weekly volume of inbound gasoline shipments received at oil terminals in
 6 the Tohoku region during the five-week period following the earthquake. We see from this figure
 7 that the Pacific ports of P-1 and P-3 were barely usable in the two weeks following the earth-
 8 quake, and only the ports of J-1, J-2 and J-3 on the Sea of Japan were operational. In particular,
 9 the port of J-2 (Akita) accounted for approximately half the volume of inbound shipments in the
 10 two weeks following the earthquake, playing a central role in the matter. However, the increase
 11 in inbound shipment volumes at these ports in the Sea of Japan was insufficient when considering
 12 the Tohoku region as a whole, and there was a clear lack of supply. As the ports of P-1 and P-3
 13 on the Pacific Ocean side were restored during the second to fourth weeks, inbound shipment
 14 volumes there gradually increased. This enabled the receipt of supplies corresponding to normal
 15 demand levels. Ultimately, however, the supply of gasoline to the entire Tohoku region remained
 16 insufficient until the Pacific ports of P-1 and P-3 had been fully restored and made operational.

1 It is worthwhile to note here that care must be exercised when Figure 4 (or Figure 3) is
2 employed to determine when the oil shortage in the Tohoku region was resolved. Figure 4 (or
3 Figure 3) shows that outbound shipment volumes increased from the third week after the earth-
4 quake and, at a glance, give the impression that the oil shortage had been resolved. However,
5 it should be noted that consumer demand at this stage, which could not be satisfied in the first
6 and second weeks, had been deferred (i.e., “standby demand” remained). Although supply in
7 the third week following the earthquake could match the demand arising from newly emergent
8 economic flows in that week, the quantities were insufficient to satisfy standby demand. This
9 point will be discussed in detail in the following section 3.3.

10 3.3. Aggregate Demand–Supply Gap in the Tohoku Region

11 This section analyzes the volume of gasoline stocks released, the demand–supply gap, and
12 unrealized demand aggregated in the Tohoku region as a whole (by combining sales and transport
13 data for gasoline). This analysis, based on the cumulative curves, demonstrates why oil shortages
14 continued for almost a month after the earthquake.

15 To analyze the extent to which demand was met throughout the Tohoku region following
16 the earthquake, we define “demand” and “supply” as follows. The daily sales volume in the
17 same month of the previous year is considered as the standard for daily consumption (i.e., the
18 amount consumed when supply is adequate). This is referred to as latent daily demand, and its
19 cumulative amount is defined as cumulative latent demand. We then define supply as the volume
20 of inbound shipments (by ship/rail) to oil terminals plus the volume of stock releases.

The volume of stock releases for the Tohoku region as a whole may be estimated from the following identity:

$$\text{Cumulative sales volume} = \text{cumulative volume of inbound shipments} \quad (1)$$

$$+ \text{volume of stock releases.} \quad (2)$$

21 The left-hand side of the equation (i.e., the cumulative sales volume) can be calculated from sales
22 volumes in March following the earthquake (i.e., the sum of the sales volumes per prefecture
23 shown in Table 1). Since the cumulative volume of inbound shipments on the right hand side of
24 the equation also can be calculated from the data for gasoline transported (i.e., the data shown in
25 Figure 4), we obtain the volume of stock releases. This results in stock releases of approximately
26 14 (10³) kL for the Tohoku region from the day immediately after the earthquake until March 31,

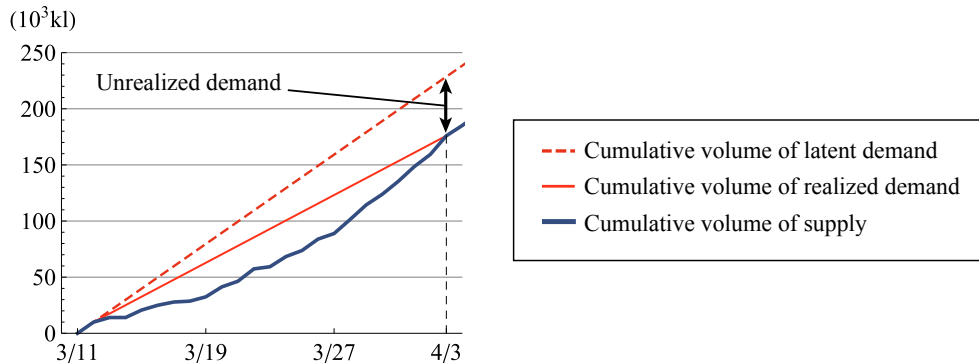


Figure 5: Cumulative demand and unrealized demand for gasoline

1 2011. Converted to actual sales per day in a normal period (March, 2010), this was approximately
 2 1.4 days' worth of stock releases. Thus, the volume of supply in the Tohoku region was assumed
 3 to be the volume of inbound shipments to its oil terminals plus 1.4 days' worth of stock releases
 4 in the following analysis.

5 Based on the estimates of demand and supply thus obtained, we analyze the difference be-
 6 tween them ("demand–supply gap"). Figure 5 portrays the cumulative volumes of latent demand
 7 (red dashed line), inbound shipments (blue dotted line), and supply (solid blue line: cumulative
 8 volume of inbound shipments + 1.4 days' worth of stock). This figure assumes that, in the two
 9 days following the earthquake, inventories were supplied according to the latent demand, and
 10 that supply was equal to the volume of inbound shipments once stocks had been depleted. Figure
 11 5 demonstrates that the cumulative curve for latent demand continually remained above that for
 12 supply, implying that the supply would have continued to be insufficient if the latent demand
 13 had been fulfilled. However, in reality, waiting lines at service stations and depleted inventories
 14 were resolved by about mid-April 2011 at the latest.13). This suggests that consumers resigned
 15 themselves to not obtaining a portion of the latent demand. This paper defines this demand that
 16 was abandoned by consumers as unrealized demand.

17 Considering the existence of unrealized demand, the volume of consumer demand that was
 18 fulfilled would have been less than the cumulative volume of latent demand. The cumulative
 19 volume of realized demand (solid red line) is included in Figure 5. The assumption, in this case,
 20 is that supply shortages were resolved by April 3, 2011 and daily demand was normalized. In this
 21 case, the volume of demand prior to the elimination of supply shortages was approximately 66%

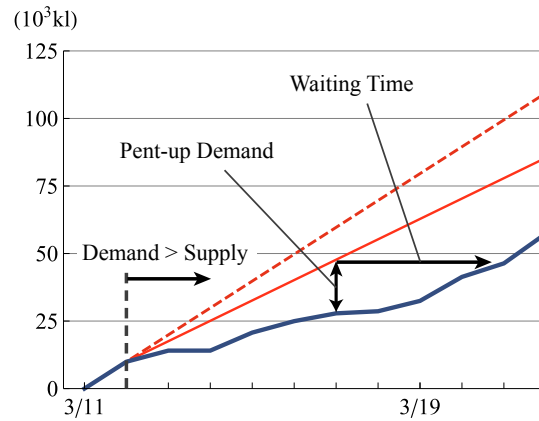


Figure 6: Change in pent-up demand (waiting lines)

1 of the volume of latent demand, and the difference between the cumulative volumes of realized
 2 demand and latent demand is the volume of unrealized demand, which was approximately 64
 3 (10^3 kL) when supply shortages are considered to have been resolved (April 3, 2011). Converted
 4 to the volume of latent daily demand, this is approximately 6.4 days' worth. This implies that
 5 a massive economic loss was sustained as a result of the Great East Japan Earthquake, which
 6 eliminated social and economic activities corresponding to as much as 6.4 days' worth of demand
 7 in gasoline terms.

8 Figure 6 focuses on a part of the period covered in Figure 5 (March 11–20). It examines the
 9 gap between the cumulative volumes of demand and supply. Specifically, the vertical distance
 10 between the cumulative demand and supply curves represents the volume of pent-up demand
 11 (waiting lines), while the horizontal distance indicates the waiting time needed to purchase gaso-
 12 line. The waiting lines that formed at individual service stations can be described as a manifesta-
 13 tion of this aggregate pent-up demand. It should be noted that even if the volume of daily supply
 14 (a flow variable) matched or exceeded that of daily demand, pent-up demand (a stock variable)
 15 would not instantly disappear. In fact, as we have seen in Section 3.2, the volume of daily supply
 16 did meet that of daily demand around March 26, 2011, but a further week was required to resolve
 17 the pent-up demand that had accumulated through supply shortages until that point (Figure 5).
 18 This is fundamentally why there were protracted shortages of gasoline throughout the Tohoku
 19 region.

20 As the above analysis demonstrates, the measure essential to relieving the shortage of gaso-

1 line in the Tohoku region was to ease supply constraints to the maximum possible degree. First,
2 adequate land transportation from the Japan Sea to the Pacific Ocean should have been organized
3 immediately after the earthquake to avoid generating pent-up demand. Next, a more aggressive
4 supply of gasoline should have been arranged to reduce accumulated pent-up demand once in-
5 bound shipments resumed at the port of P-3 (Sendai-Shiogama) on March 21, 2011. Specifically,
6 the volume of daily supply should have been consistently higher than that of normal daily de-
7 mand. If such a plan had been executed, pent-up demand could have been resolved sooner and a
8 protracted shortage of gasoline would not have occurred.

9 It is worthwhile to note the actual measures that were taken by the government and the
10 Petroleum Association of Japan. For more than a month after the earthquake, they pursued public
11 relations activities in the Tohoku region, imploring consumers to refrain from “non-essential and
12 non-urgent purchases of gasoline.” As the analysis in this section demonstrates, however, the de-
13 mand revealed in the Tohoku region following the earthquake represented standard demand that
14 had been greatly suppressed through supply constraints. Thus, most of the actual demand in the
15 Tohoku region following the earthquake was not for “non-essential and non-urgent purchases.”
16 Therefore, the public relations activities calling for restraint in demand of gasoline, instead of
17 providing an adequate level of supply, can be considered as having a high risk of curbing neces-
18 sary economic activity. That is, this policy aggravated the massive economic loss caused by the
19 inhibition of social and economic activity due to vanishing demand.

20 **4. The Model for Estimating Time-Space Distribution of Demand-Supply Gap**

21 In this section, we provide an overview of the Akamatsu et al. (2013) model, which describes
22 the development of the gap between demand and supply in each municipality at a discrete point
23 in time. This model is composed of two sub-models: an inter-temporal demand dynamics model
24 and a spatial distribution (supply) model. The first model describes how the unmet demand
25 in each municipality changes over each point in time. The second model describes how the
26 gasoline brought into each oil terminal is distributed to each municipality within a given time
27 (i.e., the supply flow to each municipality at a given point in time).

28 Setting the day of the earthquake (March 11) as $t = 0$ and the point in time when the gasoline
29 demand and supply returned to normal as T , we consider a set of discrete periods in increments
30 of 1 day, such that $T := \{1, 2, \dots, T\}$. The set of oil terminals (the origin) and the set of munici-

1 palities (the destination) within the analysis areas are represented by O and D , respectively.

Within this framework, the inter-temporal dynamics of unmet demand across time is written as the following difference equation, where the unmet demand at the end of time $t \in T$ in municipality $j \in D$ is expressed as $X_j(t)$:

$$X_j(t) = (1 - \beta\Delta t)X_j(t-1) + \{r_j(t) - s_j(t)\}\Delta t, \quad t = 1, 2, \dots, T. \quad X_j(0) = 0. \quad (3)$$

2 Here, $r_j(t)$ is latent demand for gasoline per unit of time, and $s_j(t)$ is the amount of gasoline
 3 supplied per unit of time. β is a constant that represents the reduction rate of unmet demand
 4 for each point in time, called the disappearance rate. In equation (3), $\{r_j(t) : t \in T\}$ is a model
 5 input, and β is a parameter, which are separately estimated using the method described in the
 6 next section. $\{s_j(t) : t \in T\}$ is an endogenous variable determined using the spatial distribution
 7 (supply) model described later.

The spatial distribution (supply) model describes the allocation of the gasoline brought into each oil terminal in the Tohoku region to each municipality (i.e., the supply flow in each municipality in a given time). The amount of gasoline brought into oil terminal $i \in O$ per unit of time as of time $t \in T$ (i.e., the amount gasoline available to be supplied) is denoted by $p_i(t)$. Revealed gasoline demand per unit of time in municipality $j \in D$ at time t is denoted as $q_j(t)$ and defined as the sum of: a) the unmet demand at the beginning of time t (i.e., the unmet demand at time $t-1$ minus the reduced demand) converted into the unit of flow and b) the latent demand flow that surfaces in a given time:

$$q_j(t) := \frac{1 - \beta\Delta t}{\Delta t}X_j(t-1) + r_j(t)$$

The cost required to transport one unit of gasoline from oil terminal $i \in O$ to municipality $j \in D$ is denoted as a constant $c_{i,j}$, and the amount of gasoline transported per unit of time between this origin and destination pair in time $t \in T$ is denoted as $x_{i,j}(t)$. We assume that the amount of transported gasoline $\mathbf{x}(t) := \{x_{i,j}(t) : (i, j) \in O \times D\}$ and the unmet demand at the end of the period $\mathbf{X}(t) := \{X_j(t) : j \in D\}$ are determined to minimize the total shipping costs while smoothing the disparity in the demand-supply gap among municipalities. This is formulated as the following

convex programming problem:

$$[\text{P}] \quad \min_{\mathbf{x}(t)} \left\{ \sum_{i,j} c_{i,j} x_{i,j}(t) + \theta f[\mathbf{x}(t), \mathbf{X}(t)] \left| \begin{array}{l} \sum_{j \in D} x_{i,j}(t) = p_i(t) \quad \forall i \in O, \\ \sum_{i \in O} x_{i,j}(t) \leq q_j(t) \quad \forall j \in D, \\ x_{i,j}(t) \geq 0 \quad \forall (i, j) \in O \times D \end{array} \right. \right\}$$

The first term of the objective function in this problem represents the total shipping cost. In the second term, $f[\mathbf{x}(t), \mathbf{X}(t)]$ is a convex function representing the smoothness of the demand-supply at time t . The given constant θ , which represents the importance of smoothing the function, is called the smoothing parameter. The first constraint condition is that the amount of gasoline shipped from each oil terminal matches the amount of gasoline supply, and the second constraint condition is that the amount of gasoline transported to each municipality does not exceed the demand. Using the gasoline shipping flow $\mathbf{x}(t)$ at time t , the gasoline supply flow to municipality j in a given time can be written as follows:

$$s_j(t) := \sum_{i \in O} x_{i,j}(t)$$

1 The relationship between these two sub-models is summarized in Figure 7. The figure shows
2 how unmet demand in municipality $j \in D$ are determined during the period between $t - 1$ and t .
3 First, we assume that the unmet demand $X_j(t - 1)$ at the end of time $t - 1$ is a given condition.
4 Furthermore, $(1 - \beta\Delta t)X_j(t - 1)$ is demand carried over to the beginning of time t , which is
5 added to the new latent demand in time t , $r_j(t)\Delta t$, as the revealed demand in time t , denoted as
6 $q(t)\Delta t$. The gasoline supply flow (sales) to each municipality in time t , $\mathbf{s}(t) := \{s_j(t) : j \in D\}$,
7 is determined based on the spatial distribution (supply) model that includes the revealed demand
8 flow $\mathbf{q}(t) := \{q_j(t) : j \in D\}$ and shipped-in gasoline flow $\mathbf{p}(t) := \{p_i(t) : i \in O\}$ as given
9 conditions. Finally, revealed demand minus the amount of gasoline supply obtained during time
10 t (i.e., resolved demand), $s_j(t)\Delta t$, becomes unmet demand $X_j(t)$ at the end of time t .

11 Using the described model and calculating the sequences $(\mathbf{q}(0), \mathbf{s}(0)), (\mathbf{q}(1), \mathbf{s}(1)), \dots, (\mathbf{q}(T), \mathbf{s}(T))$
12 for the revealed demand for gasoline and the supply flow in each municipality, a cumulative chart
13 of gasoline supply and demand in each municipality can be created. First, the sequences of re-
14 vealed demand and supply flow can be solved using the following steps.

15 **Step 0** : Set the unmet demand in all municipalities $j \in D$ on the day of the earthquake as
16 $X_j(0) = 0$. Set the time as $t := 1$.

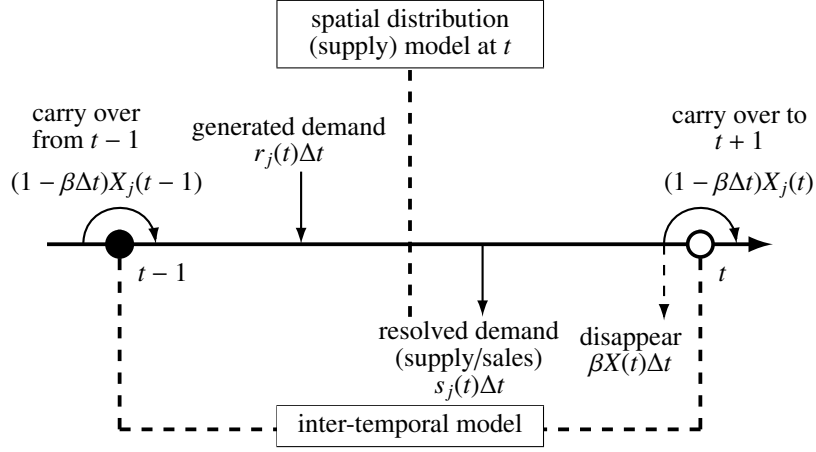


Figure 7: Relationship between the inter-temporal demand dynamics and the spatial distribution model

Step 1 : Using $X_j(t-1)$, that is, the unmet demand at the end of time $t-1$, and $r_j(t)$, that is, the new latent demand in time t , as given conditions, set the revealed demand flow in time t as

$$q_j(t) := \frac{1 - \beta\Delta t}{\Delta t} X_j(t-1) + r_j(t)$$

1 **Step 2** : Using revealed demand $q(t)$ in each municipality, the volume of supply $p(t)$ at each oil
 2 terminal, and the cost of transportation $\{c_{i,j}\}$ as given conditions, solve the problem [P] for
 3 transported gasoline flow $x(t)$.

Step 3 : Define the gasoline sales flow in municipality j in time t as

$$s_j(t) := \sum_{i \in O} x_{i,j}(t)$$

4 and the unmet demand at the end of time t as $X_j(t) := \{q_j(t) - s_j(t)\} \Delta t$.

Step 4 : Terminate if $t = T$. Otherwise, return to **Step 1** and set the time to $t := t + 1$. Using the sequences of latent demand flow $r_j(t)$, revealed demand flow $q_j(t)$, and supply flow $s_j(t)$ for municipality $j \in D$, each of cumulative latent demand $R_j(t)$, cumulative revealed demand $Q_j(t)$, and cumulative supply $S_j(t)$ can be solved as follows:

$$R_j(t) := \sum_{\tau=0}^t r_j(\tau)\Delta t, \quad Q_j(t) := \sum_{\tau=0}^t q_j(\tau)\Delta t, \quad S_j(t) := \sum_{\tau=0}^t s_j(\tau)\Delta t$$

1 5. Procedures for Analyzing Distribution Strategies

2 In this section, we describe the procedure for using the model from the previous section
3 to analyze the change in the demand-supply gap in each municipality under a given shipping
4 strategy. Section 5.1 shows the procedure for estimating the extent of the gasoline shortages that
5 occurred after the Great East Earthquake as a base case. From the facts found in the base case
6 analyses, Section 5.2 proposed two feasible national-scale gasoline shipment strategies as well
7 as procedures to analyze to what extent the gasoline shortages could have been reduced.

8 5.1. Base Case

9 The actual state of gasoline allocation under the shipping strategy that was executed is used
10 as the base case. This base case is derived as follows: First, we estimate the dataset and param-
11 eters required as the model inputs. This procedure can be written as follows: 1) Estimate the
12 transportation cost per unit of gasoline $c_{i,j}$ based on the shortest distance from each oil termi-
13 nal to each municipality measured using a Geographical Information System (GIS). 2) Estimate
14 $r_j(t)$, the demand flow in each municipality in time t , based on pre-earthquake monthly sales
15 volume by prefecture between March and April 2010. 3) Estimate $p_i(t)$, the volume of supply
16 in each oil terminal during time t , based on the daily volume of gasoline brought into each port
17 between March and April 2011. 4) Estimate the disappearance rate as $\beta = 0.106$ based on the
18 date when the gasoline shortages throughout the Tohoku region were considered resolved (April
19 3, according to Akamatsu et al. (2013)). 5) Estimate the smoothing parameter as $\theta = 20.56$ to
20 minimize the disparity between the monthly sales in March 2011 by prefecture, Z_k , and the sales
21 volume $S_k := \sum_{t \in \tau} \sum_{j \in D_k} s_j(t)$ in each prefecture $k \in K$ during the corresponding time period
22 τ . Here, K is the set of prefectures in the Tohoku region and D_k is the set of municipalities in
23 prefecture k .

24 Next, use the model inputs $\{c_{ij}\}$, $\{r_j(t)\}$, $\{p_i(t)\}$ and the model parameters β and θ obtained thus
25 far and assign them to the model from the previous section in order to calculate the cumulative
26 revealed demand $\{Q_j(t)\}$ and the cumulative supply $\{S_j(t)\}$ in each municipality.

27 Using these, calculate the demand-supply gap in each municipality at each point in time or
28 $\{S_j(t)/Q_j(t)\}$, the ratio of cumulative supply to cumulative revealed demand up to each point in
29 time.

1 5.2. Distribution Strategies

2 The daily volume of gasoline shipped into the Japan Sea coastal ports (J1, J2, and J3) es-
3 timated in the base case is tabulated and shown in Figure 8. In this figure, the following three
4 points are observed: 1) The volume of gasoline shipped into the ports on the coast of the Japan
5 Sea largely varies by day, 2) the shipments resumed on March 15, 4 days after the earthquake
6 (point A in the figure), and 3) 23,314 (kL), or 1.93 times the normal volume of gasoline (i.e., the
7 average volume in the month prior to the earthquake) was brought into the region at that time.
8 Based on these facts, the following are assumed in our analysis: It was possible to successively
9 ship a total of 23,314 (kL) gasoline (equivalent to the amount of gasoline shipped into the three
10 Japan Sea coastal ports on March 15, when $t = 4$) into the three Japan Sea coastal ports after
11 March 15 ($t = 4$) and allocate it to the municipalities in the Tohoku region.

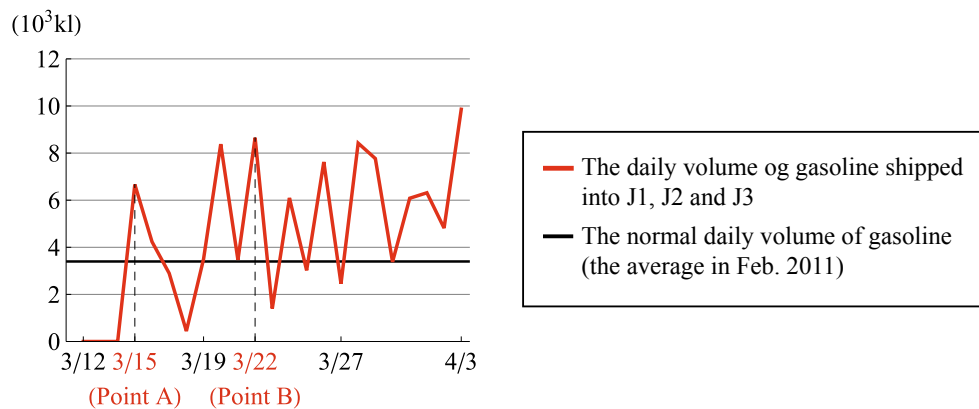


Figure 8: The ship-in volume of J1, J2 and J3 after the earthquake

12 The validity of this assumption is supported by the following three observations: First, the
13 daily capacity for accepting shipments at these three ports is larger than the amount brought in on
14 March 15. Second, the lead-time at oil terminals is sufficiently short for the terminals to accept
15 in succession the amount shipped into these three ports on March 15. Finally, as mentioned in
16 Section 1, the refinery capacity in the areas not directly affected by the earthquake including
17 western Japan was sufficient. On the basis of this assumption, we propose the two following
18 strategies for eliminating the gasoline shortages at an early stage:

19 **Proposed Strategies**

20 **Strategy S (short):** Assuming the same amount of gasoline as that brought in on March 15

1 $(t = 4)$ and successively shipping it to the three Japan Sea coastal ports daily for 7 days from
2 March 15 $(t = 4)$ to March 22 $(t = 11; \mathcal{T}_S := \{4, 5, \dots, 11\})$.

3 **Strategy L (long):** Assuming the same amount of gasoline as that brought in on March 15
4 $(t = 4)$ and successively shipping it into the three Japan Sea coastal ports daily for the 14 days
5 from March 15 $(t = 4)$ to March 29 $(t = 18; \mathcal{T}_L := \{4, 5, \dots, 18\})$.

6 In the following discussion, \mathcal{T}_S and \mathcal{T}_L are referred to as the operational period. We estimate
7 the demand-supply gap under Strategies S and L using the procedure used in the base case. In
8 doing so, the values used in the base case are identical for the disappearance rate β , smoothing
9 parameter θ , and the amount shipped to each port $\{p_i(t)\}$ during the non-operational period. For
10 the amount shipped into the three Japan Sea coastal ports $O_J = \{J1, J2, J3\}$ during the operational
11 period, the amount shipped into those ports on March 15, $\{p_i(t = 11) : i \in O_J\}$, is used.

12 6. Analyses of Distribution Strategies

13 In this section, we estimate the economic effect as well as the additional shipping cost re-
14 quired under the proposed distribution strategies Strategies S and L, following the procedure
15 described in the previous section. The economic effects are defined as the economic loss that can
16 be reduced in comparison to the base case under the strategies. First, in Section 6.1, the effect
17 of each distribution strategy on the demand-supply gap for the entire Tohoku region is analyzed.
18 Next, in Section 6.2, the change in the demand-supply gap in each municipality created by each
19 distribution strategy is quantified and the total necessary shipping time is calculated. While the
20 former is used and latter is converged, the economic effect of each strategy and the additional cost
21 of shipping is estimated in Section 6.3. Here, we demonstrate that the cost is only in hundreds of
22 million yen, while the economic effect is in the order of hundreds of billion yen.

23 6.1. Changes in the Aggregated Demand-Supply Gap in the Entire Tohoku Region

24 Using the method described in Section 3.3, the effects of the distribution strategies S and L on
25 the demand-supply gap for the entire Tohoku region are analyzed. Figure 9 shows the cumulative
26 curves of gasoline demand and supply for the entire Tohoku region for the base case and for the
27 cases achieved using Strategies S and L. The red dotted line, red solid line, and blue solid line in
28 each diagram indicate cumulative latent demand $R(t) := \sum_{j \in D} R_j(t)$, cumulative revealed demand
29 $Q(t) := \sum_{j \in D} Q_j(t)$, and cumulative supply $S(t) := \sum_{j \in D} S_j(t)$, respectively.

1 Figure 9 reveal the effect of Strategies S and L on improving gasoline shortage from the fol-
 2 lowing three viewpoints: (1) reduced pent-up demand in each point in time, (2) early elimination
 3 of the demand-supply gap, and (3) reduced unrealized demand. First, we compare the pent-up
 4 demand $X(t) = R(t) - S(t)$ under each strategy to that in the base case. Figure 9 shows that a
 5 distribution strategy can further reduce pent-up demand at all points in time in comparison to
 6 the base case. Secondly, this difference has a significant impact on time τ , the point at which
 7 the gasoline shortages are resolved; $Q(\tau) = S(\tau)$. Specifically, although the gasoline shortages
 8 continued until April 3 in the base case and until April 2 under Strategy S, Strategy L reduces
 9 the time required to resolve gasoline shortages to March 27. Lastly, in order to evaluate the
 10 economic effects of such reduced pent-up demand and early resolution of the gasoline shortages,
 11 we compare $U(\tau) = R(\tau) - Q(\tau)$, that is, unrealized demand through the end of the analysis
 12 period. In the base case, 53,803 (kL) of gasoline demand disappeared. In contrast, the unrealized
 13 demand under Strategies S and L are 26,954 (kL) and 15,605 (kL), respectively. In other words,
 14 we can see that unrealized demand can be reduced from one-half to one-third by implementing
 15 either Strategy S or Strategy L.

Table 4: The volume of unrealized demand and the date when supply shortage are resolved

	Base Case	Strategy-S	Strategy-L
The volume of unrealized demand	53,803 (kL) (5.4 days)	26,954 (kL) (2.7 days)	15,605 (kL) (1.6 days)
The date of supply shortage resolved	4/3	4/2	3/27

16 6.2. Time-Space Distribution of Gasoline Shortage under Each Strategies

17 In this section, we analyze how the distribution strategies change the demand-supply gap by
 18 municipality and then determine the total shipping time required to execute the distribution.

19 First, we analyze the development of the time-space distribution of the demand-supply gap
 20 by using Figures 10 and 11. These maps of municipalities are color-coded based on the supply
 21 rate $S_j(t)/Q_j(t)$ at a given time. A higher supply rate indicates a smaller demand-supply gap.
 22 Figure 10 compares the demand-supply gap at three points in time in the first 10 days after the
 23 earthquake (i.e., March 15, 18, and 22) under Strategies S and L to the demand-supply gap in
 24 the base case. Because the amount of gasoline brought in is the same for Strategies S and L
 25 during this period, the distribution of the demand-supply gap also matches. The results of the

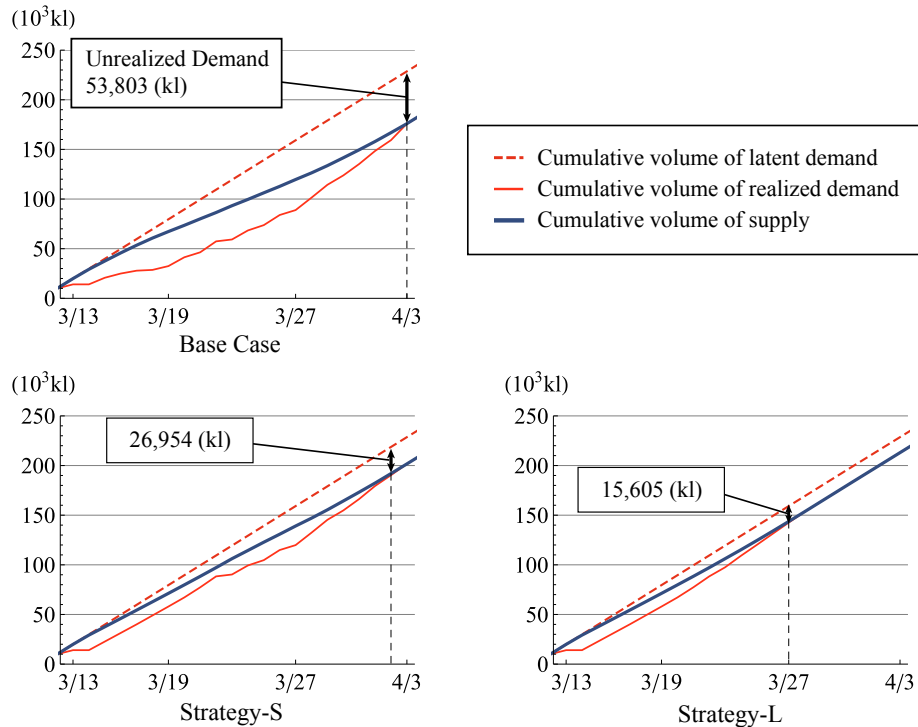


Figure 9: Cumulative latent demand, revealed demand and supply for gasoline under each strategies

1 base case indicate that (1) there were large scale gasoline shortages in the Pacific Ocean side
 2 and (2) although there were gasoline shortages in the regions by the Japan Sea, they were not as
 3 serious as those on the Pacific coast. Furthermore, we can see that the proposed strategies S and
 4 L- considerably reduced the demand-supply gap in areas on both coasts of the Pacific Ocean and
 5 the Japan Sea. Specifically, we see that the demand-supply gap is gradually eliminated eastward
 6 as the gasoline brought into the ports on the coast of the Japan Sea is transported longer distances
 7 over time.

8 Figure 11 shows the demand-supply gap at three points in time in the subsequent 10 days
 9 (i.e., March 25, March 29, and April 1). The results of the base case show that gasoline was not
 10 sufficiently distributed to many municipalities on the Pacific coast as of April 1, 3 weeks after the
 11 earthquake. The same is true under Strategy S: There are some municipalities on the Pacific coast
 12 where the gasoline is not sufficiently distributed even as of April 1. In contrast, under Strategy
 13 L, gasoline is promptly supplied to all municipalities, and the shortages are completely resolved
 14 as of March 29.

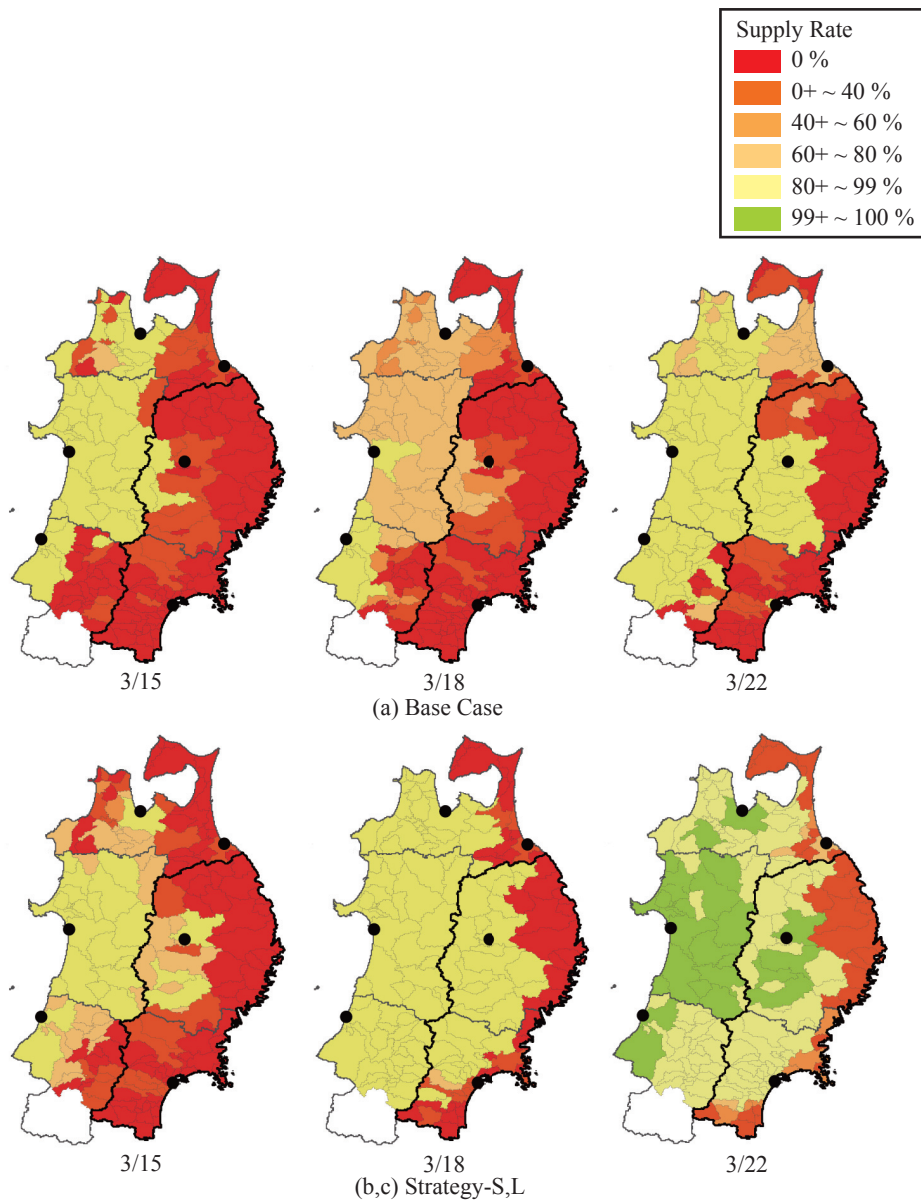


Figure 10: Spatial distribution of demand-supply gap per municipality (3/15, 3/18, 3/22)

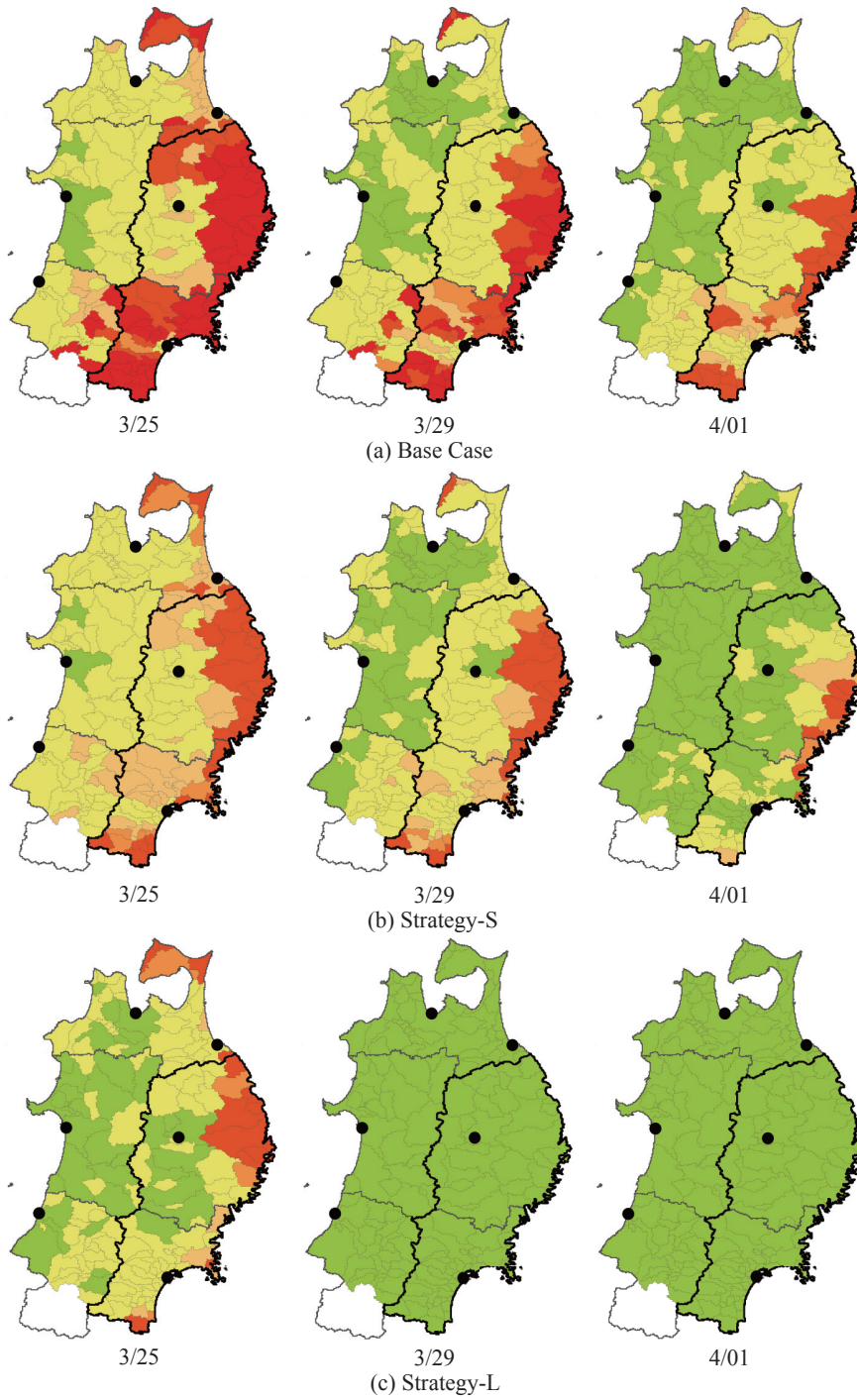


Figure 11: Spatial distribution of demand-supply gap per municipality (3/25, 3/29, 4/1)

1 Next, Figure 12 examines differences in the effect of national scale gasoline shipment on
 2 the elimination of the demand-supply gap between prefectures on the Pacific coast (Iwate and
 3 Miyagi) and those on the Japan Sea coast (Aomori, Akita and Yamagata). In the base case,
 4 enormous pent-up demand was accumulated in the areas on the Pacific coast, because almost
 5 no gasoline was supplied for 1 week after the earthquake. In contrast, although there was a
 6 temporary increase in the pent-up demand, it did not significantly accumulate in the areas on
 7 the coast of the Japan Sea. Comparing these cumulative curves to the ones under the proposed
 8 strategies, we can see that the three effects mentioned in Section 6.1— (1) reduced pent-up
 9 demand, (2) early elimination of the demand-supply gap, and (3) reduced unrealized demand
 10 — are evident in the areas on the Pacific coast.

11 Figure 13 shows the spatial distribution of unrealized demand by municipality—which has
 12 a particularly close relationship with economic loss. Here, the prefectures on the Pacific coast
 13 (Iwate and Miyagi) are enclosed with the thick black line. In the base case, the unrealized
 14 demand on the Pacific coast 43.5 (10³kL) is extremely high, which is 81% of the unrealized
 15 demand in Tohoku region, 53.9 (10³kL). This unrealized demand on the Pacific coast is reduced
 16 to 21 (10³kL) under Strategy S and to 12 (10³kL) under Strategy L, which are one-half and
 17 one-fourth of the base case, respectively.

Lastly, the total shipping time required to implement the distribution strategies is calculated.
 The cumulative total shipping time to accomplish the allocation pattern $\{x_{i,j}(\tau) : \tau \in [0, t]\}$
 through time $t \in T$ is defined by the following equation:

$$\Phi(t) = \sum_{\tau=0}^t \sum_{i,j} c_{i,j} x_{i,j}(\tau)$$

18 The total cumulative shipping time in the base case as well as that under each distribution strategy
 19 is shown in Figure 14. Clearly, it increases as the amount of gasoline distributed (i.e., the amount
 20 of gasoline brought into the ports). Section 6.3 translates the amount of unrealized demand and
 21 the total shipping time into yen to conduct cost-benefit analyses on the distribution strategies.

22 6.3. Cost-Benefit Analyses of Gasoline Distribution Strategies

23 In this section, we estimate the economic effects gained through the gasoline distribution
 24 strategies (i.e., the amount of reduction in the economic loss) and the cost of those strategies.
 25 Note that, this analysis doesn't intend to discuss accuracy of the estimation or the novelty and

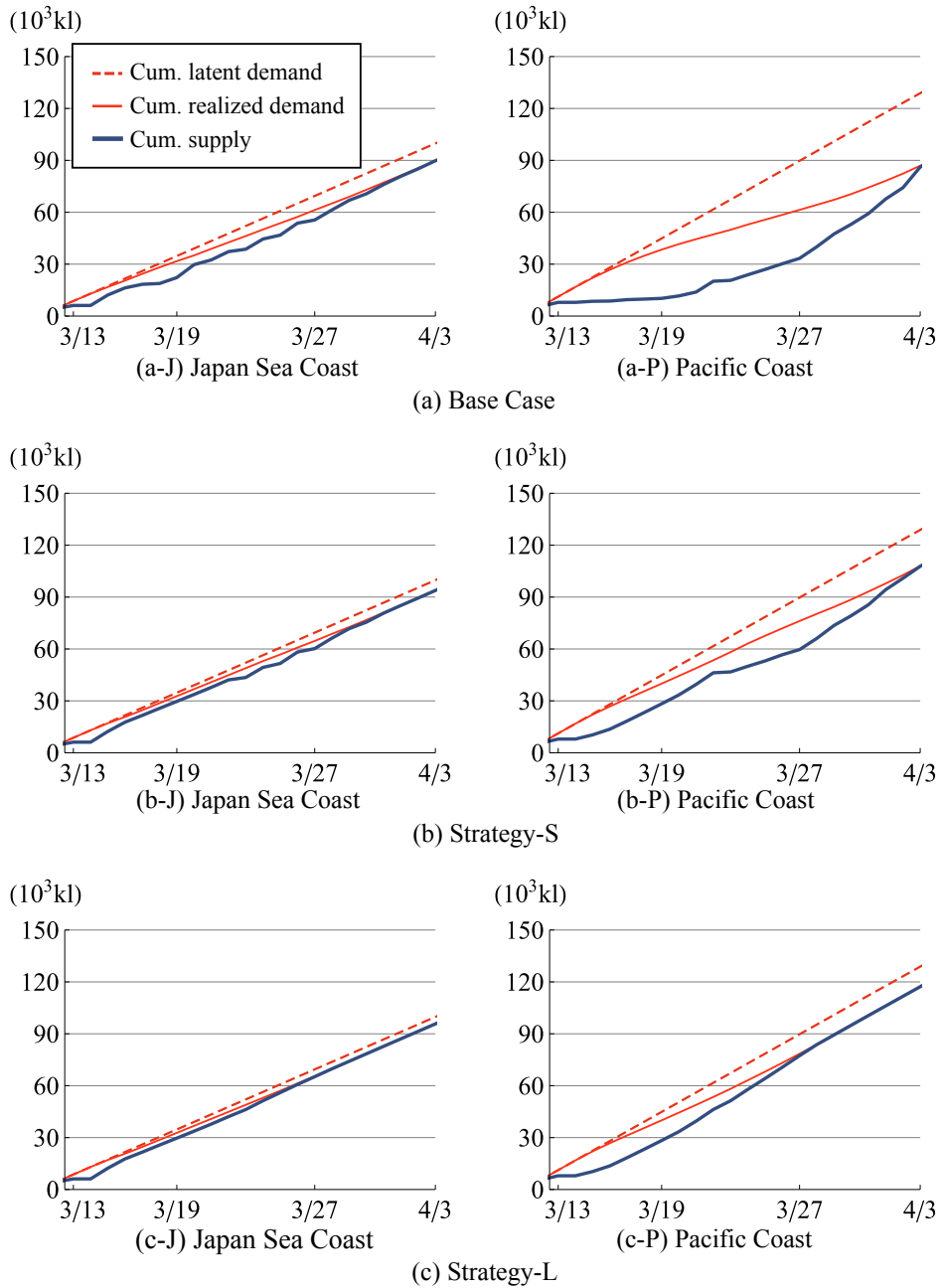


Figure 12: Cumulative latent demand, revealed demand and supply of Japan Sea Coast and Pacific Coast

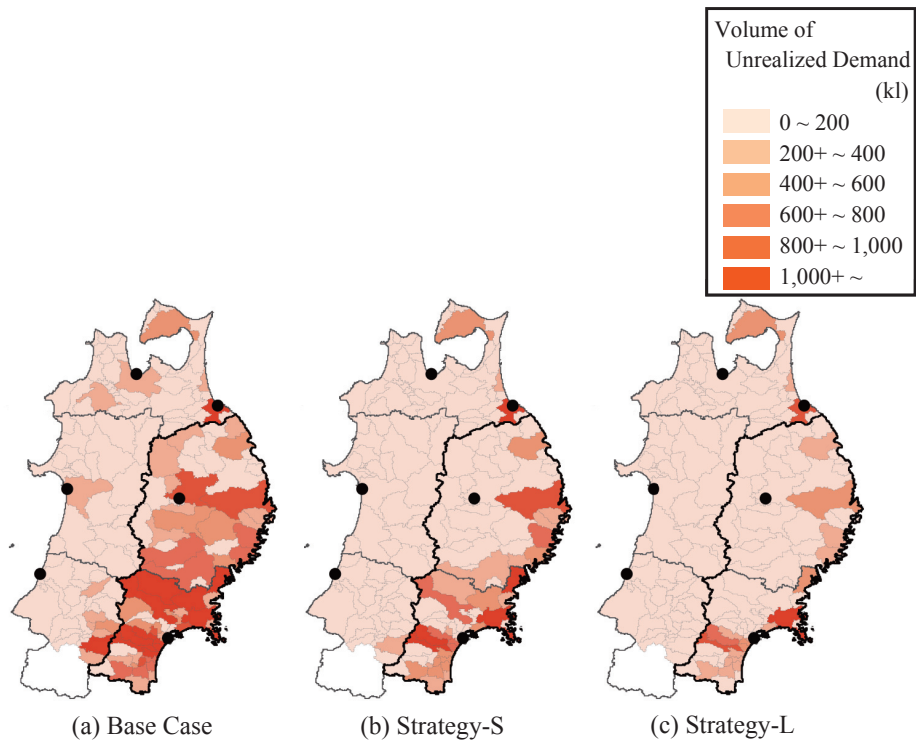


Figure 13: Spatial distribution of unrealized demand

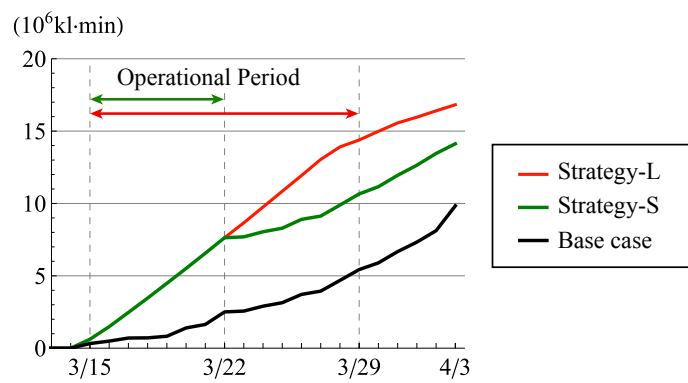


Figure 14: Cumulative shipping time

1 versatility of the method itself, but to understand the practical order of the economic loss and
 2 shipping cost based solely on the available data.

We estimate the economic loss caused by the gasoline shortages from two perspectives, namely the macro and micro perspectives. First, the macroscopic economic loss is defined as a production opportunity loss due to the disappearance of demand, and it is estimated using the unrealized demand calculated in the previous section and the gross regional product (GRP) of the Tohoku region. We assume that the aggregate production function of Tohoku region is linearly homogeneous to its gasoline consumption. In this case, the reduced economic loss from the gasoline shortage amount corresponding to the unrealized demand is calculated using the following equation:

$$\text{Macroscopic Economic Loss (JPY)} = \frac{\text{GRP of Tohoku Region (JPY/year)} \times \text{Unrealized Demand (kL)}}{\text{Gasoline Consumption of Tohoku Region (kL/year)}} \quad (4)$$

3 Because some economic activities do not require gasoline consumption, this estimated amount
 4 can be regarded as the upper bound of the actual economic loss.

Next, we define microscopic economic loss as the value of commuting and conducting business that is lost while waiting to purchase gasoline. This can be estimated using the following equation, which uses the pent-up demand calculated in the previous section and the average amount of gasoline purchased by consumers per once.

$$\begin{aligned} \text{Microscopic Economic Loss (JPY)} &= \frac{\text{Value of Time (JPY/day} \times \text{person)} \times \text{Sum. Pent-up Demand (kL} \times \text{day)}}{\text{Gasoline Purchase Per Once (kL/person)}} \quad (5) \\ &= \text{Value of Time (JPY/day} \times \text{person)} \\ &\quad \times \text{Total Number of Waiting Days (day} \times \text{person)} \end{aligned}$$

Here, the sum of pent-up demand is the area between the cumulative demand and supply curves in Figure 9, which is calculated using the following equation:

$$\sum_{t=0}^T X(t)$$

5 The total number of waiting days for purchasing gasoline is defined as dividing the sum of pent-
 6 up demand divided by the average amount of gasoline purchased per once. In this study, we

⁰ Value of time is assumed 3,573 (JPY/day \times person), derived from dividing 2010 GRP of Tohoku Region (JPY/year) by 2010 Employed Population (person) and the number of Week Days (day).

1 assume that the amount of average gasoline purchased is 50 L. Because commuting and con-
 2 ducting business by using gasoline are only some of the economic activities, the economic loss
 3 defined in Equation (5) can be considered the lower limit of the actual economic loss. Therefore,
 4 the actual economic loss probably lies between the estimated macroscopic (4) and microscopic
 5 economic losses (5).

6 Table 6.3 shows the values of the microscopic and macroscopic economic losses. In the base
 7 case and the proposed strategies, the lower bounds are approximately 80% of the upper bound,
 8 which seems to be reasonable. Under the base case, the estimated economic loss caused by the
 9 gasoline shortages is approximately 290 (lower) to 360 (upper) billion yen ¹. By comparing this
 10 and the economic losses of the proposed strategies, we can derive the economic effects of the
 11 proposed strategies: that of Strategy S is 145 to 180 billion yen; and that of Strategy L is 206 to
 256 billion yen.

Table 5: Economic loss and costs of gasoline distribution strategies

	Base Case	Strategy-S	Strategy-L
Volume of unrealized demand (kL)	53,803	26,954	15,605
Macroscopic economic loss -upper bound- (billion JPY)	-360	-180	-104
Upper economic effect of strategy (billion JPY)	-	+180	+256
Sum. pent up demand (kL × day)	507,580	254,283	147,219
Microscopic economic loss -lower bound- (billion JPY)	-290	-145	-86
Lower economic effect of strategy (billion JPY)	-	+145	+206
Total shipping time for the period of 3/12 ~ 4/3 (million kL × min)	9.84	14.12	16.82
Additional shipping cost (billion JPY)	-0.46	-0.65	-0.78
Additional cost for executing strategy (billion JPY)	-	-0.20	-0.32

12
 13 Lastly, we estimate the additional shipping costs required to execute the strategies and com-
 14 pare the economic effects gained by those strategies. In this paper, we converted the shipping
 15 time calculated in Section 6.2 into JPY by assuming that it would cost 200,000 yen to charter an

¹ This range correspond to 3.52 to 4.36 billion dollars (derived by the exchange rate of Feb. 2011, (JPY/USD) 82.498)

1 average-sized (i.e., 18 kL capacity) tanker truck in Japan for 1 day (8 hours). According to the
 2 results showed in Table 6.3, the additional cost for executing Strategies S and L are 0.20 million
 3 yen and 0.32 million yen, respectively. As shown in Table 6.3, the benefit-to-cost ratio is far
 4 larger than 1. Thus we can conclude that the distribution strategies S and L yield tremendous
 economic effects relative to the additional required cost.

Table 6: Cost-benefit analyses of each strategies

	Strategy-S	Strategy-L
Economic Effect of strategy (billion JPY)	+145 ~ +180	+206 ~ +256
Cost of Strategy (billion JPY)	-0.20	-0.32

5

6 **7. Concluding Remarks**

7 In this study, we demonstrated that the long-term regional gasoline shortages occurred after
 8 the Great East Japan Earthquake, and that consequent economic loss could have been reduced
 9 by an appropriate gasoline distribution strategy. Specifically, we first estimated the time-space
 10 distribution of gasoline shortages and demonstrated that the loss of gasoline demand after the
 11 Great East Japan Earthquake caused economic losses of approximately 300 billion yen. Second,
 12 we demonstrated that this economic loss could have been reduced considerably if the amount
 13 of gasoline shipped into the three Japan Sea coastal ports, which were not directly affected by
 14 the earthquake and tsunami, had been increased. Specifically, we showed that the economic loss
 15 could have been reduced to one-third of the original value if 2.6 times the normal amount of
 16 gasoline had been shipped into these three ports successively for a period of 2 weeks after these
 17 ports resumed accepting shipments. In addition, we estimated the cost required to execute such a
 18 gasoline distribution strategy as well as its economic effect, demonstrating that although the cost
 19 is only 300 million yen, the benefit amounts to over 200 billion yen.

20 Based on the results of this study, we can derive the following policy implications: The
 21 loss caused by prolonged gasoline shortages that hamper economic activities is enormous, and
 22 quickly resolving such a situation is critical. Therefore, when a catastrophic disaster strikes, it
 23 is necessary for the government to promptly predict whether a regional gasoline shortage will
 24 occur. Then, when a gasoline shortage is expected, the maximum amount of gasoline that can be

1 accepted to available ports should be shipped as quickly as possible over a certain period (e.g., 1
2 to 2 weeks).

3 In order to execute these shipments, the following measures are likely necessary. First, the
4 government should collect and tabulate data on the gasoline demand trend (actual sales) by mu-
5 nicipality on a regular basis in preparation for large-scale disasters. Second, once an earthquake
6 occurs, the government should assess the capacity for supplying gasoline within the affected
7 areas, compare it to the gasoline demand, and determine whether there a regional gasoline short-
8 age will exist. Third, when it is determined that a gasoline shortage will occur (i.e., the supply
9 capacity will become insufficient), the government should systematically collect and compile
10 information and formulate specific strategies to ship gasoline from other areas. Finally, the gov-
11 ernment should secure funds before a disaster occurs and organize a scheme to reimburse private
12 companies that pay the additional expenses necessary to implement the strategy.

13 In many regional cities in the world, the percentage of workers who commute by car is high
14 as with the Tohoku region that was affected by this disaster. For these regional cities, gasoline is
15 another utility similar to electricity, gas, and water required to support socio-economic activi-
16 ties. We demonstrated that it is crucial to specify pre- and post-disaster measures that achieve the
17 appropriate distribution of these goods after a disaster, for a successful *socio-economic activity*
18 *continuation plan* (SACP).

19 **References**

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